1 Title

Sex and puberty-related differences in metabolomic profiles associated with adiposity
measures in youth with obesity

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25 Abstract

Background: Specific patterns of metabolomic profiles relating to cardiometabolic disease are
 associated with increased weight in adults. In youth with obesity, metabolomic data are sparse
 and associations with adiposity measures unknown.

Objectives: Primary, to determine associations between adiposity measures and metabolomic
 profiles with increased cardiometabolic risks in youth with obesity. Secondary, to stratify
 associations by sex and puberty.

Methods: Participants were from COBRA (Childhood Overweight BioRepository of Australia; a paediatric cohort with obesity). Adiposity measures (BMI, BMI z-score, %truncal and %whole body fat, waist circumference and waist/height ratio), puberty staging and NMR metabolomic profiles from serum were assessed. Statistics included multivariate analysis (principal component analysis, PCA) and multiple linear regression models with false discovery rate (FDR) adjustment.

38 **Results:** 214 participants had metabolomic profiles analyzed, mean age 11.9y (SD+/-3.1), mean 39 BMI z-score 2.49 (SD+/-0.24), 53% females. Unsupervised PCA identified no separable clusters 40 of individuals. Positive associations included BMI z-score and phenylalanine, total body fat% 41 and lipids in medium HDL, and waist circumference and tyrosine; negative associations 42 included total body fat% and the ratio of docosahexaenoic acid/total fatty acids and histidine. 43 Stratifying by sex and puberty, patterns of associations with BMI z-score in post-pubertal 44 males included positive associations with lipid-, cholesterol- and triglyceride-content in VLDL 45 lipoproteins; total fatty acids; total triglycerides; isoleucine, leucine and glycoprotein acetyls. 46 **Conclusion:** In a paediatric cohort with obesity, increased adiposity measures, especially in 47 post-pubertal males, were associated with distinct patterns in metabolomic profiles.

- 48 **Tables: 2**
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- 51 Supplementary figures: 5
- 52 Words: 3288

53 Introduction

54 One fifth of children in industrialised countries is overweight or obese (Ng et al., 2014). Excess adiposity in childhood is associated with increased cardiovascular risk factors (Chung et al., 55 56 2018). Cardiovascular risk factors are more common in those with higher body mass index 57 (BMI) z-score (Gidding et al., 2004; Norris et al., 2011). They cluster in individuals with obesity 58 (May et al., 2012), track from childhood into adulthood (Bjerregaard et al., 2014; Chen and 59 Wang, 2008; Juhola et al., 2011) and are associated with increased risk of cardiovascular and 60 metabolic outcomes. Predictive markers for cardiometabolic disease in youth are inadequate 61 and body mass index (the most widely used parameter) has poor predictive capacity. 62 Therefore novel markers are needed to identify, and subsequently prevent, cardiometabolic 63 disease that cause a significant and increasing burden on public health and healthcare systems 64 (Olshansky et al., 2005).

Metabolomics refers to the quantitative analysis of small metabolites within a biospecimen of 65 66 interest. Nuclear magnetic resonance (NMR) spectroscopy is commonly used to generate 67 metabolomic profiles that include measures of lipids, sugars, amino and organic acids and 68 markers of chronic inflammation (Wishart, 2016). Cumulative data have confirmed that these 69 are influenced by both genetic and environmental factors (Zhang et al., 2013). Previous 70 studies in adults utilising metabolomics platforms have revealed distinct metabolic patterns 71 related to increasing body mass index, cardiometabolic risk factors (Ho et al., 2016; Holmes et 72 al., 2014; Tulipani et al., 2016; Wang et al., 2011; Welsh et al., 2018; Zhao et al., 2016) and 73 CVD events (Holmes et al., 2018). Wurtz et al. used a cardiometabolic-risk focussed 74 metabolomic platform in young adults (mean age 26 years) to show with Mendelian 75 randomisation that such metabolomic patterns are causally elicited by increasing BMI (Wurtz et al., 2014). In healthy and obese adults, NMR metabolomic analysis have also shown sex-76

dependent variation, in particular for levels of branched chain amino acids (Vignoli *et al.*, 2018;
Xie *et al.*, 2014). Limited analogous data are available in children and adolescents, particularly
in those with early-onset obesity. Pubertal development impacts substantially on body
composition (Loomba-Albrecht and Styne, 2009) and cardiometabolic risk factors (Reinehr *et al.*, 2015), but the effect on metabolomic profile is unknown.

82 In the present study of a cohort of obese children and adolescents, we aimed to investigate 83 patterns of associations between different adiposity measures and metabolites that might 84 reflect an increased risk for obesity-related, adverse cardiometabolic outcomes. In addition, 85 we hypothesized that there would be sex- and puberty-related differences. We utilised high-86 throughput, NMR-based metabolomics (Fischer et al., 2014; Kettunen et al., 2012; Stancakova 87 et al., 2012; Wurtz et al., 2012b; Wurtz et al., 2014) to test the association between adiposity 88 measures (BMI, BMI z-score, truncal fat percentage, body fat percentage, waist circumference 89 and waist to height ratio) with specific metabolite measures and the possible effect of sex and 90 puberty on metabolomic profiles.

91 Methods

92 Study design

93 The study population was derived from the Childhood Overweight BioRepository of Australia (COBRA) cohort study (total n=412). Children and adolescents were recruited from the Royal 94 95 Children's Hospital (RCH, Melbourne, Australia) Weight Management Service as previously 96 described (Sabin et al., 2010). Informed, written consent was obtained from the participant 97 or the legally authorised representative from minors (aged less than 16 years). In brief, at the 98 initial clinical appointment, data on demographics, medical history, and anthropometry 99 (including adiposity measures) were collected. A fasting venous blood sample for plasma and 100 serum was collected, immediately processed and stored at – 80° C in the Melbourne Children's 101 Bioresource Centre (MCBC). The study protocol was approved by the Royal Children's Hospital Human Research Ethics Committee, RCH, Melbourne, Australia (HREC Ref. # 28081Q, 9th of 102 103 October 2017) and is in accordance with Helsinki principles.

104

105 Anthropometry measures of study participants

106 Height was measured without shoes and to the nearest 0.5 cm, using a fixed Harpenden 107 stadiometer. Weight and percentages of total body and truncal fat mass were measured in 108 light clothes with a four-point bio-impedance device (Tanita® Japan), previously validated for 109 use in children (McCarthy et al., 2006). Body mass index (BMI) was calculated according to the formula weight in kg divided by height in m² and then converted into BMI z-scores adjusted 110 111 for age and sex using the US Centres for Disease Control (CDC) growth reference charts 112 (Kuczmarski et al., 2000). Waist circumference was measured with a non-flexible meter 113 between iliac crest and lower end of rips to the nearest 0.5cm in expiration. BMI and BMI z-114 score were considered raw mass measures, while whole body and truncal fat percentage fat

measures and waist circumference and waist to height ratio served as indicators of body composition. A specialist paediatric endocrinologist or a consultant general paediatrician assessed Tanner stage for pubertal development, where Tanner 1 was considered prepubertal, Tanner 2-3 peri-pubertal and Tanner 4-5 post-pubertal (Marshall and Tanner, 1969, 1970).

120

121 *Metabolite quantification*

Metabolomic analysis from stored serum samples was performed on the Nightingale® Nuclear Magnetic Resonance (NMR) spectroscopy platform as previously described (Kettunen *et al.*, 2012; Soininen *et al.*, 2009). A total of 73 metabolites, capturing the majority of variation within the dataset, were used in analyses, including lipid subclass concentration, composition, size and ratios and concentrations of apolipoproteins, cholesterols, fatty acids, glycerides, phospholipids, amino acids, glycolysis related products, albumin, creatinine and glycoprotein acetyls (supplementary table 1).

129

130 Statistical analysis

i) Descriptive statistics:

Participant's characteristics are described in mean and standard deviation (SD) for continuous
and number (%) for categorical variables. Metabolites and participant's characteristics were
checked for their degree of skewness, calculated by the skew function in the e1071 (David
Meyer, 2018) package for R statistics ((2018), 2018). If skewness of a specific measure was
greater or equal to 2, values were log10-transformed.

137

138 *ii) Inferential statistics*

139 Adiposity measures (BMI, total body fat percentage, truncal fat percentage, waist 140 circumference and waist/height ratio but not BMI z-scores) and metabolites were scaled to 141 SD units to facilitate the comparison of estimates across metabolite measures. Principal 142 component analysis (PCA), a common approach in multivariate data analysis, was used to 143 investigate the dataset's variability and to uncover clusters within the dataset (Worley and 144 Powers, 2013). The principle of PCA is to reduce the dataset's variability into principal 145 components (PC's) containing most (PC1), second most (PC2) and so forth of the variability. 146 For illustration, PCA plots with PC1 and PC2 further characterised for age and sex and a table 147 providing the percentage contribution of variation from the most important five principal 148 components were provided.

Multiple linear regression was applied using a change of 1 standard deviation for each adiposity measure as predictor and the metabolite measure as outcome, adjusted for age and sex. A Benjamini-Hochberg (Benjamini and Hochberg, 1995) false discovery rate of 0.1 was used to adjust for multiple testing. In addition, linear modelling was applied to sex and puberty-specific datasets to illustrate trends for metabolites. R[®] version 3.5 was used for all statistical analysis. For graphics, R[®] version 3.5 or MS Office Powerpoint[®] was used.

155 Results

Blood samples were available for 269 participants, of which 50 individuals were excluded due to age (<6 years) and/or a BMI z-score below 2.0. Additional 5 individuals were excluded due to analytical errors. A total of 214 participants with serum derived metabolomic data were included. Descriptive characteristics of participants are shown in Table 1.

160 Multivariate analysis

Principal component analysis did not reveal separable clusters, and age (figure 1a) and sex (figure 1b) were not major confounders, i.e. these characteristics did not result in separable clusters within our dataset. The top 5 principal components contained 73% of the dataset`s variability (see table in figure 1c).

165 Adiposity and metabolomic patterns

166 Adiposity measures were associated with metabolites following adjustment for age, sex and 167 false discovery rate (FDR). The associations were broadly similar across the different mass and 168 body composition measures, although the strength of specific associations with individual 169 metabolites showed some variation (see figure 2 and supplementary figures 1-5). For 170 example, a 1-SD increase in BMI z-score was positively associated with phenylalanine 171 (p<0.001) and negatively with log acetate concentrations (p<0.001). For total percentage of 172 body fat there was a positive association with total lipids in medium-sized HDL lipoproteins 173 (p<0.01) and negative associations with the ratio of docosahexaenoic fatty acids to total fatty 174 acids (%), with histidine, log lactate (all p<0.01) and creatinine (p <0.001). Percentage of 175 truncal fat was negatively associated with creatinine (p<0.01), whereas waist circumference 176 was positively associated with tyrosine (p<0.001) and negatively with log lactate (p <0.001). 177 Table 2 illustrates a complete list of associations between adiposity measures and metabolites

including adjustment for FDR. Supplementary table 2 shows characteristics from multiple
linear regression with BMI z-score as the exposure variable, adjusted for age and sex.

180

181 Impact of sex on metabolites

182 Figure 3 illustrates the changes in estimates of metabolites for every 1-SD increase in BMI z-183 score categorized for sex. In females, positive associations were found with total lipids in small 184 HDL lipoproteins (p<0.05), phenylalanine (p<0.05) and tyrosine (p<0.05). Negative 185 associations were found with the estimated degree of unsaturation (p<0.05), 22:6 186 docosahexaenoic acid (p<0.05), ratio of 22:6 docosahexaenoic acid to total fatty acids 187 (p<0.01), histidine (p<0.05) and log acetate (p<0.05). Each of these attenuated towards the 188 null following FDR correction. In males, an increase in BMI z-score was negatively associated 189 with log acetate (p<0.001) even with FDR correction.

190

191 *Impact of pubertal development on metabolites*

192 Figure 4 illustrates the association of BMI z-score with metabolites by sex and puberty. 193 Supplementary table 3 lists the associations between all investigated adiposity measures and 194 metabolites in post-pubertal individuals. In post-pubertal females, the only metabolite 195 associated with BMI z-score after multiple comparison was tyrosine (positively associated). In 196 contrast in post-pubertal males, several associations were found with BMI z-score after 197 adjustment for multiple comparisons. These included concentration of total lipids, 198 cholesterols and triglycerides in VLDL lipoproteins, the ratio of apolipoprotein B/A1 and the 199 mean diameter for VLDL and LDL particles. Associations were also seen with concentrations 200 of total fatty acids, linoleic acid, omega-6 fatty acids, and polyunsaturated, monounsaturated 201 and saturated fatty acids (all positively associated) and the estimated degree of unsaturation

202 (negatively associated). Further associations were found with triglycerides in HDL, total
203 phosphoglycerides, isoleucine and leucine, glycoprotein acetyls (all positively associated) and
204 log acetoacetate (negatively associated) (see figure 4).

206 Discussion

207 Studies in adults have revealed distinct metabolomic patterns with weight gain and 208 cardiometabolic risk and disease. Here we investigated the relationship between clinical 209 adiposity measures and an NMR-based metabolomic profile in a cohort of children and 210 adolescents with obesity, aged 6-18 years. We observed that an increase in a range of 211 adiposity measures (BMI, BMI z-score, whole body and truncal fat percentage, waist 212 circumference and waist to height ratio) was associated with changes in the concentration of 213 several metabolites and lipid subclass size. The strongest evidence for associations was 214 observed in post-pubertal males.

Increasing BMI z-score in the study cohort was positively associated with elevated 215 216 concentrations for phenylalanine and negatively related to log acetate after correction for 217 FDR. Changes in lipid content in very large HDL lipoproteins, the estimated degree of 218 unsaturation, the ratio of 22:6 docosahexaenoic acid and omega-3 fatty acids to total fatty 219 acids were all negatively associated with BMI z-score after linear regression modelling, but 220 these associations did not remain significant after adjustment for FDR. Due to growth-related 221 changes in BMI z-scores during childhood, we cannot directly compare effect sizes with 222 available data from adulthood. However, the direction of associations we observed between 223 increasing BMI z-scores and metabolites was comparable to a previous study in young adults 224 (Wurtz et al., 2014), where a similar metabolomic platform was investigated with increasing 225 body mass index measures. With a longitudinal study design over 6 years using Mendelian 226 randomisation, this study showed that increased adiposity had causal effects on multiple 227 cardiometabolic risk markers. Risk markers included elevated levels of triglyceride- and 228 cholesterol-carrying VLDL and LDL particles, lower levels of larger HDL particles, increased 229 levels of fatty acids, higher levels of branched-chain (e.g. leucine, isoleucine and valine) and

aromatic amino acids (e.g. phenylalanine, tyrosine, histidine) and elevated levels for a marker
of chronic inflammation - glycoprotein acetyls (Wurtz *et al.*, 2014). We observed an additional
increase in effect size of this metabolomic risk profile for an increase in BMI z-score in postpubertal males (see figure 2 & 4 for comparison). In contrast to previous adult studies however
we found no distinct sex-related effects as per the unsupervised PCA analysis of the
metabolome (see figure 1b).

236 Similar metabolomic profiles have previously been related to cardiovascular disease outcomes 237 including myocardial infarction (MI) and ischaemic stroke (IS) in the China Kadoorie Biobank, 238 a cohort of more than half a million Chinese adults aged 30-79 years (Holmes et al., 2018). 239 Increased levels of VLDL lipoprotein particles were positively associated with MI and IS (OR 240 per SD increase of 1.18 to 1.30). Similar, triglycerides levels in all lipoprotein subclasses 241 containing apoplipoprotein B were positively associated with MI and triglycerides in VLDL 242 lipoproteins were positively associated with IS. The mean VLDL diameter was positively 243 associated with MI (OR per SD 1.03-1.25) and IS (OR per SD 1.07-1.28) and HDL particle size 244 was inversely associated with MI (OR per SD 0.73-0.89) and IS (OR per SD 0.80-0.96). 245 Cholesterol concentrations in VLDL and IDL particles were positively associated with MI and IS 246 (OR per SD 1.15-1.39 and 1.09-1.32), whereas cholesterol in HDL2 (larger HDL particles) was 247 inversely associated with MI (OR per SD 0.72-0.87). The ratio of apolipoprotein B / 248 apolipoprotein A1 was positively associated with MI (OR per SD 1.18-1.43) and IS (OR per SD 249 (1.14-1.38) (Holmes et al., 2018).

250 Many metabolites associated with cardiovascular endpoints in the China Kadoorie Biobank 251 were likewise associated with increasing BMI z-score in this study, mainly in post-pubertal 252 males. Of these, several are critically involved in the process of atherosclerosis: i) elevated 253 levels of VLDL lipoproteins, their cholesterol- and triglyceride-content and the ratio of

254 apolipoprotein B/AI are key to initial steps of atherosclerosis, from endothelial penetration 255 and subendothelial retention of modified lipoprotein particles to the initiation of an 256 inflammatory cascade (Back et al., 2019). ii) decreased ratios of docosahexaenoic acid/total fatty acids and omega-6 fatty acids/total fatty acids have recently been related to a decreased 257 258 inhibition of the NLRP3 inflammasome, a core inflammatory pathway involved in 259 atherosclerosis (Lopategi et al., 2019). iii) decreasing levels of larger and increasing levels of 260 small HDL particles. Recent studies have shown that NMR based differentiation of HDL 261 particles revealed superior cardiovascular risk assessment as compared to the classical HDL-262 cholesterol concentration (Santos-Gallego, 2015).

263 Another previous study using an *untargeted* metabolomic approach in a paediatric cohort (Viva La Familia Study, n=803, 56% with obesity, mean age 11y), reported positive associations 264 265 between increasing weight and circulating branched chain amino acids and insulin resistance 266 (Butte et al., 2015). In adults, increased branched-chain amino acids (BCAA) and aromatic 267 amino acids (AAA) have been positively associated with insulin resistance and metabolic 268 syndrome (Wiklund et al., 2014; Wurtz et al., 2012a). In our study, we did not observe any 269 relationship between increasing adiposity measures and BCAA, but there was evidence of an 270 association between BMI and BMI z-score with phenylalanine, BMI and waist circumference 271 with tyrosine and a negative association between total body fat percentages and histidine (see 272 supplementary table 3). In females, we found negative associations for histidine and positive 273 associations for tyrosine and phenylalanine that attenuated towards the null following FDR 274 correction. In post-pubertal males, associations between increasing BMI z-score and BCAA 275 (leucine and isoleucine) were significant, adjusted for FDR. Our results for associations with 276 adiposity measures for the non-essential amino acid alanine, glutamine and glycine most likely

277 reflect endogenous turnover in a fasting condition, however, none of these associations were278 significant after adjustment for FDR.

279 Glycoprotein acetyls (represented by GlycA in this metabolomic profile) are of particular 280 interest in the context of cardiometabolic disease risk. GlycA reflect chronic inflammation, a 281 major mechanism underlying obesity-related comorbidities. In a recent study, GlycA was 282 associated with increased cardiovascular (MI, IS and intracranial haemorrhage) and all-cause 283 mortality (Akinkuolie et al., 2014; Lawler et al., 2016; Wurtz et al., 2015). In 27,491 initially 284 healthy women followed up for 17.2 years, the hazard ratio of the upper quartile of GlycA was 285 1.23 (95%CI 1.04-1.46) for an incident cardiovascular event (MI, IS, coronary revascularization, 286 and CVD death) (Akinkuolie et al., 2014). Interestingly, weight loss over 12 months after 287 bariatric surgery (Roux-en-Y gastric bypass or Sleeve gastrectomy) was associated with a 288 significant reduction in GlycA (Manmadhan et al., 2019). In our study, GlycA was positively 289 associated with increasing BMI, total and truncal body fat percentages, although not after FDR 290 correction (see table 2). In sex-specific analyses, we found some evidence of an association 291 with higher GlycA in males in association with higher BMI, BMI z-score or waist to height ratio, 292 primarily among post-pubertal adolescents.

293 The strengths of this study included the availability of comprehensively assessed clinical data 294 from a large cohort of children and adolescents with obesity. The investigated metabolomic 295 platform has been widely used in epidemiologic studies in adults with outcome data available 296 for cardiovascular disease and type 2 diabetes mellitus. Limitations include the lack of a 297 normal weight control group, which would be an interesting comparator. In addition, the 298 cross-sectional study design does not allow us to assess the direction of causality and given 299 this is a child and adolescent cohort, data on cardiovascular events and type 2 diabetes 300 mellitus would only be available with long-term follow up.

301 Our findings illustrate metabolomic evidence of increased cardiometabolic risk with increasing 302 severity of adiposity in children and adolescents with obesity, revealing the adverse effects of 303 weight gain, in particular in post-pubertal males with obesity. These data highlight the 304 importance of efforts to reduce the increasing prevalence of obesity in youth. Our findings 305 support commencing weight management prior to puberty to avoid the development of an 306 adverse cardiometabolic profile observed in post-pubertal males. Longitudinal studies are 307 warranted to investigate whether these metabolomic changes in childhood and adolescence 308 predict definite cardiovascular and metabolic outcomes and to understand mechanisms 309 underlying the sex- and puberty-related associations.

Variable		n	Mean (SD)	Range (min-max)	%
Age (years)		214	11.9 (3.1)	6.0 - 18.1	
Sex (female))	113			53
Pubertal sta	ge				
	Pre-pubertal Peri-pubertal Post-pubertal	83 58 73			39 27 34
Weight (kg)		214	85.9 (30.2)	30.7 - 157.9	
Height (m)		214	1.55 (0.16)	1.10 - 1.94	
BMI (kg/m²)		214	34.5 (7.1)	22.0 - 58.5	
BMI z-score		214	2.49 (0.24)	2.00 - 3.10	
Body fat %		182	44.3 (7.8)	24.6 - 64.5	
Truncal fat 9	6	175	38.2 (8.7)	17.3 - 70.8	
Waist Circur	mference (m)	169	1.06 (0.19)	0.63 - 1.54	
Waist to hei	ght ratio	169	0.69 (0.08)	0.50 - 0.93	

312 Table 2

		BMI	BMI z -score	Total body fat %	Truncal fat %	WC	WtH ratio
Metabolites & direction of association							
Total lipids in very large HDL (mmol/L)	neg	ns.	p < 0.05	ns.	ns.	ns.	ns.
Total lipids in medium HDL (mmol/L)	pos	ns.	ns.	p < 0.01	p < 0.01	ns.	ns.
Total lipids in small HDL (mmol/L)	pos	p < 0.05	ns.	p < 0.05	p < 0.05	ns.	ns.
Estimated degree of unsaturation	neg	p < 0.05	p < 0.01	p < 0.05	ns.	ns.	ns.
22:6, docosahexaenoic acid(mmol/L)	neg	ns.	ns.	ns.	p < 0.05	ns.	ns.
Ratio of docosahexaenoic acid to total fatty acids (%)	neg	p < 0.05	P < 0.05	p < 0.01	p < 0.01	ns.	ns.
Ratio of omega3 fatty acids to total fatty acids (%)	neg	ns.	p < 0.05	ns.	ns.	ns.	ns.
Glutamine (mmol/l)	neg	ns.	ns.	p < 0.05	p < 0.05	ns.	ns.
Histidine (mmol/l)	neg	ns.	p < 0.05	p < 0.01	p < 0.01	ns.	p < 0.05
Phenylalanine (mmol/l)	pos	p < 0.001	p < 0.01	ns.	p < 0.05	p < 0.01	ns.
Tyrosine (mmol/l)	pos	p < 0.001	p < 0.05	p < 0.05	ns.	p < 0.001	p < 0.05
Log acetate (mmol/l)	neg	p < 0.001	p < 0.001	p < 0.01	p < 0.05	p < 0.001	p < 0.05
Log acetoacetate (mmol/l)	neg	ns.	ns.	p < 0.05	ns.	ns.	ns.
Albumin (mmol/l)	neg	ns.	ns.	ns.	ns.	p < 0.05	p < 0.05
Creatinine (umol/l)	neg	ns.	ns.	p < 0.001	p < 0.01	p < 0.05	p < 0.05
Glycoprotein acetyls (mmol/L)	pos	p < 0.05	ns.	p < 0.05	p < 0.05	ns.	ns.

314 Supplementary

315 Supplementary table 1

Metabolite name	Metabolite subgroup
Log Total lipids in chylomicrons and extr. large VLDL (mmol/L)	Lipoprotein subclass
Log Total lipids in very large VLDL (mmol/L)	Lipoprotein subclass
Log Total lipids in large VLDL (mmol/L)	Lipoprotein subclass
Total lipids in medium VLDL (mmol/L)	Lipoprotein subclass
Total lipids in small VLDL (mmol/L)	Lipoprotein subclass
Total lipids in very small VLDL (mmol/L)	Lipoprotein subclass
Total lipids in IDL (mmol/L)	Lipoprotein subclass
Total lipids in large LDL (mmol/L)	Lipoprotein subclass
Total lipids in medium LDL (mmol/L)	Lipoprotein subclass
Total lipids in small LDL (mmol/L)	Lipoprotein subclass
Total lipids in very large HDL (mmol/L)	Lipoprotein subclass
Total lipids in large HDL (mmol/L)	Lipoprotein subclass
Total lipids in medium HDL (mmol/L)	Lipoprotein subclass
Total lipids in small HDL (mmol/L)	Lipoprotein subclass
Mean diameter for VLDL particles (nm)	Lipoprotein particle size
Mean diameter for LDL particles (nm)	Lipoprotein particle size
Mean diameter for HDL particles (nm)	Lipoprotein particle size
Apolipoprotein AI (g/L)	Apolipoproteins
Apolipoprotein B (g/L)	Apolipoproteins
Ratio of apolipoprotein B to apolipoprotein Al	Apolipoproteins
Serum total cholesterol (mmol/L)	Cholesterol
Total cholesterol in VLDL (mmol/L)	Cholesterol
Remnant cholesterol (nonHDL, nonLDL cholesterol) (mmol/L)	Cholesterol
Total cholesterol in LDL (mmol/L)	Cholesterol
Total cholesterol in HDL (mmol/L)	Cholesterol
Total cholesterol in HDL2 (mmol/L)	Cholesterol
Total cholesterol in HDL3 (mmol/L)	Cholesterol
Esterified cholesterol (mmol/L)	Cholesterol
Free cholesterol (mmol/L)	Cholesterol
Total fatty acids (mmol/L)	Fatty acids
Estimated degree of unsaturation	Fatty acids
22:6, docosahexaenoic acid (mmol/L)	Fatty acids
18:2, linoleic acid (mmol/L)	Fatty acids
Omega3 fatty acids (mmol/L)	Fatty acids
Omega6 fatty acids (mmol/L)	Fatty acids
Polyunsaturated fatty acids (mmol/L)	Fatty acids
Monounsaturated fatty acids 16:1, 18:1 (mmol/L)	Fatty acids
Saturated fatty acids (mmol/L)	Fatty acids

Ratio of 22:6 docosahexaenoic acid to total fatty acids (%)	Fatty acid ratios
Ratio of 18:2 linoleic acid to total fatty acids (%)	Fatty acid ratios
Ratio of omega3 fatty acids to total fatty acids (%)	Fatty acid ratios
Ratio of omega6 fatty acids to total fatty acids (%)	Fatty acid ratios
Ratio of polyunsaturated fatty acids to total fatty acids (%)	Fatty acid ratios
Ratio of monounsaturated fatty acids to total fatty acids (%)	Fatty acid ratios
Ratio of saturated fatty acids to total fatty acids (%)	Fatty acid ratios
Log Serum total triglycerides (mmol/L)	Glycerides and phospholipids
Log Triglycerides in VLDL (mmol/L)	Glycerides and phospholipids
Triglycerides in LDL (mmol/L)	Glycerides and phospholipids
Triglycerides in HDL (mmol/L)	Glycerides and phospholipids
Total phosphoglycerides (mmol/L)	Glycerides and phospholipids
Ratio of triglycerides to phosphoglycerides	Glycerides and phospholipids
Phosphatidylcholine and other cholines (mmol/L)	Glycerides and phospholipids
Sphingomyelins (mmol/L)	Glycerides and phospholipids
Total cholines (mmol/L)	Glycerides and phospholipids
Pyruvate (mmol/L)	Glycolysis related
Citrate (mmol/L)	Glycolysis related
Glucose (mmol/L)	Glycolysis related
Lactate (mmol/L)	Glycolysis related
Log Acetate (mmol/L)	Ketone bodies
Log Acetoacetate (mmol/L)	Ketone bodies
Log 3hydroxybutyrate (mmol/L)	Ketone bodies
Alanine (mmol/L)	Amino acids
Glutamine (mmol/L)	Amino acids
Glycine (mmol/L)	Amino acids
Histidine (mmol/L)	Amino acids
Isoleucine (mmol/L)	Amino acids
Leucine (mmol/L)	Amino acids
Valine (mmol/L)	Amino acids
Phenylalanine (mmol/L)	Amino acids
Tyrosine (mmol/L)	Amino acids
Albumin (mmol/l)	Liver function
Creatinine (umol/L)	Renal function
Glycoprotein acetyls, mainly a1acid glycoprotein (mmol/L)	Inflammation

317 Supplementary table 2

Lipoprotein subclass lipids	Estimate	95% CI	p-Value	ВН
Log Total lipids in chylomicrons and extr. large VLDL (mmol/L)	0.011	-0.021 to 0.044	0.493	ns.
Log Total lipids in very large VLDL (mmol/L)	0.015	-0.016 to 0.047	0.348	ns.
Log Total lipids in large VLDL (mmol/L)	0.017	-0.015 to 0.049	0.293	ns.
Total lipids in medium VLDL (mmol/L)	0.011	-0.02 to 0.043	0.488	ns.
Total lipids in small VLDL (mmol/L)	0.015	-0.016 to 0.047	0.339	ns.
Total lipids in very small VLDL (mmol/L)	0.013	-0.018 to 0.045	0.411	ns.
Total lipids in IDL (mmol/L)	0.001	-0.03 to 0.033	0.914	ns.
Total lipids in large LDL (mmol/L)	-0.001	-0.032 to 0.03	0.945	ns.
Total lipids in medium LDL (mmol/L)	-0.003	-0.034 to 0.028	0.845	ns.
Total lipids in small LDL (mmol/L)	-0.005	-0.037 to 0.025	0.726	ns.
Total lipids in very large HDL (mmol/L)	-0.033	-0.064 to -0.002	0.035	ns.
Total lipids in large HDL (mmol/L)	-0.023	-0.054 to 0.007	0.137	ns.
Total lipids in medium HDL (mmol/L)	0.012	-0.019 to 0.044	0.428	ns.
Total lipids in small HDL (mmol/L)	0.026	-0.005 to 0.059	0.102	ns.
Lipoprotein particle size				
Mean diameter for VLDL particles (nm)	0.014	-0.017 to 0.046	0.372	ns.
Mean diameter for LDL particles (nm)	0.013	-0.018 to 0.045	0.415	ns.
Mean diameter for HDL particles (nm)	-0.03	-0.061 to 0.001	0.058	ns.
Apolipoproteins				
Apolipoprotein AI (g/L)	-0.016	-0.047 to 0.015	0.315	ns.
Apolipoprotein B (g/L)	0.005	-0.026 to 0.037	0.718	ns.
Ratio of apolipoprotein B to apolipoprotein Al	0.015	-0.016 to 0.047	0.346	ns.
Cholesterol				
Serum total cholesterol (mmol/L)	0.002	-0.029 to 0.033	0.896	ns.
Total cholesterol in VLDL (mmol/L)	0.012	-0.019 to 0.045	0.426	ns.
Remnant cholesterol (nonHDL nonLDL cholesterol) (mmol/L)	0.008	-0.023 to 0.04	0.611	ns.
Total cholesterol in LDL (mmol/L)	-0.006	-0.037 to 0.025	0.700	ns.
Total cholesterol in HDL (mmol/L)	-0.02	-0.051 to 0.011	0.217	ns.
Total cholesterol in HDL2 (mmol/L)	-0.019	-0.051 to 0.012	0.231	ns.
Total cholesterol in HDL3 (mmol/L)	-0.018	-0.05 to 0.012	0.243	ns.
Esterified cholesterol (mmol/L)	-0.011	-0.043 to 0.019	0.464	ns.
Free cholesterol (mmol/L)	-0.01	-0.042 to 0.021	0.513	ns.
Fatty acids				
Total fatty acids (mmol/L)	0.013	-0.018 to 0.045	0.406	ns.
Estimated degree of unsaturation	-0.045	-0.076 to -0.013	0.005	ns.
22:6, docosahexaenoic acid(mmol/L)	-0.024	-0.056 to 0.007	0.127	ns.
18:2 linoleic acid (mmol/L)	0.005	-0.026 to 0.037	0.722	ns.
Omega3 fatty acids (mmol/L)	-0.009	-0.04 to 0.022	0.571	ns.
Omega6 fatty acids (mmol/L)	0.003	-0.028 to 0.034	0.850	ns.
Polyunsaturated fatty acids (mmol/L)	0.001	-0.03 to 0.032	0.943	ns.
Monounsaturated fatty acids 16:1 18:1 (mmol/L)	0.016	-0.014 to 0.048	0.296	ns.
Saturated fatty acids (mmol/L)	0.017	-0.014 to 0.049	0.278	ns.
Fatty acid ratios				

Ratio of 22:6 docosahexaenoic acid to total fatty acids (%)	-0.034	-0.066 to -0.003	0.031	ns.
Ratio of 18:2 linoleic acid to total fatty acids (%)	-0.014	-0.046 to 0.017	0.371	ns.
Ratio of omega3 fatty acids to total fatty acids (%)	-0.032	-0.063 to 0	0.047	ns.
Ratio of omega6 fatty acids to total fatty acids (%)	-0.026	-0.058 to 0.005	0.107	ns.
Ratio of polyunsaturated fatty acids to total fatty acids (%)	-0.03	-0.062 to 0.001	0.060	ns.
Ratio of monounsaturated fatty acids to total fatty acids (%)	0.02	-0.011 to 0.053	0.203	ns.
Ratio of saturated fatty acids to total fatty acids (%)	0.025	-0.006 to 0.056	0.120	ns.
Amino acids				
Alanine (mmol/L)	0.021	-0.01 to 0.053	0.178	ns.
Glutamine (mmol/L)	-0.011	-0.043 to 0.02	0.466	ns.
Glycine (mmol/L)	-0.013	-0.045 to 0.018	0.401	ns.
Histidine (mmol/L)	-0.035	-0.067 to -0.004	0.027	ns.
lsoleucine (mmol/L)	0.025	-0.007 to 0.058	0.129	ns.
Leucine (mmol/L)	0.017	-0.015 to 0.049	0.305	ns.
√aline (mmol/L)	0.014	-0.017 to 0.046	0.385	ns.
Phenylalanine (mmol/L)	0.052	0.019 to 0.085	0.002	significant
Tyrosine (mmol/L)	0.038	0.006 to 0.069	0.018	ns.
Glycerides and phopholipids				
Serum total triglycerides (mmol/L)	0.016	-0.015 to 0.048	0.308	ns.
Triglycerides in VLDL (mmol/L)	0.014	-0.017 to 0.046	0.380	ns.
Triglycerides in LDL (mmol/L)	0.025	-0.005 to 0.057	0.111	ns.
Triglycerides in HDL (mmol/L)	0.019	-0.012 to 0.051	0.232	ns.
Total phosphoglycerides (mmol/L)	0.001	-0.03 to 0.033	0.930	ns.
Ratio of triglycerides to phosphoglycerides	0.02	-0.01 to 0.052	0.195	ns.
Phosphatidylcholine and other cholines (mmol/L)	0.003	-0.028 to 0.034	0.843	ns.
Sphingomyelins (mmol/L)	0.003	-0.028 to 0.034	0.837	ns.
Total cholines (mmol/L)	0.002	-0.029 to 0.034	0.896	ns.
Glycolysis related				
Pyruvate (mmol/L)	0.017	-0.013 to 0.048	0.273	ns.
Citrate (mmol/L)	0.018	-0.012 to 0.05	0.240	ns.
Glucose (mmol/L)	-0.012	-0.044 to 0.018	0.423	ns.
Ketones				
Log Lactate (mmol/L)	-0.005	-0.036 to 0.026	0.753	ns.
Log Acetate (mmol/L)	-0.061	-0.091 to -0.03	<0.001	significant
Log Acetoacetate (mmol/L)	-0.03	-0.061 to 0.001	0.059	ns.
Log 3hydroxybutyrate (mmol/L)	0.014	-0.025 to 0.054	0.473	ns.
Liver function				
Albumin (mmol/l)	-0.014	-0.045 to 0.017	0.383	ns.
Kidney function				
Creatinine (umol/L)	-0.014	-0.055 to 0.027	0.506	ns.
Inflammation				
Glycoprotein acetyls mainly a1acid glycoprotein (mmol/L)	0.028	-0.004 to 0.06	0.086	ns.

319 Supplementary table 3

		BMI		BMI z -score		Total body fat %		Truncal fat %		WC		WtH ratio	
		ę	ď	ę	ď	ę	ď	ę	ď	ę	ď	ç	ď
Metabolites & direction of association													
Log Total lipids in chylomicrons and extr. large VLDL (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Log Total lipids in very large VLDL (mmol/L)	pos.	ns	<0.01	ns	<0.01	ns	ns	ns	ns	ns	<0.05	ns	<0.01
Log Total lipids in large VLDL (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.01
Total lipids in medium VLDL (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Total lipids in small VLDL (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	Ns	ns	<0.05
Total lipids in very small VLDL (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	Ns	ns	ns
Total lipids in small HDL (mmol/L)	neg.	ns	ns	ns	ns	ns	ns	ns	ns	ns	<0.01	ns	<0.01
Mean diameter for VLDL particles (nm)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Mean diameter for LDL particles (nm)	pos.	ns	<0.05	ns	<0.05	ns	<0.05	ns	<0.05	ns	<0.05	ns	<0.05
Total cholesterol in VLDL (mmol/L)	pos.	ns	<0.01	ns	<0.01	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Remnant cholesterol (nonHDL, nonLDL cholesterol) (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Serum total triglycerides (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Triglycerides in VLDL (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Triglycerides in HDL (mmol/L)	pos.	ns	<0.01	ns	<0.01	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Ratio of triglycerides to phosphoglycerides	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.01
Apolipoprotein B (g/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	ns	ns	<0.05
Ratio of apolipoprotein B to apolipoprotein Al	pos.	ns	<0.05	ns	<0.01	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Total fatty acids (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Estimated degree of unsaturation	neg.	ns	<0.05	ns	<0.05	ns	<0.05	ns	ns	ns	<0.05	ns	<0.05
18:2, linoleic acid (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	ns	ns	<0.05
Omega3 fatty acids (mmol/L)	pos.	ns	ns	ns	ns	ns	ns	ns	ns	ns	ns	ns	<0.05
Omega6 fatty acids (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	ns	ns	<0.05
Polyunsaturated fatty acids (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	ns	ns	<0.05
Monounsaturated fatty acids 16:1, 18:1 (mmol/L)	pos.	ns	<0.01	ns	<0.01	ns	ns	ns	ns	ns	<0.05	ns	<0.01
Saturated fatty acids (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	ns	ns	<0.05
Ratio of 22:6 docosahexaenoic acid to total fatty acids (%)	neg.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	ns	ns	ns
Ratio of 18:2 linoleic acid to total fatty acids (%)	neg.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	ns	ns	<0.05

		1		1		i		i		i		1	
Ratio of omega6 fatty acids to total fatty acids (%)	neg.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Ratio of polyunsaturated fatty acids to total fatty acids (%)	neg.	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05	ns	<0.05
Ratio of monounsaturated fatty acids to total fatty acids (%)	pos.	ns	<0.01	ns	<0.01	ns	ns	ns	ns	ns	<0.05	ns	<0.01
Pyruvate (mmol/L)	pos.	ns	ns	ns	ns	ns	ns	ns	<0.05	ns	ns	ns	ns
Alanine (mmol/L)	pos.	ns	ns	ns	ns	ns	<0.05	ns	ns	ns	ns	ns	ns
Isoleucine (mmol/L)	pos.	ns	ns	ns	<0.05	ns	<0.05	ns	ns	ns	ns	ns	<0.05
Leucine (mmol/L)	pos.	ns	<0.05	ns	<0.05	ns	<0.05	ns	ns	ns	<0.05	ns	<0.05
Valine (mmol/L)	pos.	ns	ns	ns	ns	ns	ns	ns	ns	ns	<0.05	ns	ns
Phenylalanine (mmol/L)	pos.	<0.05	ns	ns	ns	ns	ns	ns	ns	ns	ns	ns	ns
Tyrosine (mmol/L)	pos.	<0.01	ns	<0.01	ns	ns	ns	ns	ns	ns	ns	ns	ns
Log Acetoacetate (mmol/L)	neg.	ns	<0.01	ns	<0.01	ns	<0.05	ns	ns	ns	ns	ns	ns
Albumin (mmol/l)	neg.	ns	ns	ns	ns	ns	ns	ns	ns	ns	ns	<0.05	ns
Glycoprotein acetyls, mainly a1acid glycoprotein (mmol/L)	pos.	ns	<0.05	ns	<0.01	ns	<0.05	ns	ns	ns	<0.05	ns	<0.01
													552

333 Table and Figure legends

334	Table 1:	Characteristi	ics of the study cohort
335	Legend 1:	Pubertal stag	ge: Pre-pubertal: Tanner stage 1; Peri-pubertal: Tanner stage 2 &
336		3; Post-pube	rtal: Tanner stage 4 & 5. BMI: body mass index; BMI z-score: body
337		mass index z	r-score using Centre of Disease Control (CDC) data. n: number of
338		participants	
339			
340	Table 2:	Patterns in n	netabolomics profile by clinical adiposity measures
341	Legend 2:	Results from	n multiple regression modelling with each adiposity measure as
342		explanatory	variable and the metabolite as outcome, adjusted for age and sex.
343		In bold are ti	he ones adjusted for false discovery rate (FDR).
344			
345	Supplement	ary table 1:	Metabolites and subgroups
346	Supplementary legend 1:		SI units are given in brackets. Metabolites with a log-prefix were
347			log10-transformed due to skewed distribution.
348			
349	Supplement	ary table 2:	Model characteristics for metabolites per 1-SD increase in BMI
350			z-score
351	Supplement	ary legend 2:	Estimates reflect change in standard deviation per metabolite
352			by 1-SD increase in BIVI z-score. 95% CI: 95% Confidence
353			Interval. BH: Significance test according to Benjamin-Hochberg
354			for false alscovery rate
300	Cupplomont	an tabla 2.	Detterns in metabolomics profile in past pubertal individuals
250	Supplement	ary table 5.	sategorized by clinical adinesity measure and cox, adjusted for
358			
250	Sunnlement	ary legend 3.	age Results from multiple regression modelling with each adinosity
360	Supplement	ary legend 5.	measure as evolution variable and the metabolite as
361			outcome in post-nubertal individuals adjusted for age. In hold
362			are the ones withstanding adjustment for multiple comparison
363			ns=not significant
364			

365 366 367 368 369	Figure 1: Legend 1:	Principal component analysis (PCA) plots PCA plot for principal component 1 (PC1) and principal component 2 (PC2), graded for age (1a) and sex (1b). Section 1c lists percentage contribution of the top 5 principal components.
370 371 372 373 374 375	Figure 2: Legend 2:	Changes in metabolites by 1 SD increase in BMI z-score Changes in mean and 95% confidence interval per 1-SD increase in BMI z- score. * indicates association after multiple regression modelling (p <0.05). Estimates and 95% CI's in bold illustrate significance after adjustment for false discovery rate (FDR, according to Benjamini-Hochberg).
376 377 378 379 380 381	Figure 3: Legend 3:	Changes in metabolites by 1 SD increase in BMI z-score categorized by sex Changes in mean and 95% confidence interval per 1-SD increase in BMI z- score categorized by sex. * indicates association after multiple regression modelling (p <0.05). ** illustrate significance after adjustment for false discovery rate (FDR, according to Benjamini-Hochberg).
382 383	Figure 4:	Changes in metabolites by 1 SD increase in BMI z-score, categorized by sex and pubertal stage.
384 385 386 387 388 389 390	Legend 4:	Changes in mean and 95% confidence interval per 1-SD increase in BMI z- score categorized by sex and pubertal stage. Pre-pubertal (red) = Tanner stage 1. Peri-pubertal (blue) = Tanner stage 2-3. Post-pubertal (yellow) = Tanner stage 4-5). Females in the left panel, males in the right panel. In post-pubertal subgroup (yellow), * indicates association after multiple regression modelling, including adjustment for false discovery rate (FDR, according to Benjamini- Hochberg).

391	Supplements
392	
393	Supplementary figure 1:
394	Changes in metabolites by 1 SD increase in body mass index, adjusted for age and sex
395	
396	Legend supplementary figure 1:
397	Changes in mean and 95% confidence interval per 1-SD increase in BMI.* indicate significant
398	associations after multiple regression modelling (p-value <0.05). Estimates and 95% CI's in
399	bold illustrate significance after adjustment for false discovery rate (FDR, according to
400	Benjamini-Hochberg).
401	
402	Supplementary figure 2:
403	Changes in metabolites by 1 SD increase in total body fat %, adjusted for age and sex
404	
405	Legend supplementary figure 2:
406	Changes in mean and 95% confidence interval per 1-SD increase in total body fat %.
407	*indicate significant associations after multiple regression modelling (p-value <0.05).
408	Estimates and 95% Cl's in bold illustrate significance after adjustment for false discovery rate
409	(FDR, according to Benjamini-Hochberg).
410	
411	Supplementary figure 3:
412	Changes in metabolites by 1 SD increase in truncal fat %, adjusted for age and sex
413	Logand supplementary figure 2:
414	Changes in mean and 05% confidence interval per 1 SD increases in truncal fat %
415	* indicate significant associations after multiple regression modelling (p. value <0.05)
410	Estimates and 95% Cl's in hold illustrate significance after adjustment for false discovery rate
417 418	(EDR according to Benjamini-Hochberg)
410	
420	Supplementary figure 4:
421	Changes in metabolites by 1 SD increase in waist circumference, adjusted for age and sex
422	
423	Legend supplementary figure 4:
424	Changes in mean and 95% confidence interval per 1-SD increase in waist circumference.
425	* indicate significant associations after multiple regression modelling (p-value <0.05).
426	Estimates and 95% CI's in bold illustrate significance after adjustment for false discovery rate
427	(FDR, according to Benjamini-Hochberg).
428	
429	Supplementary figure 5:
430	Changes in metabolites by 1 SD increase in waist to height ratio, adjusted for age and sex
431	
432	Legend supplementary figure 5:
433	Changes in mean and 95% confidence interval per 1-SD increase in waist to height ratio.
434	* indicate significant associations after multiple regression modelling (p-value <0.05).
435	Estimates and 95% CI's in bold illustrate significance after adjustment for false discovery rate
436	(FDR, according to Benjamini-Hochberg).
437	

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448 All authors had final approval of the submitted and published versions.

449

450 *Compliance with Ethical Standards*

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- 465

466 Ethical standards

- 467 All procedures performed in studies involving human participants were in accordance with the
- 468 ethical standards of the institutional and/or national research committee and with the 1964
- 469 Helsinki declaration and its later amendments or comparable ethical standards.
- 470

471 *Participant's informed consent*

472 Informed consent was obtained from all individual participants included in the study.

473 References

474 (2018), R.C.T. (2018) R: A language and environment for statistical computing. R Foundation
475 for Statistical Computing, Vienna, Austria.

476

479

477 Akinkuolie, A.O., Buring, J.E., Ridker, P.M. and Mora, S. (2014) A novel protein glycan
478 biomarker and future cardiovascular disease events. *J Am Heart Assoc* 3, e001221.

- Back, M., Yurdagul, A., Jr., Tabas, I., Oorni, K. and Kovanen, P.T. (2019) Inflammation and its
 resolution in atherosclerosis: mediators and therapeutic opportunities. *Nat Rev Cardiol.*
- 482
 483 Benjamini, Y. and Hochberg, Y. (1995) Controlling the False Discovery Rate a Practical and
 484 Powerful Approach to Multiple Testing. *Journal of the Royal Statistical Society Series B-*485 *Methodological* 57, 289-300.
- 486
- Bjerregaard, L.G., Rasmussen, K.M., Michaelsen, K.F., Skytthe, A., Mortensen, E.L., Baker, J.L.
 and Sorensen, T.I.A. (2014) Effects of body size and change in body size from infancy through
 childhood on body mass index in adulthood. *International Journal of Obesity* 38, 1305-1311.
- Butte, N.F., Liu, Y., Zakeri, I.F., Mohney, R.P., Mehta, N., Voruganti, V.S., Goring, H., Cole, S.A.
 and Comuzzie, A.G. (2015) Global metabolomic profiling targeting childhood obesity in the
 Hispanic population. *Am J Clin Nutr* **102**, 256-67.
- 494
- Chen, X. and Wang, Y. (2008) Tracking of blood pressure from childhood to adulthood: a
 systematic review and meta-regression analysis. *Circulation* **117**, 3171-80.
- Chung, S.T., Onuzuruike, A.U. and Magge, S.N. (2018) Cardiometabolic risk in obese children. *Annals of the New York Academy of Sciences* 1411, 166-183.
- David Meyer, E.D., Kurt Hornik, Andreas Weingessel and Friedrich Leisch. (2018) e1071: Misc
 Functions of the Department of Statistics, Probability Theory Group (Formerly: E1071), TU
 Wien. R package version 1.7-0.
- 504

- Fischer, K., Kettunen, J., Wurtz, P., Haller, T., Havulinna, A.S., Kangas, A.J., Soininen, P., Esko,
 T., Tammesoo, M.L., Magi, R., Smit, S., Palotie, A., Ripatti, S., Salomaa, V., Ala-Korpela, M.,
 Perola, M. and Metspalu, A. (2014) Biomarker profiling by nuclear magnetic resonance
 spectroscopy for the prediction of all-cause mortality: an observational study of 17,345
 persons. *PLoS Med* 11, e1001606.
- 510
- Gidding, S.S., Nehgme, R., Heise, C., Muscar, C., Linton, A. and Hassink, S. (2004) Severe obesity
 associated with cardiovascular deconditioning, high prevalence of cardiovascular risk factors,
 diabetes mellitus/hyperinsulinemia, and respiratory compromise. *J Pediatr* 144, 766-9.
- 514
- Ho, J.E., Larson, M.G., Ghorbani, A., Cheng, S., Chen, M.H., Keyes, M., Rhee, E.P., Clish, C.B.,
 Vasan, R.S., Gerszten, R.E. and Wang, T.J. (2016) Metabolomic Profiles of Body Mass Index in
 the Framingham Heart Study Reveal Distinct Cardiometabolic Phenotypes. *PLoS One* 11,
 e0148361.
- 519

Holmes, M.V., Lange, L.A., Palmer, T., Lanktree, M.B., North, K.E., Almoguera, B., Buxbaum, S.,
Chandrupatla, H.R., Elbers, C.C., Guo, Y., Hoogeveen, R.C., Li, J., Li, Y.R., Swerdlow, D.I.,
Cushman, M., Price, T.S., Curtis, S.P., Fornage, M., Hakonarson, H., Patel, S.R., Redline, S.,
Siscovick, D.S., Tsai, M.Y., Wilson, J.G., van der Schouw, Y.T., FitzGerald, G.A., Hingorani, A.D.,
Casas, J.P., de Bakker, P.I., Rich, S.S., Schadt, E.E., Asselbergs, F.W., Reiner, A.P. and Keating,
B.J. (2014) Causal effects of body mass index on cardiometabolic traits and events: a
Mendelian randomization analysis. *Am J Hum Genet* 94, 198-208.

527

Holmes, M.V., Millwood, I.Y., Kartsonaki, C., Hill, M.R., Bennett, D.A., Boxall, R., Guo, Y., Xu, X.,
Bian, Z., Hu, R., Walters, R.G., Chen, J., Ala-Korpela, M., Parish, S., Clarke, R.J., Peto, R., Collins,
R., Li, L., Chen, Z. and China Kadoorie Biobank Collaborative, G. (2018) Lipids, Lipoproteins,
and Metabolites and Risk of Myocardial Infarction and Stroke. *J Am Coll Cardiol* **71**, 620-632.

- Juhola, J., Magnussen, C.G., Viikari, J.S., Kahonen, M., Hutri-Kahonen, N., Jula, A., Lehtimaki,
 T., Akerblom, H.K., Pietikainen, M., Laitinen, T., Jokinen, E., Taittonen, L., Raitakari, O.T. and
 Juonala, M. (2011) Tracking of serum lipid levels, blood pressure, and body mass index from
 childhood to adulthood: the Cardiovascular Risk in Young Finns Study. *J Pediatr* 159, 584-90.
- Kettunen, J., Tukiainen, T., Sarin, A.P., Ortega-Alonso, A., Tikkanen, E., Lyytikainen, L.P.,
 Kangas, A.J., Soininen, P., Wurtz, P., Silander, K., Dick, D.M., Rose, R.J., Savolainen, M.J., Viikari,
 J., Kahonen, M., Lehtimaki, T., Pietilainen, K.H., Inouye, M., McCarthy, M.I., Jula, A., Eriksson,
 J., Raitakari, O.T., Salomaa, V., Kaprio, J., Jarvelin, M.R., Peltonen, L., Perola, M., Freimer, N.B.,
 Ala-Korpela, M., Palotie, A. and Ripatti, S. (2012) Genome-wide association study identifies
 multiple loci influencing human serum metabolite levels. *Nat Genet* 44, 269-76.
- 544
- Kuczmarski, R.J., Ogden, C.L., Grummer-Strawn, L.M., Flegal, K.M., Guo, S.S., Wei, R., Mei, Z.,
 Curtin, L.R., Roche, A.F. and Johnson, C.L. (2000) CDC growth charts: United States. *Adv Data*,
 1-27.
- 548

Lawler, P.R., Akinkuolie, A.O., Chandler, P.D., Moorthy, M.V., Vandenburgh, M.J., Schaumberg,
D.A., Lee, I.M., Glynn, R.J., Ridker, P.M., Buring, J.E. and Mora, S. (2016) Circulating N-Linked
Glycoprotein Acetyls and Longitudinal Mortality Risk. *Circ Res* **118**, 1106-15.

552

555

- Loomba-Albrecht, L.A. and Styne, D.M. (2009) Effect of puberty on body composition. *Curr Opin Endocrinol Diabetes Obes* 16, 10-5.
- Lopategi, A., Flores-Costa, R., Rius, B., Lopez-Vicario, C., Alcaraz-Quiles, J., Titos, E. and Claria,
 J. (2019) Frontline Science: Specialized proresolving lipid mediators inhibit the priming and
 activation of the macrophage NLRP3 inflammasome. *J Leukoc Biol* **105**, 25-36.
- 559
- Manmadhan, A., Lin, B.X., Zhong, J., Parikh, M., Berger, J.S., Fisher, E.A. and Heffron, S.P.
 (2019) Elevated GlycA in severe obesity is normalized by bariatric surgery. *Diabetes Obesity & Metabolism* 21, 178-182.
- 563

^{Marshall, W.A. and Tanner, J.M. (1969) Variations in pattern of pubertal changes in girls.} *Arch Dis Child* 44, 291-303.

- 567 Marshall, W.A. and Tanner, J.M. (1970) Variations in the pattern of pubertal changes in boys. 568 *Arch Dis Child* **45**, 13-23.
- 569
- 570 May, A.L., Kuklina, E.V. and Yoon, P.W. (2012) Prevalence of cardiovascular disease risk factors 571 among US adolescents, 1999-2008. *Pediatrics* **129**, 1035-41.
- 572
- 573 McCarthy, H.D., Cole, T.J., Fry, T., Jebb, S.A. and Prentice, A.M. (2006) Body fat reference 574 curves for children. *Int J Obes (Lond)* **30**, 598-602.
- 575

576 Ng, M., Fleming, T., Robinson, M., Thomson, B., Graetz, N., Margono, C., Mullany, E.C., 577 Biryukov, S., Abbafati, C., Abera, S.F., Abraham, J.P., Abu-Rmeileh, N.M., Achoki, T., 578 AlBuhairan, F.S., Alemu, Z.A., Alfonso, R., Ali, M.K., Ali, R., Guzman, N.A., Ammar, W., Anwari, 579 P., Banerjee, A., Barquera, S., Basu, S., Bennett, D.A., Bhutta, Z., Blore, J., Cabral, N., Nonato, 580 I.C., Chang, J.C., Chowdhury, R., Courville, K.J., Criqui, M.H., Cundiff, D.K., Dabhadkar, K.C., 581 Dandona, L., Davis, A., Dayama, A., Dharmaratne, S.D., Ding, E.L., Durrani, A.M., Esteghamati, 582 A., Farzadfar, F., Fay, D.F., Feigin, V.L., Flaxman, A., Forouzanfar, M.H., Goto, A., Green, M.A., 583 Gupta, R., Hafezi-Nejad, N., Hankey, G.J., Harewood, H.C., Havmoeller, R., Hay, S., Hernandez, 584 L., Husseini, A., Idrisov, B.T., Ikeda, N., Islami, F., Jahangir, E., Jassal, S.K., Jee, S.H., Jeffreys, M., 585 Jonas, J.B., Kabagambe, E.K., Khalifa, S.E., Kengne, A.P., Khader, Y.S., Khang, Y.H., Kim, D., 586 Kimokoti, R.W., Kinge, J.M., Kokubo, Y., Kosen, S., Kwan, G., Lai, T., Leinsalu, M., Li, Y., Liang, 587 X., Liu, S., Logroscino, G., Lotufo, P.A., Lu, Y., Ma, J., Mainoo, N.K., Mensah, G.A., Merriman, 588 T.R., Mokdad, A.H., Moschandreas, J., Naghavi, M., Naheed, A., Nand, D., Narayan, K.M., 589 Nelson, E.L., Neuhouser, M.L., Nisar, M.I., Ohkubo, T., Oti, S.O., Pedroza, A. et al. (2014) Global, 590 regional, and national prevalence of overweight and obesity in children and adults during 591 1980-2013: a systematic analysis for the Global Burden of Disease Study 2013. Lancet 384, 592 766-81.

- 593
- Norris, A.L., Steinberger, J., Steffen, L.M., Metzig, A.M., Schwarzenberg, S.J. and Kelly, A.S.
 (2011) Circulating oxidized LDL and inflammation in extreme pediatric obesity. *Obesity (Silver Spring)* 19, 1415-9.
- 597

601

- Olshansky, S.J., Passaro, D.J., Hershow, R.C., Layden, J., Carnes, B.A., Brody, J., Hayflick, L.,
 Butler, R.N., Allison, D.B. and Ludwig, D.S. (2005) A potential decline in life expectancy in the
 United States in the 21st century. *N Engl J Med* **352**, 1138-45.
- Reinehr, T., Wolters, B., Knop, C., Lass, N. and Holl, R.W. (2015) Strong effect of pubertal status
 on metabolic health in obese children: a longitudinal study. *J Clin Endocrinol Metab* 100, 3018.
- 605
- Sabin, M.A., Clemens, S.L., Saffery, R., McCallum, Z., Campbell, M.W., Kiess, W., Crimmins,
 N.A., Woo, J.G., Leong, G.M., Werther, G.A., Ukoumunne, O.C. and Wake, M.A. (2010) New
 directions in childhood obesity research: how a comprehensive biorepository will allow better
 prediction of outcomes. *BMC Med Res Methodol* 10, 100.
- 610

⁶¹¹ Santos-Gallego, C.G. (2015) HDL: Quality or quantity? *Atherosclerosis* **243**, 121-3.

<sup>Soininen, P., Kangas, A.J., Wurtz, P., Tukiainen, T., Tynkkynen, T., Laatikainen, R., Jarvelin, M.R.,
Kahonen, M., Lehtimaki, T., Viikari, J., Raitakari, O.T., Savolainen, M.J. and Ala-Korpela, M.</sup>

615 (2009) High-throughput serum NMR metabonomics for cost-effective holistic studies on 616 systemic metabolism. *Analyst* **134**, 1781-5.

617

Stancakova, A., Civelek, M., Saleem, N.K., Soininen, P., Kangas, A.J., Cederberg, H., Paananen,
J., Pihlajamaki, J., Bonnycastle, L.L., Morken, M.A., Boehnke, M., Pajukanta, P., Lusis, A.J.,
Collins, F.S., Kuusisto, J., Ala-Korpela, M. and Laakso, M. (2012) Hyperglycemia and a common
variant of GCKR are associated with the levels of eight amino acids in 9,369 Finnish men. *Diabetes* 61, 1895-902.

623

Tulipani, S., Palau-Rodriguez, M., Minarro Alonso, A., Cardona, F., Marco-Ramell, A., Zonja, B.,
Lopez de Alda, M., Munoz-Garach, A., Sanchez-Pla, A., Tinahones, F.J. and Andres-Lacueva, C.
(2016) Biomarkers of Morbid Obesity and Prediabetes by Metabolomic Profiling of Human
Discordant Phenotypes. *Clin Chim Acta* 463, 53-61.

628

Vignoli, A., Tenori, L., Luchinat, C. and Saccenti, E. (2018) Age and Sex Effects on Plasma
Metabolite Association Networks in Healthy Subjects. *J Proteome Res* 17, 97-107.

631

632 Wang, T.J., Larson, M.G., Vasan, R.S., Cheng, S., Rhee, E.P., McCabe, E., Lewis, G.D., Fox, C.S.,

Jacques, P.F., Fernandez, C., O'Donnell, C.J., Carr, S.A., Mootha, V.K., Florez, J.C., Souza, A.,
Melander, O., Clish, C.B. and Gerszten, R.E. (2011) Metabolite profiles and the risk of
developing diabetes. *Nat Med* 17, 448-53.

636

Welsh, P., Rankin, N., Li, Q., Mark, P.B., Wurtz, P., Ala-Korpela, M., Marre, M., Poulter, N.,
Hamet, P., Chalmers, J., Woodward, M. and Sattar, N. (2018) Circulating amino acids and the
risk of macrovascular, microvascular and mortality outcomes in individuals with type 2
diabetes: results from the ADVANCE trial. *Diabetologia* 61, 1581-1591.

641

Wiklund, P.K., Pekkala, S., Autio, R., Munukka, E., Xu, L., Saltevo, J., Cheng, S., Kujala, U.M.,
Alen, M. and Cheng, S. (2014) Serum metabolic profiles in overweight and obese women with
and without metabolic syndrome. *Diabetol Metab Syndr* 6, 40.

645

648

646 Wishart, D.S. (2016) Emerging applications of metabolomics in drug discovery and precision
647 medicine. *Nat Rev Drug Discov* 15, 473-84.

649 Worley, B. and Powers, R. (2013) Multivariate Analysis in Metabolomics. *Curr Metabolomics*650 **1**, 92-107.

651

Wurtz, P., Havulinna, A.S., Soininen, P., Tynkkynen, T., Prieto-Merino, D., Tillin, T., Ghorbani,
A., Artati, A., Wang, Q., Tiainen, M., Kangas, A.J., Kettunen, J., Kaikkonen, J., Mikkila, V., Jula,
A., Kahonen, M., Lehtimaki, T., Lawlor, D.A., Gaunt, T.R., Hughes, A.D., Sattar, N., Illig, T.,
Adamski, J., Wang, T.J., Perola, M., Ripatti, S., Vasan, R.S., Raitakari, O.T., Gerszten, R.E., Casas,
J.P., Chaturvedi, N., Ala-Korpela, M. and Salomaa, V. (2015) Metabolite profiling and
cardiovascular event risk: a prospective study of 3 population-based cohorts. *Circulation* 131,
774-85.

659

Wurtz, P., Makinen, V.P., Soininen, P., Kangas, A.J., Tukiainen, T., Kettunen, J., Savolainen,
M.J., Tammelin, T., Viikari, J.S., Ronnemaa, T., Kahonen, M., Lehtimaki, T., Ripatti, S., Raitakari,

662 O.T., Jarvelin, M.R. and Ala-Korpela, M. (2012a) Metabolic signatures of insulin resistance in
663 7,098 young adults. *Diabetes* 61, 1372-80.

664

Wurtz, P., Raiko, J.R., Magnussen, C.G., Soininen, P., Kangas, A.J., Tynkkynen, T., Thomson, R.,
Laatikainen, R., Savolainen, M.J., Laurikka, J., Kuukasjarvi, P., Tarkka, M., Karhunen, P.J., Jula,
A., Viikari, J.S., Kahonen, M., Lehtimaki, T., Juonala, M., Ala-Korpela, M. and Raitakari, O.T.
(2012b) High-throughput quantification of circulating metabolites improves prediction of
subclinical atherosclerosis. *Eur Heart J* 33, 2307-16.

670

Wurtz, P., Wang, Q., Kangas, A.J., Richmond, R.C., Skarp, J., Tiainen, M., Tynkkynen, T.,
Soininen, P., Havulinna, A.S., Kaakinen, M., Viikari, J.S., Savolainen, M.J., Kahonen, M.,
Lehtimaki, T., Mannisto, S., Blankenberg, S., Zeller, T., Laitinen, J., Pouta, A., Mantyselka, P.,
Vanhala, M., Elliott, P., Pietilainen, K.H., Ripatti, S., Salomaa, V., Raitakari, O.T., Jarvelin, M.R.,
Smith, G.D. and Ala-Korpela, M. (2014) Metabolic signatures of adiposity in young adults:
Mendelian randomization analysis and effects of weight change. *PLoS Med* 11, e1001765.

677

Kie, G., Ma, X., Zhao, A., Wang, C., Zhang, Y., Nieman, D., Nicholson, J.K., Jia, W., Bao, Y. and
Jia, W. (2014) The metabolite profiles of the obese population are gender-dependent. *J Proteome Res* 13, 4062-73.

681

582 Zhang, A., Sun, H., Xu, H., Qiu, S. and Wang, X. (2013) Cell metabolomics. *OMICS* 17, 495-501.
583

Zhao, X., Han, Q., Liu, Y., Sun, C., Gang, X. and Wang, G. (2016) The Relationship between
Branched-Chain Amino Acid Related Metabolomic Signature and Insulin Resistance: A
Systematic Review. *J Diabetes Res* 2016, 2794591.

687

Metabolic associations with Body Mass Index



SD-difference in metabolite concentration (95% CI) per 1 SD = 7kg/m2 increase in body mass index

Metabolic associations with Total body fat percentage



Metabolic associations with Truncal fat percentage



SD-difference in metabolite concentration (95% CI) per 1 SD = 9% increase in truncal fat

Metabolic associations with Waist circumference



Metabolite

SD-difference in metabolite concentration (95% CI) per 1 SD = 18.6cm increase in waist circumference

Metabolic associations with Waist to height ratio



SD-difference in metabolite concentration (95% CI) per 1 SD = 0.08 increase in waist to height ratio