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# Children with familial hypercholesterolemia display changes in LDL and HDL function: a

### cross-sectional study

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**Abbreviations**: apoA-I, apolipoprotein A-I; apoB, apolipoprotein B; ASCVD, atherosclerotic cardiovascular disease; BMI, body mass index; BCAAs, branched-chain amino acids; CETP, cholesteryl ester transfer protein; DHA, docosahexaenoic acid; FA, fatty acids; FH, familial hypercholesterolemia; HAE, HDL-apoA-I exchange; HDL, high-density lipoprotein; LA, linoleic acid; LCAT, lecithin–cholesterol acyltransferase; LDL, low-density lipoprotein; LDL aggr (PP), LDL aggregation (per particle); LDL aggr (TL), LDL aggregation (total load); LDLR, LDL receptor; MUFA, monounsaturated fatty acids; n3, omega-3 fatty acids; n6, omega-6 fatty acids; PC, phosphatidylcholine; PLTP, phospholipid transfer protein; PON1, paraoxonase-1; PUFA, polyunsaturated fatty acids; RCT, reverse cholesterol transport; SFA, saturated fatty acids; SM, sphingomyelins; VLDL, very low-density lipoprotein

3

#### 1 Abstract

2	Background: The functional status of lipoprotein particles contributes to atherogenesis. The
3	tendency of plasma LDL particles to aggregate and the ability of HDL particles to induce and
4	mediate reverse cholesterol transport associate with high and low risk for cardiovascular
5	disease in adult patients, respectively. However, it is unknown whether children with familial
6	hypercholesterolemia (FH) display lipoprotein function alterations.
7	Hypothesis: We hypothesized that FH children had disrupted lipoprotein function.
8	Methods: We analyzed LDL aggregation susceptibility and HDL-apoA-I exchange to apoA-I
9	ratio (HAE/apoA-I ratio), and activity of four proteins that regulate lipoprotein metabolism
10	(CETP, LCAT, PLTP and PON1) in plasma samples derived from children with FH (n = 47) and
11	from healthy children (n = 56). Potential biological mechanisms behind any variation in
12	lipoprotein functionalities were explored using an NMR-based metabolomics profiling
13	approach.
14	Results: LDL aggregation was higher and HAE/apoA-I ratio was lower in FH children than in
15	healthy children. LDL aggregation associated positively with LDL-C and negatively with
16	triglycerides, and HAE/apoA-I ratio associated negatively with LDL-C. Generally, the
17	metabolomic profile for LDL aggregation was a mirror image of that for HAE/apoA-I ratio.
18	Conclusions: FH children displayed increased atherogenicity of LDL and disrupted HDL
19	function. These newly observed functional alterations in LDL and HDL may increase the risk
20	for atherosclerotic cardiovascular disease in FH children.

- 22 Keywords: Lipoproteins, familial hypercholesterolemia, LDL aggregation, HAE/apoA-I ratio,
- reverse cholesterol transport, cholesterol, children, ASCVD, metabolomics, NMR 23

5

#### 25 Introduction

26	Besides the plasma concentration, lipoprotein particle function is emerging as an important
27	factor in the progression of atherosclerotic cardiovascular disease (ASCVD) (1,2). Low-
28	density lipoprotein (LDL) particles undergo significant modifications in vivo, particularly in
29	the unique microenvironment in the arterial wall, via oxidizing agents, proteases, and lipases
30	(2). Modified LDL particles are prone to aggregation, and the tendency for LDL particles to
31	aggregate is one of several metrics of LDL function, predictive of ASCVD risk (3).
32	Furthermore, the spectrum of high-density lipoprotein (HDL) particles and apolipoprotein A-I
33	(apoA-I) have specific roles in reverse cholesterol transport (RCT), a process that conveys
34	cholesterol and lipids from peripheral tissues to the liver. HDL function can be quantified by
35	metrics of RCT, including cholesterol efflux capacity (CEC) or HDL-apoA-I exchange to apoA-I
36	ratio (HAE/apoA-I ratio) (4), measures also predictive of ASCVD risk (5,6).
37	Because dyslipidemia drives ASCVD, a major cause of disability and death worldwide (1), and
38	because lipoprotein modification connects lipids and inflammation in atherosclerosis (2),
39	biomarkers of lipoprotein function have the potential to identify ASCVD risk well in advance
40	of acute pathological manifestation. However, it is unclear whether children display
41	measurable alterations in lipoprotein function. We reasoned that children with familial
42	hypercholesterolemia (FH) would be a suitable group to examine this research question.
43	Patients with FH show elevated plasma LDL cholesterol (LDL-C) since birth, and a variety of
44	markers of atherosclerotic development are observable even in early childhood (7). We
45	therefore hypothesized that FH children would have disrupted lipoprotein function.

#### 47 Subjects and methods

- The present study is a cross-sectional analysis of FH children and healthy children. We have
  reported research findings from the same populations previously (8,9) (Figure S1, Table S1). *Study design, setting and participants*
- 51 Briefly, we recruited 47 FH children from the outpatient Lipid Clinic at Oslo University
- 52 Hospital (OUH) in Oslo, Norway (9). All children had a definite FH diagnosis, verified by
- 53 genetic or clinical diagnosis, the latter based on the Simon Broome criteria (10). Eighteen
- children (38 %) were currently on statins, and 20 (43 %) had LDL receptor (LDLR) negative
- 55 mutations (**Supplementary Material**) (9,11). Furthermore, we included 56 non-FH, healthy
- 56 children that were part of the Stork children follow-up study at Department of Nutrition,
- 57 University of Oslo (UoO) in Oslo, Norway (8,12). Data collection occurred in the period
- 58 September 2013 to October 2015.
- All children, and their parents when the child was under 16 years, gave written informed
  consent to participate in the study. The Regional Committee for Research Ethics in South
  East Norway approved the study, and the study protocol was in accordance with the
  declaration of Helsinki.
- 63 Data measurements and variables

We obtained clinical and biochemical data as previously described (8,12). Briefly, we assessed clinical variables at the time of visit, including weight, height, and statin use. We collected blood samples at time of visit, and consecutively analyzed standard biochemistry in heparin-plasma at the Department of Medical Biochemistry, OUH. Data collection for the two groups of children was conducted by different researchers but followed the same

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69 standardized research protocol to reduce the impact of information bias. Apart from during 70 the data collection phase, all laboratory analyses (described in the following) were 71 performed with the analysts being blinded to FH status, statin use, sex, or any other 72 characteristics. 73 LDL aggregation assay We analyzed LDL aggregation as previously described, given in brief in Supplementary 74 75 Material (3,13). In accordance with previous reports, we herein analyzed LDL aggregation 76 values for the two-hour timepoint. Because we normalized input to the aggregation assay to 77 0.2 mg apoB-100/mL, effectively adjusting for LDL-C, this represents a *per particle* (PP) 78 metric of LDL aggregation. The LDL aggregation (PP) represents the LDL aggregation variable 79 reported in other studies (3,13). We engineered an additional variable by multiplying LDL 80 aggregation values by laboratory-measured LDL protein concentration. Because this second 81 variable considers the totality of LDL exposure, that is, unadjusted for LDL-C, it represents a 82 total load (TL) metric of LDL aggregation. Although we present both variables in figures, we 83 consider the latter clinically most important and appropriate; hence, we mostly describe LDL aggregation (TL) throughout the manuscript text. 84 85 HDL-apoA-I exchange (HAE) assay

65 TIDE-apoA-i excitatige (TAE) assay

86 We analyzed the HAE/apoA-I ratio as previously described, and summarized in

87 Supplementary Material (4). HAE/apoA-I is a measure of HDLs ability to "exchange" apoA-I,

88 normalized relative to apoA-I plasma level. ApoA-I exchange in the intima is required for HDL

89 biogenesis so HAE/apoA-I therefore *indirectly* reflects HDL's ability to initiate RCT. In

90 contrast, the cell-based CEC assay, which measures the potential of macrophages to deliver

91 cholesterol to lipid-poor apoA-I, is considered the gold standard of HDL function assessment

- 92 (14). While well established, the CEC method has not been standardized and is subject to the
- 93 variability induced by cell culture methods. Despite this, the HAE/apoA-I ratio strongly
- 94 correlates with CEC, and s a result the HAE/apoA-I ratio is an effective and highly
- 95 reproducible surrogate biomarker of CEC (15).
- 96 Lipoprotein metabolism-regulating proteins
- 97 We analyzed the activity of four proteins that participate in the regulation of lipoprotein
- 98 metabolism: cholesteryl ester transfer protein (CETP), lecithin–cholesterol acyltransferase
- 99 (LCAT), phospholipid transfer protein (PLTP) and paraoxonase-1 (PON1). CETP activity
- 100 (nmol/mL/h) was analyzed as the transfer/exchange of radiolabeled [<sup>14</sup>C]-cholesteryl oleate
- 101 between exogenously added human LDL and HDL2, as described (16). LCAT activity
- 102 (nmol/ml/h) was assessed by measuring cholesterol esterification activity using exogenous
- 103 [<sup>3</sup>H]-cholesterol-labelled HDL proteoliposome discs as the substrate (17). PLTP activity
- 104 (nmol/ml/h) was determined with a radiometric method as described (18). PON1 (umol/min)
- 105 activity was measured with a chromogenic method (19).
- 106 Quantitative NMR metabolomics
- 107 We measured a broad set of biomarkers involved in human metabolism-related health and
- 108 disease using a commercially available, high-throughput nuclear magnetic resonance (NMR)
- spectroscopy platform (Nightingale Health, Finland) (20). The method is thoroughly
- described in separate reports (20,21). Briefly, the biomarkers covered particle concentration
- and lipid content of 14 subclasses of lipoproteins, and plasma fatty acids, amino acids,
- 112 glucose metabolites, ketone bodies and other biomarkers, including certain protein
- biomarkers. In contrast to our previous work which was based on the original 2016
- algorithm (9), the data values for the present analysis were estimated using the 2020

9

algorithm (Nightingale Health, Finland). Note also that previous metabolomics analyses

regarding LDL aggregation was based on LC-MS, not NMR (3).

117 Data analyses

118 We performed all data analyses in R version 4.0.0 (22) using RStudio (Boston, MA, USA,

119 www.rstudio.com) and the *tidyverse* framework, including data cleaning, data manipulation,

data modeling, and data visualization (23). Thorough exploratory data analysis guided all

121 data analysis decision-making described below. We refer to R packages and functions where

**122** appropriate using the following notation: package::function.

123 Feature engineering

124 We calculated body mass index (BMI) z score based on World Health Organization (WHO)

125 Growth References (addWGSR::zscorer) (24). Furthermore, we addressed missing data

126 with the following strategies. First, for CRP, estradiol, and testosterone, 80, 55 and 44

127 participants had values below or exactly at detection limits of 0.6 mg/L, 0.04 nmol/L and 0.4

128 nmol/L, respectively. We imputed these entries manually by generating a random uniform

129 between zero and specific detection limit (stats::runif). Additionally, a single

130 participant had missing entries for estradiol and testosterone. Second, for HAE/apoA-I ratio,

131 we changed a single entry to missing because it was unlikely high (> 58), totaling 13 missing

132 entries for FH children for this variable. Additionally, the concentration and lipid content of

133 the largest lipoprotein particles was zero for many subjects, likely because of values being

134 below the detection limit. For XXL-VLDL particles and lipids, 27 entries were zero (covering

both FH children and healthy children); similarly, for XL-VLDL particles and lipids, entries

136 were zero for two FH children. We changed all these to missing. Finally, we imputed missing

137 entries with the k-nearest neighbors (kNN) algorithm within the *tidymodels* framework

10

138	(recipes:	:recipe and	recipes::	:step	knnimpute <b>to</b>	impute, and
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139 recipes::prep and recipes::juice to collect the imputed dataset).

140 Furthermore, also prior to modeling, we log<sub>e</sub> transformed (base::log) all right skewed

141 continuous exposures and outcomes to normal distributions. Right skewness was objectively

142 defined as skewness > 1 (e1071::skewness). For the lipoprotein function metrics and

143 lipoprotein metabolism-regulating proteins, this applied to the LDL aggregation variables (PP

and TL) and PON1 only (see **Table S2** for the full overview); following transformations, these

145 biomarkers displayed normal distributions except PON1, which showed a bivariate

146 distribution, likely related to genetic variation (25). Next, we normalized all continuous

147 variables to standard normal distributions, that is, with mean equal to zero and standard

148 deviation equal to one (base::scale), to aid comparison of magnitudes and to aid

149 visualization of the results. Consequently, the β regression coefficients for continuous

150 variables can be interpreted as *per 1 standard deviation increase*.

151 Linear models

We examined lipoprotein function metrics and lipoprotein metabolism-regulating proteins in 152 153 FH children and healthy children; however, our statistical analyses were divided into two 154 parts, described below. We used ordinary linear regression models (stats::lm) to explore 155 crude models and models adjusted for one or more of the following covariates: age, sex, BMI 156 z score, triglycerides, statin use and mutation type. All associations we present herein are 157 multivariable linear regression models adjusted for age, sex, and BMI z score; other 158 univariate or multivariate models with different adjustment levels were relatively similar. 159 We first compared lipoprotein function metrics and lipoprotein metabolism-regulating 160 proteins (seven outcomes) in FH children with healthy children (one exposure), for example

161	like so: LDL aggregation (TL) ~ FH status + covariates. In this set of models, we also examined
162	FH subgroups: statin users, non-statin users, LDLR negative mutations, and other mutations.
163	Secondly, we performed a more comprehensive analysis: we examined the variation in LDL
164	aggregation (PP), LDL aggregation (TL) and HAE/apoA-I ratio (three outcomes) across all
165	clinical variables and biomarkers covered by the NMR metabolomics platform (98-99
166	exposures), for example like so: LDL aggregation (TL) ~ L-LDL-P + covariates. In the second
167	part, we performed the analyses for all children combined (306 models), and separately for
168	FH children (312 models) and healthy children (306 models), yielding a total of 924 models.
169	Significance and power
170	For the first analysis part, we set alpha level to 0.05. In the second part, we did not consider
171	significance in the usual way. Instead, we interpreted the direction and strength of the $eta$
172	regression estimates, the uncertainty around those estimates, and the relationship between
173	variables. Still, we reported significance by standard cutoffs in the figures: P < 0.001, P <
174	0.01, P < 0.05 and P $\ge$ 0.05, to aid translation of the results.
175	We did not perform <i>a priori</i> power calculations for the present study. However, to give an
176	indication of the power of our analyses, we performed simple post hoc power calculations
177	for the general linear model (pwr::pwr.f2.test), yielding the following result. Given six
178	degrees of freedom, for an association quantified by an R <sup>2</sup> (explained variance) of 0.13
179	(which corresponds to the <i>median</i> R <sup>2</sup> among our associations), to have 80 % power, we
180	would have needed a <i>total</i> sample size of approximately 98, 135 and 184 subjects, for P
181	value thresholds of 0.05, 0.01 and 0.001, respectively.

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#### 182 Miscellaneous

- 183 For the descriptive Tables S1 and **S3**, we calculated relevant summary statistics, including
- 184 mean and standard deviation (for normally distributed, continuous variables), median and
- 185 interquartile range (for skewed, continuous variables), and frequency and percentage (for
- 186 categorical variables). We also compared groups using Independent Samples T tests or Chi-
- 187 squared tests, as appropriate.

13

#### 189 Results

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FH children had alterations in lipoprotein function metrics, which associated with clinical
parameters

We measured LDL aggregation, HAE/apoA-I ratio, and various plasma proteins that are

193 important in vivo regulators of lipoprotein metabolism. Interestingly, FH children displayed 194 higher LDL aggregation (PP), which was further enhanced when the total load of aggregating 195 LDL (TL) was considered, and lower HAE/apoA-I ratio (Figure 1, Table S3). While adjusting for 196 statin use and mutation type did not influence these associations (data not shown), non-197 statin users and FH children with LDLR negative mutations generally displayed a more 198 pronounced effect (Figure S2 and S3). 199 LDL aggregation (TL) and HAE/apoA-I ratio associated with several clinical parameters 200 (Figure S3 and S4). Specifically, LDL aggregation (TL) associated positively with LDL-C and sex 201 hormones, and negatively with triglycerides. HAE/apoA-I ratio associated negatively with 202 LDL-C and sex hormones, in addition to age (Figure S3 and S4). Interestingly, in general, the 203 associations for LDL aggregation (TL) and HAE/apoA-I ratio went in the opposite directions, 204 except for triglycerides. Of note, while the associations for triglycerides were robust in 205 subgroup analyses, the associations for LDL-C were not (Figure S4), likely because of the 206 limited range in LDL-C (Figure S5).

The lipoprotein metabolism-regulating biomarkers displayed no clear differences across groups (Figure 1), although LCAT activity inversely associated with BMI and triglycerides (Figure S3).

210 Lipoprotein function metrics associated with various lipid subclasses and metabolites,

211 *supporting the clinical phenotypes* 

14

Next, to explore further why LDL aggregation (PP and TL) and HAE/apoA-I ratio differed in FH
children and healthy children, we investigated the association of the lipoprotein function
metrics with several lipoprotein subclasses and metabolites covering key facets of human
metabolism.

216 LDL aggregation (TL) associated positively with LDL lipoprotein subclasses, apoB, VLDL

217 remnants (XS-VLDL and IDL) and LDL particle diameter, and inversely with major VLDL

218 particles and the smallest HDL particles (Figure 2, Table S2). Like for the clinical parameters

219 (Figure S3), LDL aggregation (TL) and HAE/apoA-I ratio patterns were largely mirror images

of each other. Furthermore, cholesterol fractions in LDL and VLDL (total, esterified or free)

associated positively with LDL aggregation (TL), and so did phospholipids in LDL, plasma total

sphingomyelins (SM), and the SM/phosphatidylcholine (PC) ratio (Figure 3, Table S2). The

proportion of triglycerides to total lipids (LDL-TG %) and the ratio of CE to FC in LDL particles

224 (LDL-CE/FC) negatively associated with LDL aggregation (TL). In contrast, for HAE/apoA-I

ratio, most of the associations described above were in the opposite direction. Additionally,

triglycerides in VLDL or HDL and phospholipids in HDL associated negatively with LDL

aggregation (TL). Even more detailed subclass analyses showed the same trends (data notshown).

PUFA, omega-6 and linoleic acid (LA) levels, as well as degree of unsaturation, all associated
positively with LDL aggregation (TL) and negatively with HAE/apoA-I ratio (Figure 4, Table
S2). Additionally, relative content of MUFA and SFA levels associated inversely with LDL
aggregation (TL). Omega-3 markers associated neither with LDL aggregation (TL) nor with
HAE/apoA-I ratio. Moreover, LDL aggregation (TL) associated inversely with levels of
branched-chain amino acids (BCAAs), and positively with levels of ketone bodies (Figure 5,

- Table S2). Although HAE/apoA-I ratio again displayed associations in the opposite direction,
- these were less pronounced.
- 237 Overall, biomarker associations were opposite for LDL aggregation (TL) and HAE/apoA-I ratio
- 238 With few exceptions, the associations between the lipoprotein function metrics and the
- 239 lipoprotein subclasses and metabolites headed in *completely opposite* directions for LDL
- aggregation (TL) and HAE/apoA-I ratio (Figure 6, Table S2).

#### 16

#### 242 Discussion

243	In the present study, we demonstrated that FH children displayed disrupted lipoprotein
244	function compared with healthy children. Overall, the FH children were characterized by
245	enhanced LDL aggregation (both PP and TL) and attenuated HAE/apoA-I ratio, strongly
246	suggesting the presence of LDL particles with an increased atherogenicity and an impaired
247	function of HDL particles in the first step of RCT, respectively. Our results indicate that
248	variation in LDLR function, plasma LDL-C and cumulative cholesterol burden may jointly be
249	the overarching drivers and common denominators biologically linking these metrics.
250	FH children had LDL particles that were particularly prone to aggregation, as reflected by
251	high LDL aggregation (PP) in this group. Also considering the LDL protein concentration (LDL
252	aggregation [TL]), the difference between FH children and healthy children was even more
253	pronounced. These effects could contribute to the high risk of ASCVD in this population.
254	Aggregation of LDL particles typically occurs following their retention in the arterial
255	subendothelial intimal layer (2,26–28), but our present results suggest that lipoproteins in
256	FH subjects could be primed for aggregation already while circulating in the blood,
257	potentially due to their increased residence time in plasma caused by the underlying LDLR
258	defect. In line with this, we previously showed that FH children have higher circulating levels
259	of oxidized LDL (29) and display a shift in blood monocytes towards a more pro-
260	inflammatory phenotype (12). We also observed previously that peripheral blood
261	mononuclear cells (PBMCs) in FH children are characterized by a pro-inflammatory
262	phenotype, which can be partially normalized upon initiation of statin treatment (30). Along
263	with the isolated hypercholesterolemia, these alterations in FH subjects could help explain
264	their elevated risk of ASCVD (31–33). Indeed, in the Finnish Corogene Study, baseline LDL

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aggregation (PP) was higher in adult ASCVD patients who died during a 2.5-year follow-up
period, compared to those with stable coronary artery disease (3). In comparison, both of
these patient groups had higher LDL aggregation (PP) than healthy subjects in the Health
2000 Study (3).

FH children had lower HAE/apoA-I ratio compared with healthy children, which suggests that 269 hypercholesterolemia impairs not only LDL function, but also one of the major HDL-270 271 associated atheroprotective functions, namely, cholesterol efflux from macrophages to HDL 272 (34). These results support our previous data (12,35). Importantly, in adult non-FH subjects 273 CEC associated with atherosclerosis and predicted future ASCVD events independent of 274 plasma HDL-C concentration (5,6,36). In those analyses, the researchers adjusted for several 275 covariates including LDL-C and concluded that the association with ASCVD was independent 276 of classical risk factors. The present results suggest that prolonged exposure to high LDL-C in 277 otherwise healthy children has an adverse effect on HDL function, HDL metabolism, and RCT. 278 One mechanism could be related to oxidized LDL (34,37). Work in experimental animals 279 interestingly suggests that lack of functional hepatic LDLRs attenuate RCT via concerted 280 action of the HDL-LDL-axis (38). Regardless of the mechanism, findings in adolescent FH 281 subjects support that HDL function is altered early in life (39). The risk factor-related 282 detrimental effect on RCT is likely not isolated to high LDL-C, though, as we previously 283 observed similar alterations upon prolonged exposure to hyperglycemia in children with 284 diabetes mellitus type I (4).

Clinical and biomarker associations for LDL aggregation (TL) and HAE/apoA-I ratio were
 largely mirror images of each other, suggesting that these features correlate. In our study
 populations, this was likely mediated by the variation in the concentration of circulating LDL

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288 particles and associated downstream effectors such as oxidized LDL. Notably, for LDL 289 aggregation (TL), the strength and direction of associations and interrelations across all 290 variables were practically identical to those seen for isolated hypercholesterolemia (9); for 291 HAE/apoA-I ratio, associations were in the opposite direction. This included LDL lipoprotein 292 particle subclasses, apoB, LDL diameter, cholesterol fractions in LDL and VLDL (total, 293 esterified, free), phospholipids in LDL, SMs, PUFA, omega-6, and LA. Furthermore, although 294 both LDL aggregation (TL) and HAE/apoA-I ratio associated with LDL-C, we observed an 295 unexpected relationship with FH status: the results were *not* robust in analyses of FH 296 children and healthy children separately (Figures 2-5 and S4). This Simpson's paradox-like 297 behavior could, however, be explained by two factors: that subgroup analyses in this case 298 would equate to adjusting for the mediator in the causal pathway (that is, LDL-C), and the 299 limited range in LDL-C observed within each group (Figure S5). In contrast, the effects of the 300 mutation type and statin use on the studied metrics (LDL aggregation [TL] and HAE/apoA-I 301 ratio) were in the expected directions: when compared with healthy children, LDLR negative 302 mutations and lack of statin use were more detrimental, and other LDLR mutations and 303 statin use were less detrimental. Taken together, it seems likely that variation in LDLR 304 function, plasma LDL-C and cumulative cholesterol burden may jointly be the overarching 305 drivers and common denominators biologically linking these metrics. Consequently, these 306 findings could be extrapolated to variation in cholesterol burden in non-FH populations. 307 Paradoxically, LDL aggregation associated *inversely* with triglycerides, suggesting that higher 308 triglyceride levels within the normal triglyceride range were protective. The Spearman's 309 correlation coefficients for LDL aggregation and triglycerides were -0.39 (PP) and -0.25 (TL), 310 respectively. This finding was consistent in subgroup analyses, and is also corroborated by 311 similar results from other studies: in the Health 2000 Study and the Corogene Study, the

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312	correlations between LDL aggregation (PP) and triglycerides were -0.28 and -0.38,
313	respectively (3). The in-depth exploration of biological mechanisms for this association
314	(Figures 2-5) only reinforced these clinical findings (Figures S3 and S4): the overall
315	metabolomics pattern corresponded well with the expected changes paralleling lower
316	triglycerides. For example, low triglyceride levels typically associate with low levels of
317	triglycerides in VLDL, IDL, LDL and HDL particles, VLDL lipoprotein particle subclasses, VLDL
318	diameter, phospholipids and cholesterol fractions in VLDL (total, esterified, free), total
319	phosphoglycerides, total cholines, PCs, SMs, and the SM/PC ratio. Low triglycerides also
320	associate with low SFA and MUFA and higher ketone bodies, likely corresponding to higher
321	hepatic beta-oxidation and ketogenesis and lower liver fat content (40). Finally, low
322	triglycerides associate with low levels of branched-chain amino acids, probably related to
323	higher muscle beta-oxidation (41). All these observations are likely downstream effects of
324	high insulin sensitivity which parallel low triglycerides (40). Taken together, triglycerides
325	strongly, consistently, and inversely associated with LDL aggregation (see Supplementary
326	Material for further discussion).
327	The present work has certain limitations that warrant mention. First, this is an observational,
328	cross-sectional analysis, thus, we can neither infer causality nor rule out residual
329	confounding factors. However, because FH is a well-characterized human genetic disorder,
330	we feel confident that the LDLR mutations caused an increase in LDL-C prior to all other
331	alterations (42). Also, the effect of confounding factors is likely lower in children than in

adults, regardless of FH status. Second, the number of study participants was low, which

increases the probability of false positive and negative findings. To meet this issue, we did

334 not emphasize significance, but rather focused on the direction and strength of associations,

the uncertainty around the point estimates, and their interrelations. Third, the two groups of

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336	children were not collected for a single study; rather, they were part of separate
337	recruitments, which likely introduced bias in both data collection and standard clinical and
338	biochemical data measurements. However, we performed data collection during a single
339	period and adhered to strict study protocols to attenuate the potential bias. Also, the
340	lipoprotein function metrics, lipoprotein metabolism-regulating proteins and NMR metrics
341	were analyzed collectively by highly standardized protocols. Importantly, in this phase the
342	analysts were blinded to the subject characteristics. Finally, we did not perform LC-MS in-
343	depth proteomic and lipidomic analyses of the LDL particles, which could have shed light
344	both on the triglyceride paradox and whether the specific characteristics of the particles
345	represented a shared mechanistic link between LDL aggregation and HDL efflux.
346	To the best of our knowledge, this is the first study that comprehensively examines LDL and
347	HDL lipoprotein function metrics in FH children, thus expanding our knowledge and
348	understanding about these relevant biomarkers of ASCVD risk in severe early-life
349	hypercholesterolemia. Although FH is a genetic disorder, the atherosclerotic process is
350	similar in all humans, which to a large degree enables translation of our findings to the
351	general population.
352	In conclusion, FH children were characterized by disrupted lipoprotein function compared
353	with healthy children, which was related to differences in plasma lipids and lipoproteins.
354	Higher LDL-C associated with both higher LDL aggregation (TL) and lower HAE/apoA-I ratio,
355	suggesting that LDLR function and plasma LDL-C may be the overarching drivers and
356	common denominators linking these metrics in a biologically relevant context. For more
357	strict causal verification, these molecular aspects need further detailed mechanism-based

358 investigations.

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#### 385 Authorship

- 386 Conception and design: JJC, IN, SMU, KÖ, KBH; data collection: JJC, IN, MR, MH, MJ, MPB,
- 387 MO, CW, KR; data analysis: JJC, IN, MR, MH, MJ, PK, MO, KÖ, KBH; data interpretation: all
- 388 authors, wrote paper and responsibility for final content: JJC, KÖ, KBH; all authors read,
- 389 critically revised and approved the final manuscript.

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#### **Figure legends**





Figure 1. FH children display higher LDL aggregation and lower HAE/apoA-I ratio. Panels A-G shows raw data distributions for LDL aggregation (total load or per particle), PLTP, CEPT, PON1, LCAT, and HAE/apoA-I for FH children (n = 47) and healthy children (n = 56). Note that the LDL aggregation (total load and per particle) and PON1 variables are loge transformed. P values are based on an Independent Samples T test. See Table S3 for the summary statistics corresponding to these biomarkers for FH children and healthy children separate, and both groups combined. The forest plot (panel H) shows the estimated difference between FH

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children and healthy children, represented by β regression coefficients (± 95 % confidence intervals). Coefficients on the right side of the zero-line indicate higher level in FH children, and opposite for the left side. All biomarkers were normalized prior to modeling (mean = 0, standard deviation = 1); the models are adjusted for age, sex, and BMI z score. Abbreviations: aggr, aggregation; apoA-I, apolipoprotein A-I; CETP, cholesteryl ester transfer protein; HAE, HDL-apoA-I exchange; HDL, high-density lipoprotein; LCAT, lecithin–cholesterol acyltransferase; LDL, low-density lipoprotein; PLTP, phospholipid transfer protein; PON1, paraoxonase-1; PP, per particle; TL, total load.





## Figure 2. LDL aggregation and HAE/apoA-I ratio associate with lipoprotein particles, apolipoproteins, and particle size. The forest plot shows the association between lipoprotein function metrics (LDL aggregation (per particle or total load) or HAE/apoA-I ratio) and a subset of NMR-derived metrics (lipoprotein particles, apolipoproteins and lipoprotein particle size, for the major lipoprotein subclasses), represented by β regression coefficients (± 95 % confidence intervals). The symbols show the associations for all children combined (larger circles), FH children only (upward pointing triangles), and healthy children only (downward pointing triangles). Coefficients on the right side of the zero-line indicate a

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positive association, and opposite for the left side. Lipoprotein function metrics and all NMR metrics were normalized prior to modeling (mean = 0, standard deviation = 1); the models were adjusted for age, sex, and BMI z score. Abbreviations: aggr, aggregation; apoA-I, apolipoprotein A-I; ApoB, apolipoprotein B; HAE, HDL-apoA-I exchange; HDL, high-density lipoprotein; IDL, intermediate-density lipoprotein; L, large; LDL, low-density lipoprotein; M, medium; PP, per particle; S, small; TL, total load; VLDL, very low-density lipoprotein; XL, very large; XS, very small; XXL, extremely large.

#### Figure 3



Figure 3. LDL aggregation and HAE/apoA-I ratio associate with total cholesterol, cholesterol esters, free cholesterol, triglycerides, and phospholipids. The forest plot shows the association between lipoprotein function metrics (LDL aggregation (per particle or total load) or HAE/apoA-I ratio) and a subset of NMR-derived metrics (total cholesterol, cholesterol esters, free cholesterol, triglycerides, and phospholipids, for the major lipoprotein subclasses). Interpretation similar as for Figure 2. Abbreviations: aggr, aggregation; apoA-I,

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apolipoprotein A-I; ApoB, apolipoprotein B; CEs, cholesterol esters; Chol, cholesterol; Clin, clinical; FCs, free cholesterol; HAE, HDL-apoA-I exchange; HDL, high-density lipoprotein; IDL, intermediate-density lipoprotein; LDL, low-density lipoprotein; Phosphatidylc, phosphatidylcholines; Phosphoglyc, total phosphoglycerides; PLs, phospholipids; PP, per particle; SM/PC, sphingomyelin/phosphatidylcholine ratio; TGs, triglycerides; TG/PG, triglyceride/phophoglycerides ratio; TL, total load; VLDL, very low-density lipoprotein.







Figure 4. LDL aggregation and HAE/apoA-I ratio associate with fatty acids. The forest plot shows the association between lipoprotein function metrics (LDL aggregation (per particle or total load) or HAE/apoA-I ratio) and a subset of NMR-derived metrics (fatty acids, in absolute or relative amounts). Interpretation similar as for Figure 2. Abbreviations: aggr, aggregation; apoA-I, apolipoprotein A-I; DHA, docosahexaenoic acid; FA, fatty acids; HAE, HDL-apoA-I exchange; HDL, high-density lipoprotein; LA, linoleic acid; LDL, low-density lipoprotein; mmol/L, absolute concentration; MUFA, monounsaturated fatty acids; n6, omega-6 fatty acids; n3, omega-3 fatty acids; PP, per particle; PUFA, polyunsaturated fatty acids; SFA, saturated fatty acids; TL, total load; %, relative level (percentage of total fatty acids).





Figure 5. LDL aggregation and HAE/apoA-I ratio associate with amino acids, glucose metabolites, ketone bodies and other biomarkers. The forest plot shows the association between lipoprotein function metrics (LDL aggregation (per particle or total load) or HAE/apoA-I ratio) and a subset of NMR-derived metrics (amino acids, glucose metabolites, ketone bodies and other biomarkers). Interpretation similar as for Figure 2. Abbreviations: AAAs, aromatic amino acids; aggr, aggregation; apoA-I, apolipoprotein A-I; arom, aromatic; BCAAs, branched-chain amino acids; bOHbut, beta-hydroxybutyric acid; cap, capacity; Gpacetyls, glycoprotein acetyls; HAE, HDL-apoA-I exchange; HDL, high-density lipoprotein; LDL, low-density lipoprotein; OAAs, other amino acids.





Figure 6. Associations between lipoprotein function metrics and NMR-derived metrics generally go in the opposite direction for LDL aggregation and HAE/apoA-I ratio. The scatterplot shows the inverse relationship between β regression coefficients for *all* NMRderived metrics, for associations with LDL aggregation (TL) (x-axis) and associations with HAE/apoA-I ratio (y-axis). Note that each circle corresponds to a variable shown in Figures 2 to 5 (models for all children). Coefficients on the right side of the vertical zero-line indicate a positive association with LDL aggregation (TL), and opposite for the left side; similarly, coefficients above the horizontal zero-line indicate a positive association with HAE/apoA-I ratio, and opposite below. Annotated variables are those with standardized residuals above 1.5 (absolute value), which means they are more than 1.5 standard deviations away from the orange least-squares regression line. Lipoprotein function metrics and all NMR metrics were

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normalized prior to modeling (mean = 0, standard deviation = 1); the models were adjusted for age, sex, and BMI z score. Abbreviations: Acetoac, acetoacetate; apoA-I, apolipoprotein A-I; bOHbut, beta-hydroxybutyric acid; DHA, docosahexaenoic acid; FA, fatty acids; Gln, glutamine; Gp-acetyls, glycoprotein acetyls; HAE, HDL-apoA-I exchange; HDL, high-density lipoprotein; IDL, intermediate-density lipoprotein; L, large; LDL, low-density lipoprotein; M, medium; MUFA, monounsaturated fatty acids; P, P value; Phe, phenylalanine; PUFA, polyunsaturated fatty acids; R<sup>2</sup>, explained variance; TG, triglycerides; Tyr, tyrosine; VLDL, very low-density lipoprotein; XL, very large; XS, very small.