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The APOA1BP-SREBF-NOTCH axis is associated with reduced atherosclerosis risk in morbidly obese patients --Manuscript Draft--

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Abstract:	Background & Aims: Atherosclerosis is characterized by an inflammatory disease linked to excessive lipid accumulation in the artery wall. The Notch signalling pathway has been shown to play a key regulatory role in the regulation of inflammation. Recently, in vitro and pre-clinical studies have shown that apolipoprotein A-I binding protein (AIBP) regulates cholesterol metabolism(SREBP) and NOTCH signalling (haematopoiesis) and may be protective against atherosclerosis, but the evidence in humans is scarce. Methods: Weevaluated the APOA1BP-SREBF-NOTCH axis in association with atherosclerosis in two well-characterized cohorts of morbidly obese patients (n = 78) within the FLORINASH study, including liver transcriptomics, 1 H-NMR plasma metabolomics, high-resolution ultrasonography evaluating carotid intima-media thickness (cIMT), and haematological parameters. Results: The liver expression levels of APOA1BP were associated with lower cIMT and leukocyte counts, a better plasma lipid profile and higher circulating levels of metabolites associated with lower risk of atherosclerosis (glycine, histidine and asparagine). Conversely, liver SREBF and NOTCH mRNAs were positively associated with atherosclerosis, liver steatosis, an unfavourable lipid profile, higher leukocytes and increased levels of metabolites linked to inflammation and CVD such as branched-chain amino acids and glycoproteins. APOA1BP and NOTCH signalling also had a strong association, as revealed by the negative correlations among APOA1BP expression levels and those of all NOTCH receptors and jagged ligands. Conclusions: We hereprovide the first evidence in human liverof the putative APOA1BP - SREBF-NOTCH axis signalling pathway and its association with atherosclerosis and inflammation.

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39	atherosclerosis, inflammation, haematopoiesis, liver	

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41 Abbreviations

AAV, adeno-associated virus; ABCA1, ATP-binding cassette transporter A1; AIBP, 42 apolipoprotein A-I binding protein; APOA1, apolipoprotein A1; ALT, alanine 43 44 aminotransferase; AST, aspartate aminotransferase; BCAA, branched-chain amino acids; CCA; common carotid arteries; cIMT, carotid intima-media thickness; CAD, coronary 45 46 artery disease; HbA1c, glycated haemoglobin; HDL, high-density lipoprotein; HOMA-IR, homeostasis model assessment of insulin resistance; HPSC, hematopoietic progenitor 47 and stem cells; HsCRP, high sensitive C-reactive protein; ICA, internal carotid arteries; 48 LCAT, lecithin-cholesterol acyltransferase; MWAS, metabolite-wide association studies; 49 NAG, N-acetylglycoproteins; O-PLS, orthogonal partial least squares; PCA, principal 50 component analysis; preCCA, pre bifurcation common carotid arteries; proCCA, 51 proximal segment common carotid arteries; RBC, red blood cells; RCT, reverse 52 cholesterol transport; SR-BI; scavenger receptor class B member 1; TG, triglycerides; 53 54 WBC, white blood cells

55 Abstract

Background & Aims: Atherosclerosis is characterized by an inflammatory disease linked to excessive lipid accumulation in the artery wall. The Notch signalling pathway has been shown to play a key regulatory role in the regulation of inflammation. Recently, *in vitro* and pre-clinical studies have shown that apolipoprotein A-I binding protein (AIBP) regulates cholesterol metabolism (SREBP) and NOTCH signalling (haematopoiesis) and may be protective against atherosclerosis, but the evidence in humans is scarce.

63 **Methods:** We evaluated the *APOA1BP-SREBF-NOTCH* axis in association with 64 atherosclerosis in two well-characterized cohorts of morbidly obese patients (n = 78) 65 within the FLORINASH study, including liver transcriptomics, ¹H-NMR plasma 66 metabolomics, high-resolution ultrasonography evaluating carotid intima-media 67 thickness (cIMT), and haematological parameters.

Results: The liver expression levels of APOA1BP were associated with lower cIMT and 68 leukocyte counts, a better plasma lipid profile and higher circulating levels of metabolites 69 70 associated with lower risk of atherosclerosis (glycine, histidine and asparagine). Conversely, liver SREBF and NOTCH mRNAs were positively associated with 71 atherosclerosis, liver steatosis, an unfavourable lipid profile, higher leukocytes and 72 73 increased levels of metabolites linked to inflammation and CVD such as branched-chain amino acids and glycoproteins. APOA1BP and NOTCH signalling also had a strong 74 association, as revealed by the negative correlations among APOA1BP expression levels 75 76 and those of all NOTCH receptors and jagged ligands.

77 Conclusions: We here provide the first evidence in human liver of the putative
78 *APOA1BP-SREBF-NOTCH* axis signalling pathway and its association with
79 atherosclerosis and inflammation.

Atherosclerosis is the major cause of cardiovascular disease (CVD), the leading cause of 80 81 death worldwide. Several studies have shown the anti-atherogenic potential of the highdensity lipoprotein (HDL)-mediated reverse cholesterol transport (RCT) [1]. In this 82 process, excess cholesterol is transported from macrophages and peripheral tissues back 83 to the liver for excretion. A critical part of RCT is cholesterol efflux, in which intracellular 84 cholesterol is released and collected by apolipoprotein A1 (APOA1), the major 85 86 component of HDL [2]. In fact, the cholesterol efflux potential of HDL is a better predictor of CVD than circulating HDL levels [3]. The ATP-binding cassette transporter 87 A1 (ABCA1), a cell-membrane protein, is the major transporter that mediates this 88 89 assembly of cholesterol with APOA1, which is the rate-limiting step in the formation of nascent HDLs. 90

The APOA1 binding protein (AIBP), encoded by APOA1BP in humans, is a secreted 91 protein physically associated with APOA1 [4] that enhances cholesterol efflux in vitro 92 93 from macrophages [5] and endothelial cells [6] in the presence of APOA1 or HDL, partly 94 by facilitating apoA1 binding to ABCA1 and preventing ABCA1 degradation [5]. Recently, AIBP has shown to protect against atherosclerosis in vivo in Apoe^{-/-} and Ldlr^{-/-} 95 mice by promoting cholesterol efflux and ameliorating inflammation [7,8]. Human 96 97 APOA1BP mRNA is ubiquitously expressed and abundant in most human secretory organs, with the highest expression in kidney, heart, liver, thyroid gland, adrenal gland, 98 and testis [4]. It is of note that kidney and liver are the major sites of APOA1 catabolism. 99

Atherosclerosis is characterized by progressive accumulation of lipids and leukocytes in the intima layer of the arterial wall. It is considered a chronic inflammation disease with monocytes/macrophages, the main immune cells of the innate immune response, playing a major role in all stages of atherosclerosis [9]. Notably, the Notch pathway is wellrecognized as a major regulator of cell fate in stem cells and the differentiation of the various cell types of the immune system [10]. Recently, the Notch signalling pathway
was shown to play an important role in the onset and progression of atherosclerosis by
promoting inflammation through induction of a pro-inflammatory M1 phenotype in
macrophages, a switch towards a Th-1 like inflammatory phenotype in differentiated
regulatory T cells, and promoting CD8 cytotoxic T cells [11].

Recent evidence suggests a control of hematopoietic progenitor and stem cells (HPSC) 110 111 by cholesterol pathways [12], thereby linking haematopoiesis with atherosclerosis. 112 Interestingly, a connection between AIBP-mediated cholesterol metabolism and Notch signalling has been described recently. AIBP was shown to regulate Notch signalling 113 114 through relocalization of γ -secretase from lipid to non-lipid rafts in mice [13] and zebrafish Aibp2-mediated cholesterol efflux was shown to active endothelial Srebp2, 115 116 which in turn trans-activates Notch and promotes HSPC emergence. These observations suggest a role for the AIBP-SREBP-NOTCH axis in atherosclerosis [14]. Although the 117 118 bone marrow is the primary site of haematopoiesis in adults, the liver is the main site during prenatal development and hepatic haematopoiesis is believed to persist into 119 120 adulthood [15,16].

No study has, to date, addressed the potential association between AIBP and Notch signalling in humans. Here, we studied this connection in two well-characterized cohorts of morbidly obese patients recruited to the FLORINASH study (17) combining hepatic transcriptome, plasma metabolome, and carotid intima-media thickness (cIMT) measures.

127 Subjects and Methods

128 STUDY POPULATION AND SAMPLE COLLECTION

The study population (n = 78) included two cohorts of morbidly obese patients aged 22 129 130 to 61 years old recruited at the Endocrinology Service of the Hospital Universitari de Girona Dr Josep Trueta (Girona, Spain, n = 32) and at the Center for Atherosclerosis of 131 Policlinico Tor Vergata University of Rome (Rome, Italy, n = 46), as part of the 132 FLORINASH study [17]. All subjects gave written informed consent, which was 133 134 validated and approved by the ethical committees of the Hospital Universitari Dr Josep Trueta (Comitè d'Ètica d'Investigació Clínica, approval number 2009 046) and 135 136 Policlinico Tor Vergata University of Rome (Comitato Etico Indipendente, approval number 28-05-2009). Inclusion criteria included Caucasian origin, stable body weight 3 137 138 months before the study, free of any infection one month preceding the study and absence 139 of any systemic disease. Exclusion criteria included presence of liver disease and thyroid 140 dysfunction, alcohol consumption (> 20 g/day), hepatitis B, drug-induced liver injury, 141 and dyslipidaemia medication. Plasma samples were obtained during the week before 142 elective gastric bypass surgery, during which a liver biopsy was sampled. All samples were stored at -80 °C. Liver samples were collected in RNAlater, fragmented and 143 144 immediately flash frozen in liquid nitrogen before storage at -80 °C.

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146 ANTHROPOMETRIC AND LABORATORY MEASUREMENTS

Blood pressure was measured using a blood pressure monitor (Hem-703C, Omron, Barcelona, Spain), with the subject seated and after 5 min of rest. Three readings were obtained and the mean value was used in the analyses. Waist circumference was measured with a soft tape midway between the lowest rib and the iliac crest. Obesity was considered as a body mass index (BMI) \geq 30 kg/m².

After 8 h fasting, blood was drawn for the measurement of plasma lipids, glucose and 152 153 insulin. Glucose and lipids were determined by standard laboratory methods. Intra-assay 154 and inter-assay coefficients of variation (CV) were less than 4 %. Serum insulin was 155 measured in duplicate using a monoclonal immunoradiometric assay (Medgenix 156 Diagnostics, Fleunes, Belgium). The intra-assay CV was 5.2 % at a concentration of 10 mU/L and 3.4 % at 130 mU/L. The interassay CVs were 6.9 % and 4.5 % at 14 and 89 157 mU/L, respectively. Glycated haemoglobin (HbA1c) was measured by high-pressure 158 159 liquid chromatography using a fully automated glycated haemoglobin analyser system (Hitachi L-9100; Hitachi, Tokyo, Japan). Insulin resistance was determined by the 160 homeostasis model assessment of insulin resistance (HOMA-IR). High sensitive C-161 reactive protein (HsCRP) was determined by ultrasensitive assay (Beckman, Fullerton, 162 CA), with intra-and inter-assay CVs of 4 %. Serum alanine aminotransferase (ALT) and 163 164 aspartate aminotransferase (AST) levels were determined using enzymatic methods.

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166 LIVER HISTOLOGY

Liver biopsies were analysed by a single pathologist expert in hepatic pathology. For each liver sample, haematoxylin and eosin, reticulin, and Masson's trichrome staining were performed. Hepatic steatosis grade was determined according to the scoring system for NAFLD and defined as absent (grade 0: <5% steatosis), mild (grade 1: 5-33% steatosis), moderate (grade 2: >33-66% steatosis) or severe (grade 3: >66% steatosis) [18]. Images were independently evaluated by two radiologists blinded to clinical and laboratory data.

175 ¹H NUCLEAR MAGNETIC RESONANCE (¹H-NMR) METABOLIC 176 PROFILING

Metabolomics analyses have been previously described [17]. Briefly, plasma samples 177 178 were thawed at room temperature and 350 µL aliquots were carefully placed in 5-mm NMR tubes. Then, 150 µL of saline solution (0.9 % NaCl) were added and the mixture 179 was gently vortexed. Spectroscopic analyses were performed on a Bruker DRX600 180 181 spectrometer equipped with either a 5-mm TXI probe operating at 600.13 MHz or a 5-182 mm BBI probe operating at 600.44 MHz. Spectra were acquired using a water suppressed Carr-Purcell-Meiboom-Gill using the Bruker program cpmgpr (RD 90°-(τ-180°-τ) n-183 acquire). A RD of 2 s was employed for net magnetization relaxation, during which noise 184 185 irradiation was applied in order to suppress the large water proton signal. A number of loops n = 100 and a spin-echo delay $\tau = 400 \,\mu s$ was used to allow spectral editing through 186 187 T2 relaxation and therefore attenuation of broad signals. For each sample, 128 scans were recorded in 32K data points with a spectral with of 20 ppm. All NMR spectra were 188 processed using Topspin (Bruker Biospin, UK). Free induction decays were multiplied 189 190 by an exponential function corresponding to a line broadening of 0.3 Hz and Fourier transformed. Spectra were automatically phased, baseline-corrected and referenced to the 191 192 anomeric doublet of glucose (5.23 ppm). The spectra were all then imported to MATLAB 193 and the region around the water resonance (δ =4.5-5.0) was removed.

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195 **TRANSCRIPTOMICS**

Transcriptomic analyses have been previously described [17]. Briefly, RNA from liver
biopsy samples was extracted using standard extraction protocols (TRIzol) by Miltenyi
Biotec as previously reported. RNA quality (gel images, RNA integrity number and
electropherograms) was assessed using an Agilent 2100 Bioanalyzer platform (Agilent

Technologies). An RNA integrity number >6 was considered sufficient for gene 200 201 expression experiments [19]. One-hundred ng of total RNA were used for linear T7-based 202 amplification of RNA for each sample. cDNA was prepared by amplification of the RNA 203 and labelled with Cy3 using the Agilent Low Input Quick Amp Labeling Kit according 204 to the manufacturer's instructions. The amounts of cDNA and dye that were incorporated were measured by an ND-1000 spectrophotometer (NanoDrop Technologies). 205 206 Hybridization of the Agilent Whole Human Genome Oligo Microarrays 4×44 K was 207 done following the Agilent 60-mer oligo microarray processing protocol using the Agilent Gene Expression Hybridization Kit. The fluorescence signals of the hybridized 208 209 Agilent microarrays were detected using Agilent's Microarray Scanner after washing with Agilent Gene Expression Wash Buffer twice and with acetonitrile once. Feature 210 211 intensities were determined using Agilent Feature Extraction Software. Microarray data 212 were processed and normalized using R and the BioConductor package LIMMA (Linear 213 Models for Microarray Data) [20]. Raw data quality was assessed using pseudoMA and 214 box plots. A background correction was applied and normalization of the green channel 215 between arrays was done using 'cyclicloess' between pairs of arrays. Control and low-216 expressed probes were removed and only those probes brighter than the negative controls $(\geq 10\%)$ on at least one array were kept. Batch-corrected data were obtained using 217 218 removeBatchEffect based on 'Batch' [20]. Probes with no associated gene ID were removed. Finally, data were averaged based on an association to a particular gene. 219

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222 HIGH-RESOLUTION ULTRASONOGRAPHY CAROTID EVALUATION

Carotid arteries were assessed using a Siemens Acuson S2000 (Mochida Siemens 223 224 Medical System, Tokyo, Japan) ultrasound system with a 7.5 MHz linear array 225 transducer. Images were independently evaluated by two radiologists blinded to clinical 226 and laboratory data. cIMT values were manually measured in 12 carotid segments: internal (i) and external walls (e) of the right and left common carotid arteries (CCA) in 227 228 a proximal segment (proCCA), in a plaque-free segment 10 mm from the bifurcation 229 (preCCA) and in the internal carotid arteries (ICA). For the left and right arteries, the mean CCA and ICA values for each subject were calculated from these four 230 231 measurements (mRCCA and mLCCA) and two measurement (mRICA and mLICA), respectively. The average of all measurements was reported as overall cIMT (mCA). Sub-232 clinical atherosclerosis was defined as a cut-off value of overall cIMT >0.78 mm [21]. A 233 234 plaque was defined as a focal thickening ≥ 1.2 mm in any of 12 carotid segments (near 235 and far walls of the right and left common carotid arteries, bifurcation and internal carotid 236 artery).

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238 STATISTICAL ANALYSES

239 *Univariate statistics.* Data distribution and normality of variables were checked visually, 240 and using the Kolmogorov-Smirnov and Shapiro-Wilk tests. Baseline characteristics are presented as means ± SEM or as median [interquartile range (IQR)] if the distribution 241 242 was not normal. Baseline differences in laboratory and anthropometric variables were 243 assessed using a *t*-test and a Mann-Whitney U test for normally- and non-normally distributed variables, respectively. Since most variables were found to be skewed, partial 244 245 Spearman's rank correlation was used to test the relationship between clinical variables 246 and APOA1BP, SREBF and NOTCH mRNAs adjusting for age, sex, BMI and country.

Analyses were performed with SPSS software (version 23, IBM SPSS Statistics) and MATLAB R2014a. Levels of statistical significance were set at P < 0.05.

Multivariate statistics. Transcriptomic and metabolomic data multivariate statistics were 249 performed in MATLAB R2014a using in-house scripts. This included principal 250 251 component analysis (PCA) and orthogonal partial least squares (O-PLS) regression on 252 the mean-centered and unit variance-scaled variables. Unsupervised PCA was first 253 applied to visualize the global variance of the data sets to reveal intrinsic similarities, possible confounders, and to identify strong and moderate outliers based on Hotelling's 254 T^2 and distance to the model, respectively. Then, supervised O-PLS regression models 255 256 were built to identify transcriptomic or metabolic features associated with the variables 257 of interest. Here, the omics profiles were used as the descriptor matrix (X) to predict the response variable (Y). Significant features were selected based on the O-PLS regression 258 259 loadings adjusted for multiple testing using the Benjamini-Hochberg procedure for false 260 discovery rate (FDR). A pFDR < 0.05 was used as the reference feature selection criterion. Finally, each individual variable identified form multivariate models was 261 further validated by partial Spearman's correlation adjusting for age, BMI, sex and 262 country. The predictive performance of the model (Q^2Y) was calculated using a leave-263 one-out cross-validation approach and model validity was established by permutation 264 265 testing (1000 permutations).

266

268 **Results**

269 The baseline characteristics of the study participants are shown in Table 1.

270 ASSOCIATIONS OF APOA1BP-SREBF-NOTCH AXIS WITH 271 CARDIOVASCULAR AND HAEMATOLOGICAL PARAMETERS

272 APOA1BP had significant inverse associations with several measures of cIMT, including 273 RICAe, RproCCAi, LpreCCAi, LpreCCAe, mLCCA, mCCA, and mCA thickness 274 (Figure 1a). Conversely, the expression levels of SREBF1 correlated positively with 275 cIMT measures in all segments of the left carotid artery (proximal, pre-bifurcation, 276 internal) and plaque presence. SREBF2 expression only correlated positively with RpreCCAe. Among the Notch receptors isoforms, NOTCH2NL had the strongest 277 278 correlations with cIMT measures. In particular, it had strong correlations with all 279 measures of the right internal carotid artery, whereas the expression levels of NOTCH1 and NOTCH4 were positively correlated with measures in the left carotid artery. Among 280 281 these genes, only SREBF1 had a positive association with the steatosis degree (Figure 282 1b). We also correlated the mean of the 12 CCA segments (mCCA) with the expression of all genes involved in cholesterol metabolism. Notably, SREBF1 was the only gene that 283 correlated positively with mCCA, whereas APOA1BP was amongst those having a 284 285 stronger negative correlation (Figure 1c). Similar results were obtained when mCA was dichotomized based on a subclinical atherosclerosis cut-off >0.78 mm (Supplementary 286 287 Figure 1a).

Given that atherosclerosis is considered a chronic inflammation disease, we examined the associations of atherosclerosis measures with the plasma levels of *N*-acetylglycoproteins (NAG) measured by NMR. NAG is a novel composite biomarker of systemic inflammation that integrates both protein levels and glycosylation states of several of the

most abundant acute phase proteins in serum [22]. As expected, NAG levels correlated 292 positively several cIMT measures (Supplementary Figure 1b). As, atherosclerosis is 293 294 driven by the progressive accumulation of lipids and leukocytes in the arterial wall, we 295 also analysed the association between the expression of the previous genes and lipid and 296 haematological parameters (Figure 1 and Supplementary Figure 1c). Specifically, the expression of APOA1BP correlated negatively with WBC counts (Figure 1d), whereas 297 298 SREBF1 and NOTCH2NL had a positive correlation with RBC (Figure 1e) and WBC 299 (Figure 1f) counts, respectively. The levels of HDL cholesterol (HDL-C) correlated positively with APOA1BP expression (Figure 1g), but negatively with the expression of 300 SREBF1 (Figure 1h). The later also had a positive correlation with the circulating 301 302 triglyceride (TG) concentration (Figure 1i). Total WBC counts, and in particular lymphocytes and monocytes, also correlated positively with several atherosclerosis 303 304 measures (Supplementary Figure 1d).

305 APOA1BP and SREBF ASSOCIATIONS WITH CHOLESTEROL AND NOTCH 306 PATHWAY GENES

307 O-PLS models were built to identify genes involved in the Notch signalling (*n*=79 genes; Supplementary Table 1) and cholesterol synthesis pathways (n=109 genes;308 Supplementary Table 2) associated with APOA1BP, SREBF1, and SREBF2 expression. 309 310 In the case of APOA1BP, significant O-PLS models with a good predictability were obtained for both Notch pathway- (Figure 1j) and cholesterol pathway-associated genes 311 (Figure 1k). Significant genes identified from multivariate O-PLS regression models were 312 313 further validated by partial Spearman's correlation adjusting for age, BMI, sex, and country (Figure 11,m). Remarkably, the expression of all Notch receptors (NOTCH1, 314 315 NOTCH2, NOTCH2NL, NOTCH3, NOTCH4) and Jagged ligands (JAG1, JAG2), but not that of delta-like ligands, was negatively associated with the APOA1BP expression 316

(Figure 11). The expression of APOA1BP was also associated with the expression of 317 cholesterol transporters such as ABCA1 and SCARB1 (Figure 1m). Significant O-PLS 318 models were also obtained for the associations between SREBF1 expression and genes 319 320 from both Notch and cholesterol pathways (Supplementary Figure 2a,b). Notably, after partial Spearman's validation (Supplementary Figure 2c,d), the SREBF1 expression was 321 positively associated with *NOTCH1* and *ABCA1*, which we had found to be negatively 322 associated with APOAB1P. Contrary to SREBF1 results, we did not obtain a significant 323 324 O-PLS between the expression of *SREBF2* and Notch pathway genes ($Q^2Y=-0.21$). Finally, an O-PLS regression model between cholesterol synthesis pathway genes and 325 NOTCH2NL identified a negative association with APOA1BP, whereas ABCA1 had the 326 strongest positive association (Supplementary Figure 2e,f). 327

ASSOCIATIONS OF THE APOA1BP-SREBF-NOTCH AXIS WITH THE SERUM METABOLIC PROFILES

O-PLS regression models were built to identify serum metabolites associated with the 330 expression of APOA1BP, SREBF1, and SREBF2. A significant O-PLS model was 331 332 obtained for the prediction of APOA1BP expression levels from the serum metabolic profile (Figure 2a). Significant identified metabolites (Figure 2b) were further validated 333 by partial Spearman's correlation (Figure 2c). We identified asparagine, glycerol, 334 335 histidine, glycine, choline and citrate as positively associated with the expression of APOA1BP, whereas glyceryl of lipids and very low level cholesterol in VLDL were 336 337 associated negatively. Metabolites associated positively with APOA1BP had negative 338 associations with atherosclerosis measures, particularly LmCCA (Figure 2g-i). We also found a borderline significant negative (r = -0.22, P = 0.051) association between the 339 340 expression of APOA1BP and the inflammatory marker NAG. Metabolome-wide association studies (MWAS) were also performed for the liver expression of SREBF1 and 341

SREBF2 using O-PLS multivariate regressions (Figure 2d,e and Supplementary Figure 342 3a) confirmed by partial Spearman's correlation (Figure 2 f and Supplementary Figure 343 344 3b). As expected, the expression of both genes was positively associated with several 345 lipids. They also had positive associations with inflammatory markers (NAG), branchedchain amino acids (BCAA) (valine, isoleucine) and related catabolites (a-346 ketoisovalerate), lactate and proline. Most of these metabolites had positive correlations 347 with cIMT measures. In particular, BCAA had positive associations with RICAe (Figure 348 349 2j-l), whereas NAG and α -ketoisovalerate had positive associations with mCA (R=0.27, *P*=0.028; and *R*=0.33, *P*=0.006, respectively). 350

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ASSOCIATIONS OF HAEMATOPOIESIS AND LIPIDS WITH THE SERUM METABOLIC PROFILES

354 O-PLS regression models were also constructed to reveal associations between those 355 haematological and lipid parameters associated with the APOA1BP-SREBF-NOTCH axis and the serum metabolome. A significant model with a strong predictive ability (Figure 356 357 3a) was obtained between the serum metabolic profile and the HDL-C levels. After validation of the multivariate-identified metabolites by partial Spearman correlation, 358 metabolites associated with HDL-C were similar to those linked to APOA1BP and 359 360 SREBF1 (Figure 3b). Hence, phosphocholine, choline, glycerol, and glycine, which correlated positively with the expression of APOA1BP, also had a positive correlation 361 with HDL-C. Conversely, several lipids, inflammation-related metabolites (NAG), 362 363 BCAA (valine, isoleucine) and lactate, which were positively associated with SREBF1, had a negative association with the circulating levels of HDL-C. Notably, the expression 364 365 of *NOTCH2NL* correlated negatively with the serum choline and phosphocholine levels

(Figure 3c,d) but positively with the BCAAs leucine and isoleucine (Figure 3e,f). It also 366 had a trend towards a positive association with NAG (r = 0.20, P = 0.07). A significant 367 O-PLS regression model was also obtained between the fasting serum TG levels and the 368 369 serum metabolome (Figure 3g). Patients with higher TG concentrations had higher levels 370 of several lipids, BCAAs and catabolites (isoleucine, α -ketoisovalerate), inflammation-371 related metabolites (NAG), aspartate, proline, and acetone (Figure 3h). As expected, these results agree with those metabolites positively associated with SREBF1. Interestingly, 372 373 several metabolites negatively associated with TG, including glycine, asparagine, phosphocholine, glycerol, and histidine, were found to be positively associated with the 374 expression of APOA1BP. Finally, O-PLS regression models (Figure 3i) confirmed by 375 partial Spearman's correlation (Figure 3j) revealed that serum metabolites positively 376 associated with the leukocyte counts were similar to those associated with the expression 377 378 of SREBF1.

379

380 **Discussion**

Atherosclerosis and its progression is caused by lipid accumulation and local 381 382 inflammation of blood vessels, and is the major underlying cause of CVD. High plasma concentrations of HDL have shown anti-atherogenic potential because HDL carries 383 384 excess cholesterol away from cells. Importantly, human studies have shown that HDL 385 cholesterol efflux capacity, a metric of HDL function that characterizes a key step in RCT, 386 may be athero-protective [1,3]. Recent in vitro and animal studies have shown that AIBP 387 may protect against atherosclerosis [5–8]. Here, we provided evidence for the first time, 388 to our knowledge, in humans of an inverse association between the expression of APOA1BP and atherosclerosis measures. 389

In vitro studies have demonstrated a role of AIBP in promoting cholesterol efflux from 390 391 human umbilical vein endothelial cells to HDL and THP-1-derived macrophages, thereby reducing lipid accumulation [5,6]. Mechanistically, AIBP enhances cholesterol efflux and 392 393 RCT by preventing ABCA1 protein degradation through facilitating its binding to APOA1 on the cell membrane, thereby increasing ABCA1 levels [5]. Growing evidence 394 suggests that ABCA1 protects from atherosclerosis by exporting excess cholesterol from 395 396 cells to poorly lipidated APOA1, which is essential for the biogenesis of nascent HDL in 397 hepatocytes [23]. Recent animals studies have also highlighted the protection of AIBP against atherosclerosis [7,8]. Hence, Apoe^{-/-} mice with established atherosclerosis and 398 399 treated with recombinant adeno-associated virus (rAAV) to overexpress AIBP showed 400 reduction of atherosclerotic plaque size and inflammation but increased circulating HDL levels and RCT to the liver [8]. In the latter model, AIBP was overexpressed in the aorta 401 402 and peritoneal macrophages, but mainly in the liver. The striking increase in ABCA1 403 protein levels in the aortas and peritoneal macrophages of AIBP-treated mice suggests 404 again that the effects of AIBP are mediated through ABCA1. In another animal study, Apoalbp^{-/-}Ldlr^{-/-} mice fed a high-fat, high-cholesterol diet had exacerbated weight gain, 405 liver steatosis, hyperlipidaemia and atherosclerosis compared to Ldlr^{-/-} mice [7]. In 406 addition, AAV-mediated overexpression of AIBP in Ldlr^{-/-} mice protected against weight 407 408 gain, plasma lipid increase and atherosclerosis compared to controls.

In agreement with these results, we found negative associations between *APOA1BP* expression levels and measures of cIMT. Conversely, we found a negative association between the expression levels of *APOA1BP* and *ABCA1*. It is possible that in patients with reduced hepatic *APOA1BP* expression, there is a compensatory response in the expression of *ABCA1* to increase cholesterol efflux in the liver. In addition, although treatment with AIBP increased ABCA1 protein levels in macrophages and *Apoe*-^{/-} mice,

it did not alter the ABCA1 mRNA expression [5,8]. In fact, ABCA1 protein levels and 415 416 mRNA expression are usually discordant as ABCA1 protein levels are regulated by a diverse posttranscriptional mechanism [24]. In contrast to ABCA1, which is important 417 418 for the generation of nascent HDL, scavenger receptor class B member 1 (SR-BI) is a receptor for mature HDL and mediates selective uptake of HDL cholesteryl esters into 419 the liver as the final step in RCT [25]. Consistently, we found a significant association 420 421 between APOA1BP and SCARB1, which encodes the SR-BI protein, which was opposite 422 to the APOA1BP-ABCA1 correlation.

In addition to the ABCA1 transporter pathway, the VLDL-APOB secretion pathway has 423 424 been proposed as the major pathway for the secretion of cholesterol from hepatocytes together with TG into plasma [26]. Interestingly, the VLDL secretion pathway is 425 modulated by SREBP1c [27], encoded by SREBF1, which we found strongly positively 426 427 associated with atherosclerosis. Specifically, SREBF1 correlated with cIMT measures in 428 all segments of the left carotid artery, which is in agreement the higher vulnerability of 429 the left carotid artery to atherosclerosis [28,29]. Hepatic expression of SREBP1c is also 430 increased in hepatic steatosis [30], which is consistent with our results. A recent study in zebrafish has shown that Aibp2-mediated HPSC expansion through the up-regulation of 431 432 Srebf2 (but not Srebf1), which predominantly regulates cholesterol synthesis [14]. 433 Although we mainly found SREBF1 associated with cIMT rather than SREBF2, it is worth noting that SREBF1 is transcribed into two variants: SREBP-1c, which solely regulates 434 435 lipid synthesis, and SREBP-1a, which controls both cholesterol and lipid synthesis. AIBP 436 also seem to modulate Notch signalling in mice and zebrafish [13,14]. In agreement with 437 these results, we found strong associations between the expression of APOA1BP and the expression of all Notch signalling receptors and jagged ligands, but not with delta-like 438 ligands. Interestingly, jagged and delta-like ligands have shown opposite effects on 439

angiogenesis and regulation of T cells [31,32]. Consistent with a higher susceptibility of 440 441 the left carotid artery, we also found that NOTCH1 and NOTCH4 were positively associated with left cIMT measures. Despite these associations, it is particularly 442 443 noticeable that the expression of human-specific gene NOTCH2NL had the strongest associations with atherosclerotic measures. Interestingly, among all genes involved in 444 445 cholesterol metabolism, NOTCH2NL had the strongest positive association with ABCA1, 446 suggesting again a potential upregulation of ABCA1 expression to increase cholesterol 447 efflux in patients with cIMT. Little is known about NOTCH2NL, but it has recently stood out for its ability to enhance Notch signalling and expand human cortical progenitor cells 448 449 [33,34]. Consistent with this link between cholesterol metabolism and haematopoiesis, we found significant associations among the expression of APOA1BP, SREBF1 and 450 451 *NOTCH2NL*, and haematology and lipid parameters.

452 We found that the expression of transcripts APOA1BP, SREBF1, SREBF2 and 453 NOTCH2NL was associated with several plasma metabolites. APOA1BP had positive 454 correlations with three amino acids (asparagine, histidine, glycine), glycerol, choline and 455 citrate. These amino acids were also associated positively with circulating HDL-C levels, but negatively with TG and WBC counts. Glycine, histidine and asparagine were also 456 457 negatively associated with cIMT measures. Of note, among 35 plasma metabolites quantified in 1049 individuals without coronary artery disease (CAD) and diabetes, 458 histidine was most strongly associated with lower risk for incident CAD, followed by 459 460 asparagine [35]. Low circulating levels of glycine have also been causally associated with 461 higher incidence of coronary heart disease [36].

462 *APOA1BP* expression also had a positive association with choline. Remarkably, both 463 choline and phosphocholine levels had very strong positive associations with HDL-C but 464 correlated negatively with the expression of *NOTCH2NL*. There is evidence suggesting a

connection between choline and HDL metabolism. Hence, phosphatidylcholine is the 465 466 major phospholipid component of all plasma lipoproteins and the biosynthesis of phosphatidylcholine in the liver is critical for the synthesis and secretion of HDL and 467 468 VLDL [37]. Interestingly, APOA1BP correlated negatively with the expression of liver enzymes involved in the synthesis of phosphatidylcholine from choline and 469 phosphocholine, suggesting an up-regulation of the synthesis of phosphatidylcholine in 470 471 patients with lower APOA1BP to increase assembly and clearance of lipoproteins. Due to 472 the role of lecithin-cholesterol acyltransferase (LCAT) in the formation of HDL and RCT, we also assessed the relation between the expression levels of APOA1BP and LCAT 473 474 and found a positive association (R=0.27, P=0.01). Interestingly, although studies in the general population gave inconsistent results, patients with LCAT deficiency have shown 475 a significant increase in the incidence of CVD [38]. Despite the associations with 476 477 APOA1BP and HDL, neither choline nor phosphocholine had associations with measures 478 of atherosclerosis. Previous studies have shown inconsistent associations between 479 circulating choline and phosphocholine levels and cardiovascular events. Both 480 metabolites were positively associated with the risk of CVD and stroke after 4.8 years of follow-up in participants at high cardiovascular risk within the PREDIMED study, but no 481 482 associations were found between 1-year changes in these metabolites and the incidence 483 of CVD [39]. Similarly, higher plasma choline levels were associated with increased risk of major cardiac events after 3 years of follow-up in patients undergoing elective 484 diagnostic coronary angiography, but they did not predict risk when trimethylamine N-485 486 oxide, a choline metabolite, was added to the model [40]. In cross-section studies higher plasma choline concentrations have been associated with an unfavourable 487 488 cardiometabolic risk factor profile, including lower HDL levels [41,42]. However, it is worth noting that plasma choline levels do not reflect choline status because disturbances 489

in circulating choline arise early in disease development [43,44] and circulating levels
may depend on lipid overload. In this sense, plasma choline metabolites differed between
normal and overweight men [45]. In addition, both low and high plasma concentrations
may be associated with adverse effects [46].

As expected, the expression levels of SREBF1 and SREBF2 had positive associations with 494 495 several lipids. These genes also correlated positively with circulating levels of BCAA and 496 catabolites, NAG and lactate. Except for lactate, we found that these metabolites were all 497 positively associated with measure of cIMT. Several cross-section and prospective cohort studies revealed positive associations of BCAA with major metabolic disorders [47] and 498 499 recently they have also been positively associated with risk factors of CAD, in particular 500 cIMT [48]. Interestingly, we also found a positive correlation between the expression levels of NOTCH2NL and BCAA. In line with atherosclerosis being a chronic 501 502 inflammatory disorder, we found a consistent association between NAG, a novel marker 503 of chronic inflammation [22], and cIMT measures. Consistently, we found that NAG 504 levels were the strongest predictors of WBC counts, which also had positive associations 505 with BCAA. Supporting the role of the APOA1BP-SREBF-NOTCH axis and inflammation in atherosclerosis, we also found that NAG levels were negatively 506 associated with the expression of APOA1BP, but positively with that of SREBF1, 507 508 SREBF2, and NOTCH2NL. Finally, most of the metabolites associated with SREBF1 and SREBF2 had similar associations with TG, but opposite to those of HDL. 509

The main limitation of our study is its cross-sectional nature. Therefore, we cannot infer cause-effect relationships. Second, the results cannot be extrapolated to the general population, as subjects in the current study were morbidly obese. In addition, we did not measure AIBP protein levels. The strengths of the present work include the use of two independent well-characterized cohorts, which allowed the control for potential confounders, with comprehensive metabolomic, transcriptomic, liver biopsy and cIMTdata.

517 In conclusion, our findings demonstrate, for the first time, an atheroprotective association 518 between the expression levels of *APOA1BP* and atherosclerosis in humans. We have also 519 shown a connection between *APO1ABP*, Notch signalling and inflammation with 520 atherosclerosis.

521

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692 Figure 1. Associations of expression levels of APOA1BP, SREBFs, and NOTCHs gens with cIMT, steatosis, haematology and lipid measures and cholesterol and notch 693 694 pathway genes. a) Heatmap displaying the partial Spearman's correlation coefficients (adjusted for age, BMI, sex, and cohort) between genes and cIMT measures. *p<0.05, 695 **p < 0.01, ***p < 0.001. **b**) Association of expression levels of *SREBF1* with the steatosis 696 697 degree (ANCOVA and Tukey-kramer tests). c) Cholesterol metabolism pathway genes 698 significantly associated with mean CCA based on partial Spearman's correlation adjusted for age, BMI, sex, and cohort. d-i) Scatter plots between expression levels of selected 699 700 genes and haematological and lipid parameters. Partial Spearman's correlation and 701 significance values adjusted for age, BMI, sex, and cohort are shown. j-k) Permutation test for the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-702 703 PLS models between the expression levels of APOA1BP and the expression levels of 704 genes involved in the Notch signalling and cholesterol pathways, respectively. **l-m**) 705 Significant Notch and cholesterol pathway genes associated with APOA1BP after further 706 validation of the O-PLS identified genes by partial Spearman's correlation adjusting for 707 age, sex, BMI, and country.

Figure 2. Associations of metabolomics data with the expression levels of *APOA1BP*,

SREBF1, and cIMT measures. a) Permutation test for the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-PLS models between the expression levels of *APOA1BP* and the serum metabolome. b) Significant serum metabolites obtained from the O-PLS model. Statistically significant metabolites are coloured in red if positively associated with *APOA1BP* and blue if negatively associated. c) Metabolites associated with *APOA1BP* after further validation of the O-PLS identified metabolites by partial Spearman's correlation adjusting for age, sex, BMI, and country. d) Permutation

test for the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-716 PLS models between the expression levels of *SREBF1* and the serum metabolome. e) 717 Significant serum metabolites obtained from the O-PLS model. Statistically significant 718 metabolites are coloured in red if positively associated with SREBF1 and blue if 719 negatively associated. f) Metabolites associated with SREBF1 after further validation of 720 the O-PLS identified metabolites by partial Spearman's correlation adjusting for age, sex, 721 BMI, and country. g-l) Scatter plots between selected metabolites and cIMT measures. 722 723 Partial Spearman's correlation and significance values adjusted for age, BMI, sex, and cohort are shown. 724

Figure 3. Associations of metabolomics data with the lipid parameters, WBC, and 725 **NOTCH2NL** expression levels. a) Permutation test for the goodness-of-fit (R^2Y) and 726 goodness of prediction (Q^2Y) obtained from the O-PLS models between the expression 727 728 levels of HDL-C and the serum metabolome. b) Metabolites associated with HDL-C after further validation of the O-PLS identified metabolites by partial Spearman's correlation 729 730 adjusting for age, sex, BMI, and country. c-f) Scatter plots between selected metabolites 731 and NOTCH2NL expression levels. Partial Spearman's correlation and significance values adjusted for age, BMI, sex, and cohort are shown. g) Permutation test for the 732 goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-PLS models 733 734 between the expression levels of TG and the serum metabolome. h) Metabolites 735 associated with TG after further validation of the O-PLS identified metabolites by partial Spearman's correlation adjusting for age, sex, BMI, and country. i) Permutation test for 736 the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-PLS 737 models between the expression levels of WBC and the serum metabolome. j) Metabolites 738 associated with WBC after further validation of the O-PLS identified metabolites by 739 partial Spearman's correlation adjusting for age, sex, BMI, and country. 740

Supplementary Figure 1. a) Cholesterol metabolism pathway genes significantly 741 associated with mean CA based on partial Spearman's correlation adjusted for age, BMI, 742 743 sex, and cohort. b) Heatmap displaying the partial Spearman's correlations (adjusted for 744 age, BMI, sex, and cohort) between cIMT measures and inflammation measured by NMR plasma levels of N-acetylglycoproteins (NAG). c) Heatmap displaying the partial 745 Spearman's correlation coefficients (adjusted for age, BMI, sex, and cohort) between 746 genes and haematological parameters. d) Heatmap displaying the partial Spearman's 747 748 correlation coefficients (adjusted for age, BMI, sex, and cohort) between haematological parameters and cIMT measures. 749

Supplementary Figure 2. a,b) Permutation test for the goodness-of-fit (R^2Y) and 750 goodness of prediction (Q^2Y) obtained from the O-PLS models between the expression 751 levels of SREBF1 and the expression levels of genes involved in Notch signalling and 752 753 cholesterol synthesis pathways, respectively. c,d) Significant Notch signalling and 754 cholesterol pathway genes associated with SREBF1 after further validation of the O-PLS 755 identified genes by partial Spearman's correlation adjusting for age, sex, BMI, and 756 country, respectively. e) Permutation test for the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-PLS models between the expression levels of 757 NOTCH2NL and the expression levels of genes involved in cholesterol synthesis 758 pathway. f) Significant cholesterol pathway genes associated with NOTCH2NL after 759 760 further validation of the O-PLS identified genes by partial Spearman's correlation adjusting for age, sex, BMI, and country. 761

Supplementary Figure 3. a) Permutation test for the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-PLS models between the expression levels of *SREBF2* and the serum metabolome. b) Significant serum metabolites obtained from the O-PLS model. Statistically significant metabolites are coloured in red if positively

- associated with *SREBF2* and blue if negatively associated. **c**) Metabolites associated with
- 767 SREBF2 after further validation of the O-PLS identified metabolites by partial
- 768 Spearman's correlation adjusting for age, sex, BMI, and country
| Variables | All (<i>n</i> =78) |
|---------------------------|---------------------|
| Age (years) | 42.4 ± 1.16 |
| $BMI (kg/m^2)$ | 46.2 (42.4-51.1) |
| Waist circumference (cm) | 127.0 (119.5-138.0) |
| Sex (women, %) | 79.2 |
| SBP (mmHg) | 134.0 (122.5-144.0) |
| DBP (mmHg) | 81.0 (75.0-90.0) |
| Riachamistry | |
| Glucose(mg/dL) | 95.0 (88.5-101.5) |
| HOMA-IR | 4 50 (2 95-6 90) |
| Triglycerides (mg/dL) | 1120(2.95-0.90) |
| Total cholesterol (mg/dL) | 1975 ± 46 |
| LDL cholesterol (mg/dL) | 131.0 ± 4.0 |
| HDL cholesterol (mg/dL) | 45.0 (40.0-51.2) |
| | 15.0 (10.0 51.2) |
| Haematology | 150.0 (100.0.000.0) |
| Eosinophils | 150.0 (100.0-200.0) |
| Neutrophils | 4810 (3665-5795) |
| Lymphocytes | 2360 ± 86.9 |
| Monocytes | 500 (420-600) |
| | /350 (6385-9030) |
| KBC | 4.00 (4.40-4.91) |
| Liver | |
| HsCRP | 0.88 (0.47-1.39) |
| AST | 19.0 (15.0-28.0) |
| ALT | 30.0 (22.0-43.5) |
| Steatosis grade (%): | |
| Grade 0 | 15.6 |
| Grade 1 | 33.8 |
| Grade 2 | 24.7 |
| Grade 3 | 26.0 |
| Atherosclerosis | |
| RproCCAi | 0.70 (0.60-0.80) |
| RproCCAe | 0.70 (0.60-0.80) |
| RpreCCAi | 0.79 ± 0.03 |
| RpreCCAe | 0.72 (0.60-0.80) |
| RICAi | 0.70 (0.60-0.90) |
| RICAe | 0.70 (0.54-0.85) |
| mRCCA | 0.73 ± 0.02 |
| mRICA | 0.71 ± 0.02 |
| LproCCAi | 0.70 (0.60-0.85) |
| LproCCAe | 0.69 (0.60-0.80) |
| LpreCCAi | 0.80 (0.70-1.0) |
| LpreCCAe | 0.84 ± 0.03 |
| LICAI | 0.77 (0.57-0.90) |
| LICAe | 0.70 (0.60-0.87) |
| mlcca | 0.76 ± 0.02 |
| mLICA | 0.73 ± 0.03 |
| mCCA | 0.74 ± 0.02 |
| mCA | 0.75 ± 0.02 |

Table 1. Baseline characteristics of participants.

Values are expressed as means ± SEM for normally distributed variables and median [IQR] for non-normally distributed variables. ALT, alanine aminotransferase; AST, aspartate aminotransferase; HsCRP, high sensitivity

- 774 775 C-reactive protein; e, external; i, internal; ICA, internal carotid artery; L, left; m, mean; preCCA, pre bifurcation common carotid artery; proCCA, proximal segment common carotid artery; R, right; RBC, red blood cells; WBC, white blood cells.

1	The APOA1BP-SREBF-NOTCH axis is associated with
2	reduced atherosclerosis risk <u>in morbidly obese patients</u>
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5	
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36	Running title: APOA1BP-SREBF-NOTCH axis and atherosclerosis risk
37	-
38	Keywords: apolipoprotein A1 binding protein, APOA1BP, NOTCH, SREBF,
39	atherosclerosis, inflammation, haematopoiesis, liver

41 Abbreviations

AAV, adeno-associated virus; ABCA1, ATP-binding cassette transporter A1; AIBP, 42 apolipoprotein A-I binding protein; APOA1, apolipoprotein A1; ALT, alanine 43 aminotransferase; AST, aspartate aminotransferase; BCAA, branched-chain amino acids; 44 CCA; common carotid arteries; cIMT, carotid intima-media thickness; CAD, coronary 45 artery disease; HbA1c, glycated haemoglobin; HDL, high-density lipoprotein; HOMA-46 IR, homeostasis model assessment of insulin resistance; HPSC, hematopoietic progenitor 47 and stem cells; HsCRP, high sensitive C-reactive protein; ICA, internal carotid arteries; 48 LCAT, lecithin-cholesterol acyltransferase; MWAS, metabolite-wide association studies; 49 NAG, N-acetylglycoproteins; O-PLS, orthogonal partial least squares; PCA, principal 50 51 component analysis; preCCA, pre bifurcation common carotid arteries; proCCA, 52 proximal segment common carotid arteries; RBC, red blood cells; RCT, reverse cholesterol transport; SR-BI; scavenger receptor class B member 1; TG, triglycerides; 53

2

54 WBC, white blood cells

55 Abstract

56 **Background & Aims:** Atherosclerosis is characterized by an inflammatory disease 57 linked to excessive lipid accumulation in the artery wall. The Notch signalling pathway 58 has been shown to play a key regulatory role in the regulation of inflammation. Recently, 59 *in vitro* and pre-clinical studies have shown that apolipoprotein A-I binding protein 60 (AIBP) regulates cholesterol metabolism (SREBP) and NOTCH signalling 61 (haematopoiesis) and may be protective against atherosclerosis, but the evidence in 62 humans is scarce.

63 **Methods:** We evaluated the *APOA1BP-SREBF-NOTCH* axis in association with 64 atherosclerosis in two well-characterized cohorts of morbidly obese patients (n = 78) 65 within the FLORINASH study, including liver transcriptomics, ¹H-NMR plasma 66 metabolomics, high-resolution ultrasonography evaluating carotid intima-media 67 thickness (cIMT), and haematological parameters.

Results: The liver expression levels of APOA1BP were associated with lower cIMT and 68 69 leukocyte counts, a better plasma lipid profile and higher circulating levels of metabolites associated with lower risk of atherosclerosis (glycine, histidine and asparagine). 70 71 Conversely, liver SREBF and NOTCH mRNAs were positively associated with atherosclerosis, liver steatosis, an unfavourable lipid profile, higher leukocytes and 72 increased levels of metabolites linked to inflammation and CVD such as branched-chain 73 74 amino acids and glycoproteins. APOA1BP and NOTCH signalling also had a strong association, as revealed by the negative correlations among APOA1BP expression levels 75 and those of all NOTCH receptors and jagged ligands. 76

- 77 Conclusions: We here provide the first evidence in human liver of the putative
- 78 APOA1BP-SREBF-NOTCH axis signalling pathway and its association with

79 atherosclerosis and inflammation.

80 Atherosclerosis is the major cause of cardiovascular disease (CVD), the leading cause of 81 death worldwide. Several studies have shown the anti-atherogenic potential of the highdensity lipoprotein (HDL)-mediated reverse cholesterol transport (RCT) [1]. In this 82 83 process, excess cholesterol is transported from macrophages and peripheral tissues back 84 to the liver for excretion. A critical part of RCT is cholesterol efflux, in which intracellular cholesterol is released and collected by apolipoprotein A1 (APOA1), the major 85 component of HDL [2]. In fact, the cholesterol efflux potential of HDL is a better 86 predictor of CVD than circulating HDL levels [3]. The ATP-binding cassette transporter 87 A1 (ABCA1), a cell-membrane protein, is the major transporter that mediates this 88 89 assembly of cholesterol with APOA1, which is the rate-limiting step in the formation of nascent HDLs. 90

91 The APOA1 binding protein (AIBP), encoded by APOA1BP in humans, is a secreted 92 protein physically associated with APOA1 [4] that enhances cholesterol efflux in vitro 93 from macrophages [5] and endothelial cells [6] in the presence of APOA1 or HDL, partly by facilitating apoA1 binding to ABCA1 and preventing ABCA1 degradation [5]. 94 Recently, AIBP has shown to protect against atherosclerosis in vivo in Apoe^{-/-} and Ldlr^{-/-} 95 96 mice by promoting cholesterol efflux and ameliorating inflammation [7,8]. Human APOA1BP mRNA is ubiquitously expressed and abundant in most human secretory 97 organs, with the highest expression in kidney, heart, liver, thyroid gland, adrenal gland, 98 99 and testis [4]. It is of note that kidney and liver are the major sites of APOA1 catabolism.

Atherosclerosis is characterized by progressive accumulation of lipids and leukocytes in the intima layer of the arterial wall. It is considered a chronic inflammation disease with monocytes/macrophages, the main immune cells of the innate immune response, playing a major role in all stages of atherosclerosis [9]. Notably, the Notch pathway is wellrecognized as a major regulator of cell fate in stem cells and the differentiation of the various cell types of the immune system [10]. Recently, the Notch signalling pathway
was shown to play an important role in the onset and progression of atherosclerosis by
promoting inflammation through induction of a pro-inflammatory M1 phenotype in
macrophages, a switch towards a Th-1 like inflammatory phenotype in differentiated
regulatory T cells, and promoting CD8 cytotoxic T cells [11].

Recent evidence suggests a control of hematopoietic progenitor and stem cells (HPSC) 110 by cholesterol pathways [12], thereby linking haematopoiesis with atherosclerosis. 111 112 Interestingly, a connection between AIBP-mediated cholesterol metabolism and Notch signalling has been described recently. AIBP was shown to regulate Notch signalling 113 through relocalization of γ -secretase from lipid to non-lipid rafts in mice [13] and 114 zebrafish Aibp2-mediated cholesterol efflux was shown to active endothelial Srebp2, 115 116 which in turn trans-activates Notch and promotes HSPC emergence. These observations suggest a role for the AIBP-SREBP-NOTCH axis in atherosclerosis [14]. Although the 117 bone marrow is the primary site of haematopoiesis in adults, the liver is the main site 118 during prenatal development and hepatic haematopoiesis is believed to persist into 119 120 adulthood [15,16].

No study has, to date, addressed the potential association between AIBP and Notch signalling in humans. Here, we studied this connection in two well-characterized cohorts of morbidly obese patients recruited to the FLORINASH study (17) combining hepatic transcriptome, plasma metabolome, and carotid intima-media thickness (cIMT) measures.

127 Subjects and Methods

128 STUDY POPULATION AND SAMPLE COLLECTION

The study population (n = 78) included two cohorts of morbidly obese patients aged 22 129 to 61 years old recruited at the Endocrinology Service of the Hospital Universitari de 130 Girona Dr Josep Trueta (Girona, Spain, n = 32) and at the Center for Atherosclerosis of 131 Policlinico Tor Vergata University of Rome (Rome, Italy, n = 46), as part of the 132 FLORINASH study [17]. All subjects gave written informed consent, which was 133 134 validated and approved by the ethical committees of the Hospital Universitari Dr Josep Trueta (Comitè d'Ètica d'Investigació Clínica, approval number 2009 046) and 135 Policlinico Tor Vergata University of Rome (Comitato Etico Indipendente, approval 136 137 number 28-05-2009). Inclusion criteria included Caucasian origin, stable body weight 3 months before the study, free of any infection one month preceding the study and absence 138 139 of any systemic disease. Exclusion criteria included presence of liver disease and thyroid 140 dysfunction, alcohol consumption (> 20 g/day), hepatitis B, drug-induced liver injury, 141 and dyslipidaemia medication. Plasma samples were obtained during the week before elective gastric bypass surgery, during which a liver biopsy was sampled. All samples 142 143 were stored at -80 °C. Liver samples were collected in RNAlater, fragmented and immediately flash frozen in liquid nitrogen before storage at -80 °C. 144

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146 ANTHROPOMETRIC AND LABORATORY MEASUREMENTS

Blood pressure was measured using a blood pressure monitor (Hem-703C, Omron, Barcelona, Spain), with the subject seated and after 5 min of rest. Three readings were obtained and the mean value was used in the analyses. Waist circumference was measured with a soft tape midway between the lowest rib and the iliac crest. Obesity was considered as a body mass index (BMI) \geq 30 kg/m².

After 8 h fasting, blood was drawn for the measurement of plasma lipids, glucose and 152 153 insulin. Glucose and lipids were determined by standard laboratory methods. Intra-assay and inter-assay coefficients of variation (CV) were less than 4 %. Serum insulin was 154 155 measured in duplicate using a monoclonal immunoradiometric assay (Medgenix Diagnostics, Fleunes, Belgium). The intra-assay CV was 5.2 % at a concentration of 10 156 mU/L and 3.4 % at 130 mU/L. The interassay CVs were 6.9 % and 4.5 % at 14 and 89 157 mU/L, respectively. Glycated haemoglobin (HbA1c) was measured by high-pressure 158 liquid chromatography using a fully automated glycated haemoglobin analyser system 159 (Hitachi L-9100; Hitachi, Tokyo, Japan). Insulin resistance was determined by the 160 161 homeostasis model assessment of insulin resistance (HOMA-IR). High sensitive Creactive protein (HsCRP) was determined by ultrasensitive assay (Beckman, Fullerton, 162 CA), with intra-and inter-assay CVs of 4 %. Serum alanine aminotransferase (ALT) and 163 164 aspartate aminotransferase (AST) levels were determined using enzymatic methods.

165

166 LIVER HISTOLOGY

Liver biopsies were analysed by a single pathologist expert in hepatic pathology. For each liver sample, haematoxylin and eosin, reticulin, and Masson's trichrome staining were performed. Hepatic steatosis grade was determined according to the scoring system for NAFLD and defined as absent (grade 0: <5% steatosis), mild (grade 1: 5-33% steatosis), moderate (grade 2: >33-66% steatosis) or severe (grade 3: >66% steatosis) [18]. Images were independently evaluated by two radiologists blinded to clinical and laboratory data.

¹⁷⁵ ¹H NUCLEAR MAGNETIC RESONANCE (¹H-NMR) METABOLIC ¹⁷⁶ PROFILING

Metabolomics analyses have been previously described [17]. Briefly, plasma samples 177 were thawed at room temperature and 350 µL aliquots were carefully placed in 5-mm 178 NMR tubes. Then, 150 μL of saline solution (0.9 % NaCl) were added and the mixture 179 was gently vortexed. Spectroscopic analyses were performed on a Bruker DRX600 180 spectrometer equipped with either a 5-mm TXI probe operating at 600.13 MHz or a 5-181 mm BBI probe operating at 600.44 MHz. Spectra were acquired using a water suppressed 182 Carr-Purcell-Meiboom-Gill using the Bruker program cpmgpr (RD 90°-(τ -180°- τ) n-183 acquire). A RD of 2 s was employed for net magnetization relaxation, during which noise 184 185 irradiation was applied in order to suppress the large water proton signal. A number of 186 loops n = 100 and a spin-echo delay $\tau = 400 \,\mu s$ was used to allow spectral editing through T2 relaxation and therefore attenuation of broad signals. For each sample, 128 scans were 187 recorded in 32K data points with a spectral with of 20 ppm. All NMR spectra were 188 189 processed using Topspin (Bruker Biospin, UK). Free induction decays were multiplied 190 by an exponential function corresponding to a line broadening of 0.3 Hz and Fourier transformed. Spectra were automatically phased, baseline-corrected and referenced to the 191 192 anomeric doublet of glucose (5.23 ppm). The spectra were all then imported to MATLAB 193 and the region around the water resonance (δ =4.5-5.0) was removed.

194

195 TRANSCRIPTOMICS

Transcriptomic analyses have been previously described [17]. Briefly, RNA from liver
biopsy samples was extracted using standard extraction protocols (TRIzol) by Miltenyi
Biotec as previously reported. RNA quality (gel images, RNA integrity number and
electropherograms) was assessed using an Agilent 2100 Bioanalyzer platform (Agilent

200 Technologies). An RNA integrity number >6 was considered sufficient for gene 201 expression experiments [19]. One-hundred ng of total RNA were used for linear T7-based amplification of RNA for each sample. cDNA was prepared by amplification of the RNA 202 203 and labelled with Cy3 using the Agilent Low Input Quick Amp Labeling Kit according to the manufacturer's instructions. The amounts of cDNA and dye that were incorporated 204 205 were measured by an ND-1000 spectrophotometer (NanoDrop Technologies). Hybridization of the Agilent Whole Human Genome Oligo Microarrays 4 × 44K was 206 done following the Agilent 60-mer oligo microarray processing protocol using the 207 Agilent Gene Expression Hybridization Kit. The fluorescence signals of the hybridized 208 209 Agilent microarrays were detected using Agilent's Microarray Scanner after washing with Agilent Gene Expression Wash Buffer twice and with acetonitrile once. Feature 210 intensities were determined using Agilent Feature Extraction Software. Microarray data 211 212 were processed and normalized using R and the BioConductor package LIMMA (Linear Models for Microarray Data) [20]. Raw data quality was assessed using pseudoMA and 213 box plots. A background correction was applied and normalization of the green channel 214 between arrays was done using 'cyclicloess' between pairs of arrays. Control and low-215 216 expressed probes were removed and only those probes brighter than the negative controls (≥ 10%) on at least one array were kept. Batch-corrected data were obtained using 217 218 removeBatchEffect based on 'Batch' [20]. Probes with no associated gene ID were removed. Finally, data were averaged based on an association to a particular gene. 219

220

222 HIGH-RESOLUTION ULTRASONOGRAPHY CAROTID EVALUATION

223 Carotid arteries were assessed using a Siemens Acuson S2000 (Mochida Siemens Medical System, Tokyo, Japan) ultrasound system with a 7.5 MHz linear array 224 225 transducer. Images were independently evaluated by two radiologists blinded to clinical 226 and laboratory data. cIMT values were manually measured in 12 carotid segments: internal (i) and external walls (e) of the right and left common carotid arteries (CCA) in 227 a proximal segment (proCCA), in a plaque-free segment 10 mm from the bifurcation 228 (preCCA) and in the internal carotid arteries (ICA). For the left and right arteries, the 229 mean CCA and ICA values for each subject were calculated from these four 230 231 measurements (mRCCA and mLCCA) and two measurement (mRICA and mLICA), respectively. The average of all measurements was reported as overall cIMT (mCA). Sub-232 clinical atherosclerosis was defined as a cut-off value of overall cIMT >0.78 mm [21]. A 233 234 plaque was defined as a focal thickening ≥ 1.2 mm in any of 12 carotid segments (near and far walls of the right and left common carotid arteries, bifurcation and internal carotid 235 236 artery).

237

238 STATISTICAL ANALYSES

Univariate statistics. Data distribution and normality of variables were checked visually, 239 240 and using the Kolmogorov-Smirnov and Shapiro-Wilk tests. Baseline characteristics are presented as means \pm SEM or as median [interquartile range (IQR)] if the distribution 241 was not normal. Baseline differences in laboratory and anthropometric variables were 242 assessed using a t-test and a Mann-Whitney U test for normally- and non-normally 243 distributed variables, respectively. Since most variables were found to be skewed, partial 244 Spearman's rank correlation was used to test the relationship between clinical variables 245 and APOA1BP, SREBF and NOTCH mRNAs adjusting for age, sex, BMI and country. 246

Analyses were performed with SPSS software (version 23, IBM SPSS Statistics) and
MATLAB R2014a. Levels of statistical significance were set at *P* < 0.05.

Multivariate statistics. Transcriptomic and metabolomic data multivariate statistics were 249 performed in MATLAB R2014a using in-house scripts. This included principal 250 component analysis (PCA) and orthogonal partial least squares (O-PLS) regression on 251 the mean-centered and unit variance-scaled variables. Unsupervised PCA was first 252 applied to visualize the global variance of the data sets to reveal intrinsic similarities, 253 possible confounders, and to identify strong and moderate outliers based on Hotelling's 254 255 T^2 and distance to the model, respectively. Then, supervised O-PLS regression models 256 were built to identify transcriptomic or metabolic features associated with the variables of interest. Here, the omics profiles were used as the descriptor matrix (X) to predict the 257 258 response variable (Y). Significant features were selected based on the O-PLS regression 259 loadings adjusted for multiple testing using the Benjamini-Hochberg procedure for false discovery rate (FDR). A pFDR < 0.05 was used as the reference feature selection 260 criterion. Finally, each individual variable identified form multivariate models was 261 262 further validated by partial Spearman's correlation adjusting for age, BMI, sex and country. The predictive performance of the model (Q^2Y) was calculated using a leave-263 one-out cross-validation approach and model validity was established by permutation 264 265 testing (1000 permutations).

266

268 **Results**

269 The baseline characteristics of the study participants are shown in Table 1.

270ASSOCIATIONSOFAPOA1BP-SREBF-NOTCHAXISWITH271CARDIOVASCULAR AND HAEMATOLOGICAL PARAMETERS

272 APOA1BP had significant inverse associations with several measures of cIMT, including RICAe, RproCAAiRproCCAi, LpreCCAi, LpreCCAe, mLCCA, mCCA, and mCA 273 274 thickness (Figure 1a). Conversely, the expression levels of SREBF1 correlated positively with cIMT measures in all segments of the left carotid artery (proximal, pre-bifurcation, 275 internal) and plaque presence. SREBF2 expression only correlated positively with 276 RpreCCAe. Among the Notch receptors isoforms, NOTCH2NL had the strongest 277 correlations with cIMT measures. In particular, it had strong correlations with all 278 measures of the right internal carotid artery, whereas the expression levels of NOTCH1 279 280 and NOTCH4 were positively correlated with measures in the left carotid artery. Among these genes, only SREBF1 had a positive association with the steatosis degree (Figure 281 1b). We also correlated the mean of the 12 CCA segments (mCCA) with the expression 282 283 of all genes involved in cholesterol metabolism. Notably, SREBF1 was the only gene that correlated positively with mCCA, whereas APOA1BP was amongst those having a 284 stronger negative correlation (Figure 1c). Similar results were obtained when mCA was 285 dichotomized based on a subclinical atherosclerosis cut-off >0.78 mm (Supplementary 286 Figure 1a). 287

<u>Given that atherosclerosis is considered a chronic inflammation disease, we examined the</u>
 <u>associations of atherosclerosis measures with the plasma levels of *N*-acetylglycoproteins
 (NAG) measured by NMR. NAG is a novel composite biomarker of systemic
 inflammation that integrates both protein levels and glycosylation states of several of the
</u>

292 most abundant acute phase proteins in serum [22]. As expected, NAG levels correlated 293 positively several cIMT measures (Supplementary Figure 1b). As, Aatherosclerosis is characterized-driven by the progressive accumulation of lipids and leukocytes in the 294 295 arterial wall, .- Therefore, we also analysed the association between the expression of the 296 previous genes and lipid and haematological parameters (Figure 1 and Supplementary Figure 1c). Specifically, Tthe expression of APOA1BP correlated negatively with WBC 297 counts (Figure 1d), whereas SREBF1 and NOTCH2NL had a positive correlation with 298 RBC (Figure 1e) and WBC (Figure 1f) counts, respectively. The levels of HDL 299 cholesterol (HDL-C) correlated positively with APOA1BP expression (Figure 1g), but 300 301 negatively with the expression of SREBF1 (Figure 1h). The later also had a positive correlation with the circulating triglyceride (TG) concentration (Figure 1i). Total WBC 302 303 counts, and in particular lymphocytes and monocytes, also correlated positively with 304 several atherosclerosis measures (Supplementary Figure 1d).

APOA1BP and SREBF ASSOCIATIONS WITH CHOLESTEROL AND NOTCH PATHWAY GENES

O-PLS models were built to identify genes involved in the Notch signalling (n=79 genes; 307 Supplementary Table 1) and cholesterol synthesis pathways (n=109 genes; 308 309 Supplementary Table 2) associated with APOA1BP, SREBF1, and SREBF2 -expression. In the case of APOA1BP, Ssignificant O-PLS models with a good predictability were 310 obtained for both Notch pathway- (Figure 1j) and cholesterol pathway-associated genes 311 312 (Figure 1k). Significant genes identified from multivariate O-PLS regression models were 313 further validated by partial Spearman's correlation adjusting for age, BMI, sex, and country (Figure 11,m). Remarkably, the expression of all Notch receptors (NOTCH1, 314 NOTCH2, NOTCH2NL, NOTCH3, NOTCH4) and Jagged ligands (JAG1, JAG2), but not 315 that of delta-like ligands, was negatively associated with the APOA1BP expression 316

317	(Figure 11). The expression of APOA1BP was also associated with the expression of
318	cholesterol transporters such as ABCA1 and SCARB1 (Figure 1m). Significant O-PLS
319	models were also obtained for the associations between SREBF1 expression and genes
320	from both Notch and cholesterol pathways (Supplementary Figure 2a,b). Notably, after
321	partial Spearman's validation (Supplementary Figure 2c,d), the SREBF1 expression was
322	positively associated with NOTCH1 and ABCA1, which we had found to be negatively
323	associated with APOAB1P. Contrary to SREBF1 results, we did not obtain a significant
324	O-PLS between the expression of SREBF2 and Notch pathway genes (Q ² Y=-0.21).
325	Finally, Aan O-PLS regression model between cholesterol synthesis pathway genes and
326	NOTCH2NL identified a negative association with APOA1BP, whereas ABCA1 had the
327	strongest positive association (Supplementary Figure 2 <u>e,f</u>).

ASSOCIATIONS OF THE *APOA1BP-SREBF-NOTCH* AXIS WITH THE SERUM METABOLIC PROFILES

O-PLS regression models were built to identify serum metabolites associated with the 330 expression of APOA1BP, SREBF1, and SREBF2. A significant O-PLS model was 331 obtained for the prediction of APOA1BP expression levels from the serum metabolic 332 profile (Figure 2a). Significant identified metabolites (Figure 2b) were further validated 333 by partial Spearman's correlation (Figure 2c). We identified asparagine, glycerol, 334 histidine, glycine, choline and citrate as positively associated with the expression of 335 APOA1BP, whereas glyceryl of lipids and very low level cholesterol in VLDL were 336 associated negatively. Metabolites associated positively with APOA1BP had negative 337 associations with atherosclerosis measures, particularly LmCCA (Figure 2g-i). We also 338 found a borderline significant negative (r = -0.22, P = 0.051) association between the 339 expression of APOA1BP and the inflammatory marker NAG. Metabolome-wide 340 association studies (MWAS) were also performed for the liver expression of SREBF1 and 341

SREBF2 using O-PLS multivariate regressions (Figure 2d,e and Supplementary Figure 342 343 3a) confirmed by partial Spearman's correlation (Figure 2 f and Supplementary Figure 3b). As expected, the expression of both genes was positively associated with several 344 345 lipids. They also had positive associations with inflammatory markers [Nacetylglycoproteins (NAG)], branched-chain amino acids (BCAA) (valine, isoleucine) 346 and related catabolites (α -ketoisovalerate), lactate and proline. Most of these metabolites 347 had positive correlations with cIMT measures. In particular, BCAA had positive 348 associations with RICAe (Figure 2j-l), whereas NAG and α -ketoisovalerate had positive 349 associations with mCA (R=0.27, P=0.028; and R=0.33, P=0.006, respectively). 350

351

ASSOCIATIONS OF HAEMATOPOIESIS AND LIPIDS WITH THE SERUM METABOLIC PROFILES

354 O-PLS regression models were also constructed to reveal associations between those haematological and lipid parameters associated with the APOA1BP-SREBF-NOTCH axis 355 and the serum metabolome. A significant model with a strong predictive ability (Figure 356 357 3a) was obtained between the serum metabolic profile and the HDL-C levels. After validation of the multivariate-identified metabolites by partial Spearman correlation, 358 metabolites associated with HDL-C were similar to those linked to APOA1BP and 359 SREBF1 (Figure 3b). Hence, phosphocholine, choline, glycerol, and glycine, which 360 correlated positively with the expression of APOA1BP, also had a positive correlation 361 with HDL-C. Conversely, several lipids, inflammation-related metabolites (NAG), 362 BCAA (valine, isoleucine) and lactate, which were positively associated with SREBF1, 363 had a negative association with the circulating levels of HDL-C. Notably, the expression 364 365 of NOTCH2NL correlated negatively with the serum choline and phosphocholine levels 366 (Figure 3c,d) but positively with the BCAAs leucine and isoleucine (Figure 3e,f). It also 367 had a trend towards a positive association with NAG (r = 0.20, P = 0.07). A significant O-PLS regression model was also obtained between the fasting serum TG levels and the 368 369 serum metabolome (Figure 3g). Patients with higher TG concentrations had higher levels 370 of several lipids, BCAAs and catabolites (isoleucine, a-ketoisovalerate), inflammationrelated metabolites (NAG), aspartate, proline, and acetone (Figure 3h). As expected, these 371 results agree with those metabolites positively associated with SREBF1. Interestingly, 372 several metabolites negatively associated with TG, including glycine, asparagine, 373 phosphocholine, glycerol, and histidine, were found to be positively associated with the 374 375 expression of APOA1BP. Finally, O-PLS regression models (Figure 3i) confirmed by partial Spearman's correlation (Figure 3j) revealed that serum metabolites positively 376 associated with the leukocyte counts were similar to those associated with the expression 377 378 of SREBF1.

379

380 Discussion

381 Atherosclerosis and its progression is caused by lipid accumulation and local 382 inflammation of blood vessels, and is the major underlying cause of CVD. High plasma concentrations of HDL have shown anti-atherogenic potential because HDL carries 383 excess cholesterol away from cells. Importantly, human studies have shown that HDL 384 cholesterol efflux capacity, a metric of HDL function that characterizes a key step in RCT, 385 may be athero-protective [1,3]. Recent in vitro and animal studies have shown that AIBP 386 may protect against atherosclerosis [5-8]. Here, we provided evidence for the first time, 387 to our knowledge, in humans of an inverse association between the expression of 388 APOA1BP and atherosclerosis measures. 389

In vitro studies have demonstrated a role of AIBP in promoting cholesterol efflux from 390 391 human umbilical vein endothelial cells to HDL and THP-1-derived macrophages, thereby reducing lipid accumulation [5,6]. Mechanistically, AIBP enhances cholesterol efflux and 392 393 RCT by preventing ABCA1 protein degradation through facilitating its binding to 394 APOA1 on the cell membrane, thereby increasing ABCA1 levels [5]. Growing evidence suggests that ABCA1 protects from atherosclerosis by exporting excess cholesterol from 395 cells to poorly lipidated APOA1, which is essential for the biogenesis of nascent HDL in 396 hepatocytes [23]. Recent animals studies have also highlighted the protection of AIBP 397 against atherosclerosis [7,8]. Hence, Apoe^{-/-} mice with established atherosclerosis and 398 399 treated with recombinant adeno-associated virus (rAAV) to overexpress AIBP showed reduction of atherosclerotic plaque size and inflammation but increased circulating HDL 400 401 levels and RCT to the liver [8]. In the latter model, AIBP was overexpressed in the aorta 402 and peritoneal macrophages, but mainly in the liver. The striking increase in ABCA1 protein levels in the aortas and peritoneal macrophages of AIBP-treated mice suggests 403 again that the effects of AIBP are mediated through ABCA1. In another animal study, 404 Apoalbp^{-/-}Ldlr^{-/-} mice fed a high-fat, high-cholesterol diet had exacerbated weight gain, 405 liver steatosis, hyperlipidaemia and atherosclerosis compared to Ldlr^{-/-} mice [7]. In 406 addition, AAV-mediated overexpression of AIBP in Ldlr^{-/-} mice protected against weight 407 408 gain, plasma lipid increase and atherosclerosis compared to controls.

In agreement with these results, we found negative associations between *APOA1BP* expression levels and measures of cIMT. Conversely, we found a negative association between the expression levels of *APOA1BP* and *ABCA1*. It is possible that in patients with reduced hepatic *APOA1BP* expression, there is a compensatory response in the expression of *ABCA1* to increase cholesterol efflux in the liver. In addition, although treatment with AIBP increased ABCA1 protein levels in macrophages and *Apoe^{-/-}* mice,

it did not alter the ABCA1 mRNA expression [5,8]. In fact, ABCA1 protein levels and 415 416 mRNA expression are usually discordant as ABCA1 protein levels are regulated by a diverse posttranscriptional mechanism [24]. In contrast to ABCA1, which is important 417 for the generation of nascent HDL, scavenger receptor class B member 1 (SR-BI) is a 418 receptor for mature HDL and mediates selective uptake of HDL cholesteryl esters into 419 the liver as the final step in RCT [25]. Consistently, we found a significant association 420 between APOA1BP and SCARB1, which encodes the SR-BI protein, which was opposite 421 to the APOA1BP-ABCA1 correlation. 422

In addition to the ABCA1 transporter pathway, the VLDL-APOB secretion pathway has 423 been proposed as the major pathway for the secretion of cholesterol from hepatocytes 424 425 together with TG into plasma [26]. Interestingly, the VLDL secretion pathway is modulated by SREBP1c [27], encoded by SREBF1, which we found strongly positively 426 associated with atherosclerosis. Specifically, SREBF1 correlated with cIMT measures in 427 428 all segments of the left carotid artery, which is in agreement the higher vulnerability of the left carotid artery to atherosclerosis [28,29]. - Hepatic expression of SREBP1c is also 429 430 increased in hepatic steatosis [30], which is consistent with our results. A recent study in 431 zebrafish has shown that Aibp2-mediated HPSC expansion through the up-regulation of Srebf2 (but not Srebf1), which predominantly regulates cholesterol synthesis [14]. 432 Although we mainly found SREBF1 associated with cIMT rather than SREBF2, it is worth 433 434 noting that SREBF1 is transcribed into two variants: SREBP-1c, which solely regulates lipid synthesis, and SREBP-1a, which controls both cholesterol and lipid synthesis. AIBP 435 also seem to modulate Notch signalling in mice and zebrafish [13,14]. In agreement with 436 these results, we found strong associations between the expression of APOA1BP and the 437 expression of all Notch signalling receptors and jagged ligands, but not with delta-like 438 ligands. Interestingly, jagged and delta-like ligands have shown opposite effects on 439

440 angiogenesis and regulation of T cells [31,32]. Consistent with a higher susceptibility of 441 the left carotid artery, wAlthough wee also found that NOTCH1 and NOTCH4 were positively associated with left cIMT measuresatherosclerosis. Despite these associations, 442 443 -it is particularly noticeable that the expression of human-specific gene NOTCH2NL had the strongest associations with atherosclerotic measures. Interestingly, among all genes 444 involved in cholesterol metabolism, NOTCH2NL had the strongest positive association 445 with ABCA1, suggesting again a potential upregulation of ABCA1 expression to increase 446 cholesterol efflux in patients with cIMT. Little is known about NOTCH2NL, but it has 447 recently stood out for its ability to enhance Notch signalling and expand human cortical 448 449 progenitor cells [33,34]. Consistent with this link between cholesterol metabolism and haematopoiesis, we found significant associations among the expression of APOA1BP, 450 SREBF1 and NOTCH2NL, and haematology and lipid parameters. 451

We found that the expression of transcripts APOA1BP, SREBF1, SREBF2 and 452 453 NOTCH2NL was associated with several plasma metabolites. APOA1BP had positive 454 correlations with three amino acids (asparagine, histidine, glycine), glycerol, choline and citrate. These amino acids were also associated positively with circulating HDL-C levels, 455 456 but negatively with TG and WBC counts. Glycine, histidine and asparagine were also negatively associated with cIMT measures. Of note, among 35 plasma metabolites 457 quantified in 1049 individuals without coronary artery disease (CAD) and diabetes, 458 459 histidine was most strongly associated with lower risk for incident CAD, followed by asparagine [35]. Low circulating levels of glycine have also been causally associated with 460 higher incidence of coronary heart disease [36]. 461

APOA1BP expression also had a positive association with choline. Remarkably, both
choline and phosphocholine levels had very strong positive associations with HDL-C but
correlated negatively with the expression of *NOTCH2NL*. There is evidence suggesting a

connection between choline and HDL metabolism. Hence, phosphatidylcholine is the 465 466 major phospholipid component of all plasma lipoproteins and the biosynthesis of phosphatidylcholine in the liver is critical for the synthesis and secretion of HDL and 467 468 VLDL [37]. Interestingly, APOA1BP correlated negatively with the expression of liver enzymes involved in the synthesis of phosphatidylcholine from choline and 469 phosphocholine, suggesting an up-regulation of the synthesis of phosphatidylcholine in 470 patients with lower APOA1BP to increase assembly and clearance of lipoproteins. Due to 471 the role of lecithin-cholesterol acyltransferase (LCAT) in the formation of HDL and 472 RCT, we also assessed the relation between the expression levels of APOA1BP and LCAT 473 474 and found a positive association (R=0.27, P=0.01). Interestingly, although studies in the general population gave inconsistent results, patients with LCAT deficiency have shown 475 a significant increase in the incidence of CVD [38]. Despite the associations with 476 477 APOA1BP and HDL, neither choline nor phosphocholine had associations with measures of atherosclerosis. Previous studies have shown inconsistent associations between 478 479 circulating choline and phosphocholine levels and cardiovascular events. Both metabolites were positively associated with the risk of CVD and stroke after 4.8 years of 480 follow-up in participants at high cardiovascular risk within the PREDIMED study, but no 481 associations were found between 1-year changes in these metabolites and the incidence 482 483 of CVD [39]. Similarly, higher plasma choline levels were associated with increased risk of major cardiac events after 3 years of follow-up in patients undergoing elective 484 diagnostic coronary angiography, but they did not predict risk when trimethylamine N-485 oxide, a choline metabolite, was added to the model [40]. In cross-section studies higher 486 487 plasma choline concentrations have been associated with an unfavourable cardiometabolic risk factor profile, including lower HDL levels [41,42]. However, it is 488 worth noting that plasma choline levels do not reflect choline status because disturbances 489

in circulating choline arise early in disease development [43,44] and circulating levels
may depend on lipid overload. In this sense, plasma choline metabolites differed between
normal and overweight men [45]. In addition, both low and high plasma concentrations
may be associated with adverse effects [46].

As expected, the expression levels of SREBF1 and SREBF2 had positive associations with 494 several lipids. These genes also correlated positively with circulating levels of BCAA and 495 catabolites, NAG and lactate. Except for lactate, we found that these metabolites were all 496 497 positively associated with measure of cIMT. Several cross-section and prospective cohort studies revealed positive associations of BCAA with major metabolic disorders [47] and 498 recently they have also been positively associated with risk factors of CAD, in particular 499 500 cIMT [48]. Interestingly, we also found a positive correlation between the expression levels of NOTCH2NL and BCAA. In line with atherosclerosis being a chronic 501 502 inflammatory disorder, we found a consistent association between NAG, a novel marker 503 of chronic inflammation [22], and cIMT measures. Consistently, we found that NAG 504 levels were the strongest predictors of WBC counts, which also had positive associations with BCAA. Supporting the role of the APOA1BP-SREBF-NOTCH axis and 505 506 inflammation in atherosclerosis, we also found that NAG levels were negatively associated with the expression of APOA1BP, but positively with that of SREBF1, 507 SREBF2, and NOTCH2NL. Finally, most of the metabolites associated with SREBF1 and 508 509 SREBF2 had similar associations with TG, but opposite to those of HDL.

The main limitation of our study is its cross-sectional nature. Therefore, we cannot infer cause-effect relationships. Second, the results cannot be extrapolated to the general population, as subjects in the current study were morbidly obese. In addition, we did not measure AIBP protein levels. The strengths of the present work include the use of two independent well-characterized cohorts, which allowed the control for potential confounders, with comprehensive metabolomic, transcriptomic, liver biopsy and cIMTdata.

In conclusion, our findings demonstrate, for the first time, an atheroprotective association
between the expression levels of *APOA1BP* and atherosclerosis in humans. We have also
shown a connection between *APO1ABP*, Notch signalling and inflammation with
atherosclerosis.

521

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691 Figure Legends

Figure 1. Associations of expression levels of APOA1BP, SREBFs, and NOTCHs gens 692 with cIMT, steatosis, haematology and lipid measures and cholesterol and notch 693 pathway genes. a) Heatmap displaying the partial Spearman's correlation coefficients 694 (adjusted for age, BMI, sex, and cohort) between genes and cIMT measures. *p<0.05, 695 **p < 0.01, ***p < 0.001. **b**) Association of expression levels of *SREBF1* with the steatosis 696 degree (ANCOVA and Tukey-kramer tests). c) Cholesterol metabolism pathway genes 697 698 significantly associated with mean CCA based on partial Spearman's correlation adjusted for age, BMI, sex, and cohort. d-i) Scatter plots between expression levels of selected 699 genes and haematological and lipid parameters. Partial Spearman's correlation and 700 701 significance values adjusted for age, BMI, sex, and cohort are shown. j-k) Permutation 702 test for the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-PLS models between the expression levels of APOA1BP and the expression levels of 703 704 genes involved in the Notch signalling and cholesterol pathways, respectively. I-m) 705 Significant Notch and cholesterol pathway genes associated with APOA1BP after further validation of the O-PLS identified genes by partial Spearman's correlation adjusting for 706 707 age, sex, BMI, and country.

708 Figure 2. Associations of metabolomics data with the expression levels of APOA1BP, SREBF1, and cIMT measures. a) Permutation test for the goodness-of-fit (R^2Y) and 709 goodness of prediction (Q^2Y) obtained from the O-PLS models between the expression 710 levels of APOA1BP and the serum metabolome. b) Significant serum metabolites 711 712 obtained from the O-PLS model. Statistically significant metabolites are coloured in red if positively associated with APOA1BP and blue if negatively associated. c) Metabolites 713 associated with APOA1BP after further validation of the O-PLS identified metabolites by 714 partial Spearman's correlation adjusting for age, sex, BMI, and country. d) Permutation 715

test for the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-716 717 PLS models between the expression levels of SREBF1 and the serum metabolome. e) Significant serum metabolites obtained from the O-PLS model. Statistically significant 718 719 metabolites are coloured in red if positively associated with SREBF1 and blue if negatively associated. f) Metabolites associated with SREBF1 after further validation of 720 721 the O-PLS identified metabolites by partial Spearman's correlation adjusting for age, sex, BMI, and country. g-l) Scatter plots between selected metabolites and cIMT measures. 722 Partial Spearman's correlation and significance values adjusted for age, BMI, sex, and 723 724 cohort are shown.

Figure 3. Associations of metabolomics data with the lipid parameters, WBC, and 725 726 **NOTCH2NL** expression levels. a) Permutation test for the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-PLS models between the expression 727 728 levels of HDL-C and the serum metabolome. b) Metabolites associated with HDL-C after 729 further validation of the O-PLS identified metabolites by partial Spearman's correlation 730 adjusting for age, sex, BMI, and country. c-f) Scatter plots between selected metabolites and NOTCH2NL expression levels. Partial Spearman's correlation and significance 731 732 values adjusted for age, BMI, sex, and cohort are shown. g) Permutation test for the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-PLS models 733 between the expression levels of TG and the serum metabolome. h) Metabolites 734 735 associated with TG after further validation of the O-PLS identified metabolites by partial Spearman's correlation adjusting for age, sex, BMI, and country. i) Permutation test for 736 the goodness-of-fit (R^2Y) and goodness of prediction (Q^2Y) obtained from the O-PLS 737 models between the expression levels of WBC and the serum metabolome. j) Metabolites 738 associated with WBC after further validation of the O-PLS identified metabolites by 739 740 partial Spearman's correlation adjusting for age, sex, BMI, and country.

741	Supplementary Figure 1. a)_Cholesterol metabolism pathway genes significantly
742	associated with mean CA based on partial Spearman's correlation adjusted for age, BMI,
743	sex, and cohort. b) Heatmap displaying the partial Spearman's correlations (adjusted for
744	age, BMI, sex, and cohort) between cIMT measures and inflammation measured by NMR
745	plasma levels of N-acetylglycoproteins (NAG). c) Heatmap displaying the partial
746	Spearman's correlation coefficients (adjusted for age, BMI, sex, and cohort) between
747	genes and haematological parameters. d) Heatmap displaying the partial Spearman's
748	correlation coefficients (adjusted for age, BMI, sex, and cohort) between haematological
749	parameters and cIMT measures.
750	Supplementary Figure 2. <u>a,b)</u> Permutation test for the goodness-of-fit (R^2Y) and
751	goodness of prediction (Q^2Y) obtained from the O-PLS models between the expression
752	levels of SREBF1 and the expression levels of genes involved in Notch signalling and
753	cholesterol synthesis pathways, respectively. c,d) Significant Notch signalling and
754	cholesterol pathway genes associated with SREBF1 after further validation of the O-PLS
755	identified genes by partial Spearman's correlation adjusting for age, sex, BMI, and
756	<u>country</u> , respectively. en Permutation test for the goodness-of-fit (R^2Y) and goodness of
757	prediction (Q^2Y) obtained from the O-PLS models between the expression levels of
758	NOTCH2NL and the expression levels of genes involved in cholesterol synthesis
759	pathway. [b) Significant cholesterol pathway genes associated with NOTCH2NL after

760 further validation of the O-PLS identified genes by partial Spearman's correlation 761 adjusting for age, sex, BMI, and country.

Supplementary Figure 3. a) Permutation test for the goodness-of-fit (R^2Y) and goodness 762 of prediction (Q^2Y) obtained from the O-PLS models between the expression levels of 763 SREBF2 and the serum metabolome. b) Significant serum metabolites obtained from the 764 765 O-PLS model. Statistically significant metabolites are coloured in red if positively
- associated with *SREBF2* and blue if negatively associated. c) Metabolites associated with
- 767 SREBF2 after further validation of the O-PLS identified metabolites by partial
- 768 Spearman's correlation adjusting for age, sex, BMI, and country

769

Table 1. Baseline characteristics of participants.

Variables	All (<i>n</i> =78)
Age (years)	42.4 ± 1.16
$BMI (kg/m^2)$	46.2 (42.4-51.1)
Waist circumference (cm)	127.0 (119.5-138.0)
Sex (women, %)	79.2
SBP (mmHg)	134.0 (122.5-144.0)
DBP (mmHg)	81.0 (75.0-90.0)
Riachomistry	
Glucose (mg/dL)	95.0 (88.5-101.5)
HOMA-IR	4 50 (2 95-6 90)
Triglycerides (mg/dL)	112.0(82.0-143.5)
Total cholesterol (mg/dL)	197.5 + 4.6
LDL cholesterol (mg/dL)	131.0 ± 4.0
HDL cholesterol (mg/dL)	45.0 (40.0-51.2)
Haematology	150.0 (100.0.200.0)
Eosinophils	150.0 (100.0-200.0)
Neutrophils	4810 (3665-5795)
Monocytes	2300 ± 80.9
Total WPC	7250 (6285 0020)
PBC	A 66 (A 46 A 91)
RBC	4.00 (4.40-4.91)
Liver	
HsCRP	0.88 (0.47-1.39)
AST	19.0 (15.0-28.0)
ALT	30.0 (22.0-43.5)
Steatosis grade (%):	15.4
Grade 0	15.6
Grade 1	55.8 24.7
Grade 2	24.7
Glade 5	20.0
Atherosclerosis	
RproCCAi	0.70 (0.60-0.80)
RproCCAe	0.70 (0.60-0.80)
RpreCCAi	0.79 ± 0.03
RpreCCAe	0.72 (0.60-0.80)
RICAI	0.70 (0.60-0.90)
RICAe	0.70 (0.54-0.85)
mRCCA	0.73 ± 0.02
	0.71 ± 0.02
LproCCA	0.70(0.60-0.83)
LproCCA	0.09(0.00-0.80)
LpreCCAe	0.80(0.70-1.0)
	0.84 ± 0.03 0.77 (0.57, 0.90)
LICAE	0.77 (0.57-0.90)
mLCCA	0.76 ± 0.02
mLICA	0.73 ± 0.02
mCCA	0.74 ± 0.02
mCA	0.73 ± 0.02

Values are expressed as means ± SEM for normally distributed variables and median [IQR] for non-normally distributed variables. ALT, alanine aminotransferase; AST, aspartate aminotransferase; HsCRP, high sensitivity

774 775 C-reactive protein; e, external; i, internal; ICA, internal carotid artery; L, left; m, mean; preCCA, pre bifurcation common carotid artery; proCCA, proximal segment common carotid artery; R, right; RBC, red blood cells; WBC, white blood cells.





1 Reference: YCLNU-D-19-01600

3 Title: The APOA1BP-SREBF-NOTCH axis is associated with reduced atherosclerosis

4 risk

2

5 General comments to the reviewers

6 We greatly appreciate all the comments and suggestions made by the reviewers, the 7 responses to which strengthen our manuscript. We have revised and modified the 8 manuscript according to these suggestions, as detailed below.

9

11

10 **Responses to Reviewer 1**

12 **Reviewer #1:** The manuscript titled "The APOA1B-SREBF-NOTCH axis is associated with 13 reduced atherosclerosis risk," is interesting and clearly written. It has a novelty because 14 the authors tried to elucidate the association between APOA1B-SREBF-NOTCH axis and 15 atherosclerosis in humans. However, the reviewer has several concerns regarding this 16 article. Specific comments are as follows.

17

18 *Major points:*

19

20 1. The authors demonstrated the possible relations between APOA1B and SREBF, and 21 between APOA1B and NOTCH. However, the reviewer cannot find the data showing the 22 relation between SREBF-NOTCH. Since the authors claim "the APOA1B-SREBF-NOTCH 23 axis", they should show clearly the relation between SREBF-NOTCH. We thank the 24 reviewer for this comment and we agree with him that we had not shown a clear 25 evidence for the relation between SREBF and NOTCH signalling. Therefore, similar 26 to what we did for the associations between APOA1BP expression and Notch and 27 cholesterol pathway associated genes, we built O-PLS models between the expression 28 of SREBF1 and Notch and cholesterol genes, respectively. In both cases, we obtained 29 significant models (P<0.001) associating SREBF1 with Notch and cholesterol





30 pathways. Both models were further validated by partial Spearman's correlation 31 adjusting for age, sex, BMI, and country. Interestingly, the expression of *SREBF1* 32 was positively associated with both *NOTCH1* and *ABCA1* expression, which we had 33 found negatively associated with *APOA1BP*. In the case of *SREBF2*, however, we did 34 not find significant associations with the Notch pathway genes. We have added all 35 these results in the results section and we have created a new Supplementary Figure 36 2.

37

2. In this study, the authors investigate morbidly obese population only, however, the title does not imply this specific population. The reviewer feels this could be misleading for the readers. We agree with the reviewer that the title lacks information about the study population and it can be misleading. We have added this information in the title and now it reads as: "The APOA1BP-SREBF-NOTCH axis is associated with reduced atherosclerosis risk in morbidly obese patients".

44

45

46 *Minor points:*

47

1. The O-PLS regression model figures are difficult to understand because those figures do not have adequate variables information. Please refer to figure 1j-k, 2a-b, 2d-e, 3a, 3g, 3i, Supplemental figure 2a and Supplemental figures 3a-b. It would be easier to understand if these figures contain adequate information regarding the variables. We agree with the reviewer that the figures are no straightforwardly understandable without reading the figure legends. Following reviewer's suggestion, we have added in each figure the variables X and Y involved in the corresponding model.

55

56 2. The reviewer found mistyping which is mentioned below:

57 Page 13, line 280, "RproCAAi" should be "RproCCAi". Corrected

58 Page 22, line 507, "APO1BP" should be "APOA1BP". Corrected

59





60 **Responses to Reviewer 2**

61

62 **Reviewer #2:** Mayneris-Perxachs, et al. investigated correlation between gene expression 63 in the liver (e.g., APOA1BP, SREBF, and Notch) and carotid atherosclerosis in morbidly 64 obese patients. The authors employed sophisticated methods such as metabolomics 65 analyses and transcriptomic analyses, and suggested "APOA1BP-SREBF-NOTCH axis 66 signaling pathway" and its association with atherosclerosis.

67 This reviewer has following comments to this study.

1. The mechanisms by which APOA1BP-SREBF-NOTCH axis signaling pathway affect *atherogenesis is not clear. How the difference in gene expression in the liver links with the carotid artery atherosclerosis?*

71 Recent evidence suggests that cholesterol pathways link hematopoiesis with 72 atherosclerosis, with and interesting role for the AIBP-SREBP-NOTCH axis. The 73 bone marrow is the main site of haematopoiesis in adults. However, the liver is the 74 main site in prenatal development and some studies have provided evidence that it is 75 still active in adults. Therefore, we hypothesized that the gene expression in the liver 76 could be related to cholesterol metabolism and atherosclerosis. Thus, our aim was to 77 show for the first time in humans an association of the APOA1BP-SREBF-NOTCH 78 axis with atherosclerosis. We have to take into account that we have analysed cross-79 sectional data. Therefore, we cannot infer causality or describe mechanisms, but just 80 associations. In zebrafish, increased cholesterol efflux mediated by Aibp2 has shown 81 to activate Srebp2, which in turn upregulated Notch resulting in an expansion of 82 hematopoietic stem and progenitor cells (HPSC) in the bone marrow. In human 83 subjects with hypercholesterolemia (the driving force for atheroscleroris) they found 84 that the number of HPSC are elevated and SREBP and NOTCH are upregulated in 85 HPSC isolated from these subjects. Here, we also found positive associations between 86 SREBF1, SREBF2 and NOTCH2NL expression and atherosclerosis parameters and 87 blood cells, whereas APOA1BP had opposite associations. We also found associations 88 among APOA1BP, Notch pathway genes, and cholesterol pathway genes. However, 89 we had not reported associations between SREBF and Notch pathway and cholesterol





90 pathway genes. We have thus analysed this relationship by O-PLS modelling and 91 similar to APOA1BP we have found significant models between SREBF1 and Notch 92 and cholesterol genes, respectively. We have added these results in the revised version 93 of the manuscript. Therefore, lower APOAB1P expression is associated with higher 94 expression of SREBF1 and NOTCH receptors, which in turn are associated with 95 higher levels of blood cells and atherosclerosis measures. We have also found significant associations between several white blood cells and atherosclerosis 96 97 measures. Although we had not reported these associations in the original 98 manuscript, we have added them in supplementary Figure 1d. Thus, we found a clear 99 association among the APOA1BP-SREBF-NOTCH axis, haematopoiesis and 100 atherosclerosis.

101

102 2. Please explain the difference in the correlation between gene expression (e.g.,
103 APOA1BP, SREBF, and NOTCH) and parameters for atherosclerosis in left/right carotid
104 arteries (Page13).

105 APOA1BP was negatively associated with measurements in both left and right 106 carotid arteries. Interestingly, SREBF1 was mainly positively associated with all the 107 measurements in the left carotid artery, which would be in agreement with recent 108 evidence that the left carotid artery is more vulnerable to atherosclerosis than the 109 right carotid artery [1,2]. This is also consistent with NOTCH1 and NOTCH4 110 positively associated with atherosclerosis measures in the left carotid artery. We have 111 added this information in the discussion. In the case of NOTCH2NL though, it correlated with measures of the right internal carotid artery, but the reason for this 112 113 association would need further investigations.

- 114 [1] Selwaness M, Van Den Bouwhuijsen Q, Van Onkelen RS, Hofman A, Franco OH,
- 115 Van Der Lugt A, et al. Atherosclerotic plaque in the left carotid artery is more
- 116 vulnerable than in the right. Stroke 2014;45:3226–30.
- 117 doi:10.1161/STROKEAHA.114.005202.
- [2] Chou CL, Wu YJ, Hung CL, Liu CC, Wang S De, Wu TW, et al. Segment-specific
 prevalence of carotid artery plaque and stenosis in middle-aged adults and elders in





120 Taiwan: A community-based study. J Formos Med Assoc 2019;118:64–71.
121 doi:10.1016/j.jfma.2018.01.009.

122

123 3. How do "APOA1BP", "SREBF", and "NOTCH" interact each other?

124 From O-PLS modelling and further validation by partial Spearman correlation 125 (adjusting for age, BMI, sex, and country) we had found significant associations 126 between the expression of APOA1BP and NOTCH pathway genes. We also showed 127 that APOA1BP and SREBF1 had opposite associations with the almost the same 128 atherosclerosis measures, particularly mLCCA, mCCA, and mCA. However, we had 129 not shown a direct relationship between SREBF and NOTCH. Thus, similar to what 130 we did for the associations between APOA1BP expression and Notch and cholesterol 131 pathway associated genes, we built O-PLS models between the expression of SREBF1 132 and Notch and cholesterol genes, respectively. In both cases, we obtained significant 133 models (P < 0.001) associating SREBF1 with Notch and cholesterol pathways. Both 134 models were further validated by partial Spearman's correlation. Interestingly, the 135 expression of SREBF1 was positively associated with both NOTCH1 and ABCA1 136 expression, which we had found negatively associated with APOA1BP. In the case of 137 SREBF2, however, we did not find significant associations with the Notch pathway 138 genes. We have added all these results in the results section and we have created a 139 new Supplementary Figure 2. Therefore, we have found a clear relationship between 140 APOAB1P, SREBF, and NOTCH, but due to the cross-sectional nature of our study we cannot infer causal mechanisms or the direction of the associations. 141

142

143 4. The authors only described about Jagged ligand related with Notch. A previous study
144 demonstrated the inhibition of Dll4, a Notch ligand, reduced lipid accumulation in the
145 liver (PNAS 2012;109:E1868-E1877.).

146 Thanks for pointing this. In Figure 11 we only showed the significant associations that 147 we obtained between *APOA1BP* and genes from the Notch pathway. However, the O-148 PLS models were performed considering 79 genes involved in the Notch signalling 149 pathway. Then, significant genes identified through O-PLS modeling were further





150 validated by partial Spearman's correlation. These 79 genes included both jagged 151 and delta-like ligands, but we did not find significant associations between delta-like 152 ligand and APOA1BP expression. We only found significant associations with jagged 153 ligands. Because of this, we have not discussed delta-like ligands in the manuscript. 154 To avoid confusions, we have added the number of genes that we considered to build 155 the O-PLS models based on Notch signalling pathway associated genes and 156 cholesterol pathway associated genes in the revised version of the manuscript. We 157 have also added the names of these genes in the Supplementary Tables 1 and 2, 158 respectively.

159

160 On the other hand, in our liver samples, only DLL1, DLK1 (delta like non-canonical 161 Notch ligand1), and *DLK2* were expressed, but not *DLL4*. Considering Fukuda et al. 162 results suggested by the reviewer, we have analysed the possible association between 163 delta-like ligands and steatosis. Thus, we have performed partial Spearman's 164 correlation analysis between these delta ligands and the steatosis degree in our 165 population. However, we have not found any significant association, although the 166 expression of *DLK1* had a trend towards a positive association with the degree of 167 steatosis (r=0.21, p=0.076). We must also take into account that Fukuda *et al.* treated 168 mice with anti-mouse *Dll4* antibody, which inhibits *Dll4* in all *Dll4*-expressing cells, 169 not just the liver. Therefore, decreases in the accumulation of lipids in the liver after 170 Dll4 Ab treatment could originate from blockage of Dll4 in other tissues. In fact, Dll4 171 Ab treatment also reduced fat in epididymal and sub-cutaneous adipose tissues.

172

173 5. Do the authors have data associated with inflammation directly?

From multivariate analyses, we have found direct associations of *SREBF1* and *SREBF2* expression with *N*-acetylglycoproteins (NAG) measured by NMR. It is a composite biomarker of systemic inflammation that integrates the protein levels and glycosylation states of several of the most abundant acute phase proteins in serum. As a composite biomarker, NAG is a novel marker of systemic inflammation that may be a better reflection of systemic acute phase response than any other single





180 glycoprotein component. For example, it has low intra-individual variability
181 compared to hsCRP, which often exhibits high intra-individual variability, allowing a
182 more stable measure of inflammation.

183

We have now specifically analysed the correlation between NAG and *APOA1BP* and *NOTCH* receptors. We have found an almost significant association between NAG and *APOA1BP* (r=-0.22, p=0.051). We have also found a trend towards a positive association between *NOTCH2NL* and NAG (r=0.20, p=0.07), but no significant associations with the expression of the other Notch receptors. We have added these results in the results section.

190

We have also realized that although in lines 491-493 we had commented that NAG was associated with cIMT measures, we had not reported the associations in the results section. Therefore, we have added a heatmap in Supplementary Figure 1b with the correlations between NAG and measures of atherosclerosis. As expected, several of these measures correlated positively with NAG.

196

197 6. Can the authors show the correlation between gene expression (e.g., APOA1BP,
198 SREBF, and NOTCH) and WBC population such as monocyte or lymphocytes?

We have added a heatmap in Supplementary Figure 1c with the correlations of
haematological parameters (total WBC, lymphocytes, monocytes, eosinophils,
neutrophils, red blood cells, and platelets) with the expression *APOAB1P*, *SREBF*and *NOTCH* genes.

203

204 7. Can the author apply the results of present study to general population? If not, the205 authors need to make this clear in the title of this paper.

As our population consisted in morbidly obese patients, the results may not be generalizable to the general population. Following the reviewer's suggestion we have modified the title and now it reads as: "The APOA1BP-SREBF-NOTCH axis is associated with reduced atherosclerosis risk in morbidly obese patients".





210	<u>Comments to the Editor</u>
211	

- 212 We have added Dr. Josep Puig as an author in the paper. He was the person
- 213 responsible for the measurements of carotid intima-media thickness, but as he has
- 214 moved to another area we had forgotten to add him as an author. We apologise for
- 215 this mistake and any inconvenience it may have caused.









±





Supplementary Table 1. Notch signalling pathway associated genes considered in the present study.

Genes
AAK1
ADAM10
AKT1S1
ANXA4
APP
BMP2
CBFA2T2
СДК6
CDKN1B
CIR1
CREB1
CREBBP
CTBP1
СТВР2
DLK1
DLL1
DVL1
DVL3
EP300
EPN1
EPN2
FBXW7
FOXC1
GALNT11
GMDS
GOT1
HDAC1
HDAC2
HES1
HES2
HES4
HES5
HES6
HES7
HESX1
HEY1
HEY2
HHEX
HIF1AN
IFT172
IFT88

JAG1
JAG2
ΚΑΤ2Α
КАТ2В
MAML1
MAML2
MIB1
MIB2
MMP14
NCOR2
NCSTN
NEURL
NFKBIA
NLE1
NOTCH1
NOTCH2
NOTCH2NL
NOTCH3
NOTCH4
POFUT1
POGLUT1
PSEN2
PTP4A3
RBM15
RBPJ
RFNG
RPS19
RPS27A
SEL1L
SNAI2
SORBS2
SPEN
TSPAN14
TSPAN15
UBA52
UBB
UBC
WDR12

Supplementary Table 2. Notch signalling pathway associated genes considered in the present study.

Genes
ABCA1
ABCG1
ACADL
ACAT2
ALMS1
APLP2
APOA1
APOA1BP
APOA2
APOA4
APOA5
АРОВ
APOBEC2
APOBEC3A
APOBEC3B
APOBEC3C
APOBEC3D
APOBEC3F
APOBEC3G
АРОВЕСЗН
APOBR
APOC1
APOC2
APOC3
APOC4
APOE
APOF
АРОН
APOL1
APOL2
APOL3
APOL4
APOL5
APOL6
APOLD1
ARHGEF10L
ARV1
CAT
CLN6
CYB5R1
CYB5R3

CYP51A1
DHCR24
DHCR7
EBP
EBPL
EHD1
EIF2A
EIF2AK3
ERLIN1
ERLIN2
FDFT1
FDPS
FDX1
FECH
HDLBP
HMGCR
HSD17B7
INSIG1
INSIG2
IRAK1
LBR
LDLR
LDLRAP1
LIPA
LIPE
LMF1
LMNA
LRP5
LRP6
LSS
MBTPS1
MED13
MVD
MVK
NCOR1
NPC1
NPC1L1
NPC2
NR1H2
NR1H3
NUS1
OSBP
РСТР
PLSCR3
PMVK

POR
PRKAA1
PTCH1
RALY
RORA
SC5DL
SCAP
SCARB1
SCP2
SEC14L2
SEC24A
SIRT1
SOD1
SQLE
SREBF1
SREBF2
STARD4
STARD5
STX12
TM7SF2
TMEM97
VPS4A
XBP1