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Coronary artery disease risk and lipidomic profiles are similar in familial and population-ascertained hyperlipidemias

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25 Abstract

Aims: To characterize and compare coronary artery disease (CAD) risk and detailed lipidomic profiles
of individuals with familial and population-ascertained hyperlipidemias.

28 Methods and Results: We determined incident CAD risk for 760 members of 66 hyperlipidemic 29 families (≥ 2 first degree relatives with the same hyperlipidemia) and 19,644 Finnish FINRISK 30 population study participants. We also quantified 151 lipid species in plasma or serum samples from 31 550 members of 73 hyperlipidemic pedigrees and 897 FINRISK participants using a mass spectrometric 32 shotgun lipidomics platform. Hyperlipidemias (LDL-C or triacylglycerides over 90th population 33 percentile) were associated with increased CAD risk (high LDL-C: HR 1.74, 95% CI 1.48–2.04; high 34 triacylglycerides: HR 1.38, 95% CI 1.09–1.74) and the risk estimates were very similar between the 35 family and population samples. High LDL-C was associated with altered levels of 105 lipid species in families (*p*-value range $0.033-7.3*10^{-20}$ at 5% false discovery rate) and 51 species in the population 36 samples (*p*-value range $0.017-6.8*10^{-21}$). Hypertriglyceridemia was associated with altered levels of 37 117 lipid species in families (*p*-value range $0.035-1.8*10^{-49}$) and 119 species in the population sample 38 (*p*-value range $0.038-2.3*10^{-56}$). The lipidomics profiles of hyperlipidemias were highly similar in 39 40 families and population samples.

41 Conclusion: We identified distinct lipidomic profiles associated with high LDL-C and triacylglyceride 42 levels. CAD risk, lipidomic profiles and genetic profiles are highly similar between familial and 43 population-ascertained hyperlipidemias, providing evidence of similar and overlapping underlying 44 mechanisms. Our results do not support different screening and treatment for such hyperlipidemias.

45 Keywords: coronary artery disease; hyperlipidemia; low-density lipoprotein cholesterol; triglycerides,
46 lipids; family study

47 Introduction

High levels of low-density lipoprotein cholesterol (LDL-C) and triacylglycerides (TGs) have been
identified as causal risk factors for atherosclerotic cardiovascular disease (ASCVD).^{1, 2} These
hyperlipidemias may arise through lifestyle factors, but they are also highly heritable.³⁻⁶ More than half
of patients with premature coronary artery disease (CAD) may be affected by familial dyslipidemias, a
majority of which are characterized by elevations in LDL-C and/or TGs.⁷

Whether familial hyperlipidemias should be diagnosed and managed differently from hyperlipidemias observed in randomly ascertained individuals in the general population is uncertain. Carriers of rare high-impact variants predisposing to familial hypercholesterolemia (FH) may have a higher risk of developing coronary artery disease than non-carriers with similar lipid levels.⁸ This is potentially related to lifelong exposure to high LDL-C levels and suggests that these individuals may benefit from earlier or more aggressive LDL-C-lowering therapy.

59 Rare variants, however, explain only a small fraction of familial hyperlipidemias with either elevated LDL-C or TG levels. Instead, there is growing evidence that familial hyperlipidemias are highly 60 polygenic in origin.⁸⁻¹³ It is of high clinical importance whether non-monogenic familial hyperlipidemias 61 62 represent distinct disease entities and lead to different ASCVD susceptibility compared with populationascertained hyperlipidemias.¹⁴ A recent study provided suggestive evidence to the contrary, finding 63 greater preclinical atherosclerosis in monogenic FH than in polygenic hypercholesterolemia.¹⁵ However, 64 65 it is unknown how these results translate to clinical outcomes between familial and population-66 ascertained hyperlipidemias.

67 How the heterogenic genetic background of familial hyperlipidemias manifests in detailed 68 circulating lipid profiles, and reflects underlying pathophysiology, is also unknown. Recent 69 technological advancements have allowed replicable and simultaneous quantification of hundreds of 70 lipid species through lipidomic profiling.^{16, 17} We tested whether precise phenotypic differences in 71 lipidomic profiles, which might underlie differing ASCVD susceptibility, exist between familial and population-ascertained hyperlipidemias after excluding individuals with monogenic FH. We looked beyond the traditional clinical measures of LDL-C and TG concentrations at the numerous fatty acid ester species of TGs and cholesterol species which are the major constituents of LDL and TG-rich lipoprotein particles. We used a direct infusion platform that combines absolute quantification with high throughput, overcoming problems that have hampered many previous studies.¹⁸

Lipid species including sphingolipids, glycerophospholipids, glycerolipids and cholesteryl esters may predict ASCVD incidence or event risk over traditional risk factors, and the levels of many individual lipid species have been linked to distinct genetic loci.¹⁹⁻²² Major differences in the metabolic pathways underlying different types of hyperlipidemias would thus be expected to be reflected in different lipidomic profiles. As an example, individuals with low HDL-C levels have previously been shown to have low phosphatidylethanolamine-plasmalogen levels in HDL particles, a marker of HDL anti-oxidative capacity.²³

In the present study, we first estimated the CAD risk associated with familial and populationascertained hyperlipidemias. Secondly, we characterized the lipidomic profiles associated with elevated plasma levels of LDL-C and TGs. Finally, we compared the lipidomic profiles of familial and population-ascertained hyperlipidemias to assess their potential differences.

88 Materials and Methods

89 Subjects and clinical ascertainment

The Finnish hyperlipidemia families included in this cohort study (74 families, n = 1,445 individuals with at least LDL-C and TG measures) were identified as part of The European Multicenter Study on Familial Dyslipidemias in Patients with Premature Coronary Heart Disease (EUFAM). Designation of "familial high LDL-C" or "familial high TGs" was made if at least two first-degree relatives of each other had LDL-C or TG levels, respectively, that were > 90th age- and sex-specific Finnish 1997 population percentiles (Supplemental Table IV). Classic familial hypercholesterolemia (FH) was excluded based on genotyping and an in-house functional low-density lipoprotein receptor test.

97 Samples from the Finnish National FINRISK study were used as a Finnish population-based 98 comparison group. 19,644 individuals from the FINRISK 1992-2002 cohorts and 755 individuals from 99 EUFAM families passed exclusion criteria and could be linked with the national hospital discharge and 100 causes-of-death registries. Clinical incident CAD event endpoints were defined as either myocardial 101 infarction or coronary revascularization (coronary angioplasty or coronary artery bypass grafting). Mean 102 (range) follow-up time from baseline to CAD endpoint, death, or end of registry follow-up was 16.1 103 (0.1–20.1) years in EUFAM and 12.6 (0.02–19.0) years in FINRISK. More detailed information is given 104 in the Supplementary material online.

105 Lipidomics measurements

Lipidomic profiling and analysis of circulating lipid species was performed for 550 EUFAM family members with available plasma samples and for 897 individuals from the FINRISK 2012 cohort. Mass spectrometry-based lipid analysis was performed at Lipotype GmbH (Dresden, Germany) as described.¹⁶ Plasma and serum lipids were extracted with methyl tert-butyl ether/methanol (7:2, V:V) as in Matyash et al.²⁴ Samples were analyzed by direct infusion in a QExactive mass spectrometer (Thermo Scientific) equipped with a TriVersa NanoMate ion source (Advion Biosciences). Samples were analyzed in both positive and negative ion modes in a single acquisition.

113 Data were analyzed with in-house developed lipid identification software based on 114 LipidXplorer.^{25, 26} Reproducibility was assessed by the inclusion of reference plasma samples. Median 115 coefficient of variation was <10% across all batches. A total of 151 species were detected in \ge 80% of 116 both EUFAM and FINRISK samples and were included in the subsequent analyses. Right-skewed 117 lipidomics measures were natural logarithm transformed prior to normalization by standard deviation. 118 More detailed information is given in the Supplementary material online.

119 Statistical analyses

To assess the risk of incident coronary artery disease associated with the hyperlipidemias, we used Cox proportional hazards models using age as the time scale, stratified by sex, and clustered by family to estimate hazard ratios (HR) for incident CAD events, excluding individuals with prevalent CAD. 123 We used linear mixed models to estimate the association between lipidomic parameters and predictors of interest (hyperlipidemia status, continuous lipid measurement, or genotype) as 124 implemented in MMM (version 1.01).²⁷ Age, age², and sex were used as additional fixed effect 125 126 covariates. To account for relatedness among individuals, an empirical genetic relationship matrix was 127 included as the covariance structure of a random effect. Statistical significance was evaluated using the 128 Benjamini-Hochberg method at the 5% level to account for multiple comparisons. R (version 3.4.3) was used for data transformations and other analyses.²⁸ Detailed information is given in the Supplementary 129 130 material online.

131 Methods

132 Clinical characteristics and CAD risk of individuals with high levels of LDL-C or TGs

We first assessed the risk of developing CAD associated with high levels of LDL-C or TGs in 133 134 individuals from the Finnish FINRISK population survey and in hyperlipidemic pedigrees ascertained 135 as part of the European Study of Familial Hyperlipidemias (EUFAM) (Table 1; Supplemental Table I; 136 Supplemental Figure I.A.). Individuals with high LDL-C had an increased risk of being diagnosed with 137 CAD in the FINRISK population surveys (n = 19,644 individuals) compared to other individuals (HR 138 1.74; 95% CI 1.48–2.05). The members of hyperlipidemic families with high LDL-C had a similar 139 though nonsignificant HR compared to their relatives without high LDL-C in 47 "high LDL-C" families 140 (n = 633 individuals) (HR 1.71; 95% CI 0.94–3.10). The HRs did not differ between the cohorts 141 (p=0.60). We also observed an increased CAD risk in individuals with high TGs in the population (HR 142 1.38; 95% CI 1.08–1.75), and a similar though nonsignificant HR in 35 "high TG" families (n = 375143 individuals) (HR 1.35; 95% CI 0.52–3.51). The HRs did not differ between the cohorts (p=0.91). Meta-144 analyses of HRs closely approximated estimates derived in the population cohort.

145 *Position of Table 1*

146

We then characterized the detailed lipidomic profiles of 550 individuals from 73 hyperlipidemic

147 families and 897 individuals from the FINRISK population study (Methods; Supplemental Table II; 148 Supplemental Figure I.B.). These included 105 individuals (23 %) out of 463 family members in 53 "high LDL-C" families who had LDL-C levels >90th percentile (mean \pm SE 5.2 \pm 0.8 mmol/l), and 64 149 individuals (22 %) out of 287 family members in 39 "high TG" families who had TGs >90th percentile 150 151 $(3.6 \pm 2.0 \text{ mmol/l})$. Using similar cutoffs in the population, 56 individuals (6 %) and 65 individuals (7 152 %) out of 897 individuals were affected by high LDL-C levels $(5.3 \pm 1.1 \text{ mmol/l})$ and high TGs $(3.5 \pm 1.1 \text{ mmol/l})$ 153 1.6 mmol/l) respectively. Simultaneously high LDL-C and TG levels were observed in 31 individuals 154 in the family samples and 9 individuals in the population samples.

155 High LDL-C and lipidomic profiles

156 To characterize the lipidomic profiles associated with elevated values of LDL-C, we compared 157 individuals with high LDL-C levels vs. those without. In the hyperlipidemic families, individuals with 158 high LDL-C had significantly elevated levels of 99 lipid species spread out across most of the studied 159 lipid classes. Reduced levels were observed for three lysophospatidylcholine (LPC), two 160 lysophosphatidylethanolamine (LPE) and one phosphatidylcholine-ether (PCO) species (Figure 1.A.; 161 Supplemental Table III). Similar trends were seen in the population when comparing individuals with 162 high LDL-C vs. those without. We observed significantly elevated levels of 51 lipid species (Figure 163 1.B.; Supplemental Table III). The effect estimates correlated strongly across all lipid species between 164 the hyperlipidemic families and the population cohorts (Pearson's r = 0.80; Figure 3). Further, we 165 observed no statistically significant cohort-dyslipidemia interactions at the 5% false discovery rate.

166 *Position of Figure 1*

We also studied the association of high LDL-C levels with the degree of saturation of fatty acids in each lipid class. In the hyperlipidemic families, high LDL-C levels were associated with increased saturation of LPCs and ceramides, as well as reduced saturation of LPEs, PCs, phosphatidylcholineethers (PCOs), and phosphatidylinositols (PIs) (*p*-value range = 0.019–0.0014) (Supplemental Figure II). In the population samples, the trends were similar, although there was an association for increased LPC saturation only ($p=7.2*10^{-4}$). There were no cohort-hyperlipidemia interactions in any of the lipid species at the 5% false discovery rate. Overall, the lipidomic profiles associated with high LDL-C levelsappeared similar in the hyperlipidemic families and the general population.

175 High TGs and lipidomic profiles

176 In the hyperlipidemic families, individuals with high TGs had elevated levels of 107 lipid species 177 covering all studied lipid classes with the exception of LPEs. In addition, we observed reduced levels 178 of seven PCO, two LPC, and one PI species (Figure 2.A.; Supplemental Table III). Similar profiles were 179 seen in the population when comparing individuals with high TGs vs. those without. We observed 180 elevated levels of 108 species and reduced levels of ten PCO and one LPC species (Figure 2.B.; 181 Supplemental Table III). The effect estimates correlated very highly across all species between families 182 and population samples (Pearson's r = 0.96; Figure 3). Further, we observed no cohort-dyslipidemia 183 interactions for any of the lipid species at the 5% false discovery rate.

184 *Position of Figure 2*

185 *Position of Figure 3*

Next, we studied the association of high TG levels with the degree of saturation of fatty acids in each lipid class. In both the hyperlipidemic families and the population, having high TGs was significantly associated with increased saturation of TGs, DGs, LPCs, and CEs (*p*-value range = $0.0012-5.9*10^{-11}$) (Supplemental Figure III). There were no statistically significant cohort-hyperlipidemia interactions at the 5% false discovery rate. Overall, we observed great similarity in the lipidomic profiles associated with high TGs in the hyperlipidemic families and in the general population.

192 Independent associations of LDL-C and TG values with the lipid species

Since we observed modest combined hyperlipidemia in both cohorts, we estimated the independent associations of LDL-C and TGs with each lipid species in co-adjusted models (Figure 4; Supplemental Table III). In these analyses, many of the observed associations with LDL-C were greatly diluted in magnitude. LDL-C levels remained most strongly associated with CE, SM, ceramide, PC and PCO

197 species in both cohorts. A total of 83 species in the hyperlipidemic families and 91 species in the 198 population were independently associated with LDL-C at the 5% false discovery rate. In contrast, TGs 199 remained strongly associated with a wide range of lipid species, including all individual TG species, 200 DGs, PCs, PEs, PIs, ceramides and a subset of CEs in both cohorts. A total of 125 species in the 191 hyperlipidemic families and 124 species in the population were independently associated with TGs at 202 the 5% false discovery rate. Overall, only 13 species were uniquely associated with LDL-C in either 203 cohort, whereas 42 species were uniquely associated with TGs (Supplemental Figure IV).

204 *Position of Figure 4*

205 **Discussion**

206 Recent lipidomic approaches have identified several hundreds of different lipid species in the human 207 circulation, some of which could be better prognostic biomarkers for atherosclerotic cardiovascular 208 disease than the traditional clinical chemistry measurements. To the best of our knowledge, the present 209 study is the most comprehensive lipidomic profiling of common hyperlipidemias to date. We used a 210 mass spectrometric lipidomics platform to assess the lipidomic profiles in individuals with high LDL-C 211 and/or TG levels. We found that individuals affected by high levels of LDL-C or TGs had CAD HRs 212 between 1.34–1.74 in the family and population cohorts and exhibited distinct lipidomic profiles with 213 clear variation between lipid classes. In total, out of 151 lipidomic species, 108 were significantly 214 associated with high LDL-C and 131 with high TG levels in at least one cohort. Of these, 96 species 215 were common with both high LDL-C and TGs. In addition, we observed highly similar lipidomic 216 profiles between the familial and population-ascertained hyperlipidemias.

These findings allow us to draw several conclusions. First, the CAD risks are highly similar regardless of whether hyperlipidemic individuals were identified from families with a high prevalence of hyperlipidemia or from the general population. This result contrasts with earlier results reporting much higher CAD risks in relatives of familial combined hyperlipidemia probands compared to spouses.²⁹ Our study, however, compares the estimates between family members to individuals with 222 closely similar lipid levels from the population to isolate the effect of familiality. We also study the risk 223 associated with elevated LDL-C and TGs separately. Our estimates are also lower than typically reported 224 for monogenic FH, which may be associated with lifelong exposure to very high LDL-C levels and 225 increased CAD risk compared with other individuals with similarly extreme hyperlipidemias.⁸ In the 226 present study, we excluded probands with monogenic FH based on a functional LDL receptor test. 227 Excepting monogenic FH, familial hyperlipidemias with high LDL-C and/or TG levels have been reported to be highly polygenic.^{9, 10, 13, 30} The pleiotropic effects of diverse genes, in contrast with the 228 229 single affected pathway in monogenic FH, may partly explain why we did not observe increased CAD 230 risk due to familiality in our study.

231 Second, to more deeply characterize potential differences between familial and population-232 ascertained hyperlipidemias, we performed precise phenotyping of circulating lipid species known to be associated with ASCVD risk.²⁰⁻²² We first characterized the lipid profiles associated with high LDL-233 234 C and TG levels. Many of the associations were not specific to LDL-C but rather due to combined 235 dyslipidemia. LDL particles are generated in circulation as downstream metabolic products from the 236 TG-enriched lipoproteins (liver-derived VLDL particles and their post-lipolytic remnants) by the action of two lipases, lipoprotein lipase and hepatic lipase.^{31, 32} Thus, a proportion of the core lipids—especially 237 238 cholesterol esters-and the particle surface phospholipids are retained within the generated LDL 239 particles. The actions of the cholesteryl ester transfer protein and phospholipid transfer protein further modulate the constituents of TG-rich and LDL particles.³³ Percentual lipid compositions have been 240 241 reported for different lipoprotein classes, but they do not directly reflect variation in plasma LDL-C or 242 TG concentrations. For example, PCs have been estimated to constitute 12 % of all lipids in LDL particles vs. 3–9% in TG-rich lipoproteins.³⁴ However, in our study, PCs were overall more strongly 243 244 associated with TG levels than with LDL-C levels. Nevertheless, LDL-C remained positively associated 245 with a range of species including CEs, ceramides, SMs, PCs and PCOs. Among the strongly increased 246 species, CE(14:0), CE(16:0), CE(16:1), CE(18:0), SM(34:1;2), SM(34:2;2), SM(42:2;2), Cer(42:1;2), and Cer(42:2;2) have previously been associated with the risk of future ASCVD incidence or events.^{20,} 247 21 248

249 Elevated TG levels were associated with either increases or decreases in the levels of lipid 250 species across most classes. Importantly, most of these associations appeared to be independent of LDL-251 C levels. Among the lipid species that were strongly correlated with high TGs even after correction for 252 LDL-C levels were several species which have previously been associated with risk of ASCVD 253 incidence or events.²⁰⁻²² These include the species CE(14:0), CE(16:0), CE(16:1), CE(18:0), TG(50:1), 254 TG(50:2), TG(50:3), TG(52:2), TG(52:3), TG(52:5), TG(56:5), TG(56:6), Cer(42:1:2) and Cer(42:2:2). 255 Further, high TGs were associated with increased saturation of fatty acids in the TG, DG, CE and LPC 256 classes. Such differences in the relative concentrations of circulating fatty acids can be partly related to dietary intake, but are also influenced by endogenous metabolism.³⁵ 257

Overall, a larger proportion of the lipid species previously linked with increased ASCVD risk were strongly associated with elevated TGs rather than with elevated LDL-C. This interesting observation suggests that the levels of these lipid biomarkers are more closely linked with circulating TG-rich lipoprotein metabolism than with low-density lipoproteins.

262 Third, several lipid species, such as specific cholesteryl esters, ceramides, and 263 phosphatidylcholine-ethers, remained independently associated with both elevated LDL-C and TGs. 264 Among these species, the ceramides Cer(42:1;2) (presumably Cer(d18:1/24:0)) and Cer(42:2;2) 265 (presumably Cer(d18:1/24:1)), the sterol esters CE(16:1) and CE(18:0), and the sphingomyelin 266 SM(34:1:2) may have added value in the prediction of ASCVD incidence or event risk over traditional 267 lipid measurements.²⁰⁻²² Plasma ceramides have been reported to be independent predictors of cardiovascular events in addition to LDL-C in the population and in CAD patients.^{22, 36, 37} Both LDL-C 268 269 and TGs remained independently associated with all four ceramides quantified in our study, and LDL-270 C was additionally associated with increased saturation degree of ceramides. Unlike most CE species, 271 CE(16:1) was more strongly associated with the concentration of TGs than with LDL-C concentration 272 in our study. SM(34:1:2) was the only sphingomyelin species which was negatively associated with TGs 273 - and this association became evident only after adjusting for LDL-C levels. Additionally, some species, 274 such as Cer(42:1;2) and TG(56:6), which were positively associated with hyperlipidemias in our sample, have previously been reported to be associated with decreased risk of ASCVD events.^{20, 22} These co-275

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associations and discordances between reported associations might explain why some lipid species can
improve risk prediction. Consequently, there is an urgent need for a better understanding of the potential
underlying signaling and metabolic pathways.

Finally, the lipidomic profiles associated with high LDL-C or TG levels were comparable between familial and population-ascertained hyperlipidemias. We observed no differences in either the levels of individual lipid species or the saturation of fatty acids within lipid classes. Our results support the hypothesis that familial and population-ascertained hyperlipidemias have similar, overlapping, and heterogeneous pathophysiology. Our results are also reassuring for the quality of lipidomics studies which combine familial and population-based hyperlipidemic samples to increase statistical power.

285 Although we present the most comprehensive characterization of coronary artery disease risk 286 and circulating lipid species in common familial hyperlipidemias to date, our study has some limitations. 287 The confidence intervals for CAD risk were relatively large in the family samples. The field of 288 lipidomics is still relatively young, and concerns have been raised regarding the replicability of 289 individual lipidomics platforms. The platform used here overcomes these problems by profiting from 290 the advantages of direct infusion mass spectrometry for high throughput screening studies. We also 291 observed similar lipidomic profiles associated with hyperlipidemia in two independent cohorts, 292 supporting the replicability of the platform. Further, the lipid species included in our analyses are 293 strongly associated with known genetic lipid loci (Supplemental Figures V–VIII). We profiled the whole 294 circulating lipidome at once to capture variation across various lipoprotein classes and size distributions. 295 However, this limits our ability to follow up on observed differences at the level of the individual 296 lipoproteins. We excluded poorly captured lipid species from the analyses; future advances in lipidomics 297 technology might enable their detection. It is unclear how well our results can be generalized to other 298 populations than Finns. Some of the individuals surveyed in population cohorts might in fact have 299 familial hyperlipidemia; we could not fully rule out such cases. As this was a cross-sectional study, 300 single LDL-C and TG measurements were used to establish hypercholesterolemia status. However, 301 especially TGs are known to exhibit diurnal variability—especially in relation to dietary episodes with chylomicron entry—as well as variation over time periods of months to years.³⁸⁻⁴⁰ In this study, the 302

samples from the hyperlipidemic families were fasting and the samples from the population cohort were
 semi-fasting. In this light, the similarity of lipidomic profiles between familial and population ascertained hypertriglyceridemias becomes even more striking. Moreover, the most recent consensus
 statement from the European Atherosclerosis Society and European Federation of Clinical Chemistry
 and Laboratory Medicine recommends routine use of non-fasting blood samples for assessment of
 plasma lipid profiles.⁴¹

In conclusion, we observed distinct lipidomic profiles associated with high levels of LDL-C and TGs, but similar CAD risk and lipidomic profiles between common familial and population-ascertained hyperlipidemias, providing further evidence of similar and overlapping underlying mechanisms. The high degree of similarity between these familial dyslipidemic individuals and random population samples in their genomic and lipidomic profiles, and in elevated CAD risk, does not support different screening and treatment for familial and sporadic cases. Additional work is needed to confirm the validity of this hypothesis in clinical settings.

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336 **Conflicts of Interest**

K.S., C.K., and M.J.G. have paid employment at Lipotype GmbH. This does not alter the authors'adherence to all policies on sharing data and materials.

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494

496 Tables

497 Table 1. Coronary artery disease risk in familial and population-ascertained hyperlipidemias.

Hyperlipidemia type	Parameter	Hyperlipidemic families	Population cohort	Meta-analysis
	<i>n</i> (hyperlipidemic / non- hyperlipidemic) Number of incident CAD	625 (136/489)	19,644 (2,175/17,469)	20,269 (2,311/17,958)
High LDL-C	diagnoses (hyperlipidemic / non- hyperlipidemic)	45 (16/29)	904 (176/728)	949 (192/757)
	CAD HR (95% CI)	1.71 (0.94- 3.10)	1.74 (1.48- 2.05)	1.74 (1.48- 2.04)
	n (hyperlipidemic / non- hyperlipidemic) Number of incident CAD	371 (72/299)	19,644 (1,405/18,239)	20,015 (1,477/18,538)
High TGs	diagnoses (hyperlipidemic / non- hyperlipidemic)	21 (3/18)	904 (74/830)	925 (77/848)
	CAD HR (95% CI)	1.35 (0.52- 3.51)	1.38 (1.08- 1.75)	1.38 (1.09- 1.74)

498

499 *Clinical incident CAD event endpoints were defined as either myocardial infarction or coronary revascularization.*

500 Cox proportional hazards models, stratified by sex and clustered by family were used to estimate hazard ratios

501 (*HR*) for incident CAD events using age as the time scale and excluding individuals with prevalent CAD.

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503 Figures and Figure Legends

504 Figure 1. Associations between high LDL-C status and the levels of 151 lipid species.



506 Panel A), individuals affected by high LDL-C levels (n=105) were compared with their unaffected 507 relatives (n=358) in the 53 "high LDL-C" families. Panel B), individuals affected by high LDL-C (n=56) 508 were compared with other individuals (n=841) in the FINRISK population cohort. The association of 509 high LDL-C status with the lipid species was estimated using linear mixed models with age, age², and 510 sex as the other fixed effect covariates. Statistical significance was evaluated using the Benjamini-511 Hochberg method at a 5% false discovery rate (FDR). The ordering of the lipid species within each class 512 is the same as in Supplemental Table III. Cer = ceramide, DG = diacylglyceride, LDL-C = low-density513 lipoprotein cholesterol, LPA = lysophosphatic acid, LPC = lysophosphatidylcholine, LPE = 514 lysophosphatidylethanolamine, PC = phosphatidyletholine, PCO = phosphatidyletholine-ether, PE =515 phosphatidylethanolamine, PEO = phosphatidylethanolamine-ether, PI = phosphatidylinositol, CE =516 cholesteryl ester; SM = sphingomyelin, ST = sterol, TG = triacylglyceride.

518 Figure 2. Associations between high TG status and the levels of 151 lipid species.



A) Association between high TG levels and lipid species in the hyperlipidemic families

520 Panel A), individuals affected by high TGs (n=64) were compared with their unaffected relatives 521 (n=223) in 39 "high TG" families. Panel B), individuals affected by high TGs (n=65) were compared 522 with other individuals (n=832) in the FINRISK population cohort. The association analyses were 523 performed similarly to Figure 1. Abbreviations are displayed in Figure 1 legend.

524

525 Figure 3. Correlation of effect estimates for hyperlipidemia status between the hyperlipidemic



526 families and the population samples.

The correlation between the effect estimates observed in the family and population cohorts is presented
in A) for high LDL-C (effect estimates presented in Figure 1) and B) for high TGs (effect estimates
presented in Figure 2). Abbreviations are displayed in Figure 1 legend.

532 Figure 4. Independent (co-adjusted) associations of LDL-C and TGs with 151 lipid species.



B) Co-adjusted associations of LDL-C and TG levels with lipid species in the hyperlipidemic families

534 Effect estimates for LDL-C and TGs were derived from linear mixed models with the lipid species as outcomes, and LDL-C, log(TGs), age, age^2 , and sex as fixed effect covariates. The effect estimates were 535 536 derived separately in the hyperlipidemic families (Panel A, n = 550 individuals) and the FINRISK 537 population cohort (Panel B, n = 897 individuals). Effect estimates are presented for LDL-C in orange 538 and TGs in purple. Statistical significance was evaluated using the Benjamini-Hochberg method at a 5% 539 false discovery rate (FDR). The ordering of the lipid species within each class is the same as in 540 Supplemental Table III. Abbreviations are displayed in Figure 1 legend.