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ApoC-III proteoforms are associated with better lipid, inflammatory, and glucose profiles independent of total apoC-III

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Abstract

Background Apolipoprotein (apo) C-III is involved in several processes that increase triglyceride levels, inflammation, and insulin resistance. Four of its proteoforms have been the focus of several studies and have shown differential associations with cardiovascular risk biomarkers, mostly lipids. However, there are other proteoforms of apoC-III that have not yet been investigated in detail. The aim of this study was to evaluate the associations of seven apoC-III proteoforms with a comprehensive set of biomarkers, including lipid metabolism, inflammation, and glucose homeostasis.

Methods Seven apoC-III proteoforms (apoC-III_{0a}, apoC-III_{0b}, apoC-III₁, apoC-III_{1d}, apoC-III₂, apoC-III_{2d}, and apoC-III_{0f}) were measured using a mass spectrometry immunoassay in 875 participants from the cross-sectional study of the Di@bet.es cohort. The complete lipoprotein profile was obtained via the Liposcale test, and the proton nuclear magnetic resonance (¹H-NMR)-assessed glycoprotein signals were also obtained as biomarkers of inflammation.

Results Three proteoform ratios (apoC-III_{2d}, apoC-III₂, and apoC-III_{0f} normalized to apoC-III₁) showed protective associations with most of the cardiovascular risk biomarkers in comparison with total apoC-III in linear regression models and were negatively associated with triglycerides ($\beta=-0.173$, $p < 0.001$; $\beta=-0.297$, $p < 0.001$; $\beta=-0.223$, $p = 0.002$), very low-density (VLDL) particle concentration ($\beta=-0.133$, $p < 0.001$; $\beta=-0.265$, $p < 0.001$; $\beta=-0.203$, $p < 0.001$), GlycA ($\beta=-0.148$, $p < 0.001$; $\beta=-0.263$, $p < 0.001$; $\beta=-0.211$, $p < 0.001$) and homeostatic model assessment of insulin resistance (HOMA-IR) ($\beta=-0.096$, $p = 0.003$; $\beta=-0.199$, $p < 0.001$; $\beta=-0.114$, $p = 0.002$). These associations were partly independent of total apoC-III concentrations. Participants with high levels of these proteoforms had a lower prevalence of cardiometabolic disorders, such as type 2 diabetes ($p = 0.022$), obesity ($p = 0.001$), and metabolic syndrome ($p = 0.013$).

Conclusions While apoC-III is positively associated with biomarkers of cardiometabolic risk, the proportions of three apoC-III proteoforms show opposite associations, independent of total apoC-III concentrations. Measuring not

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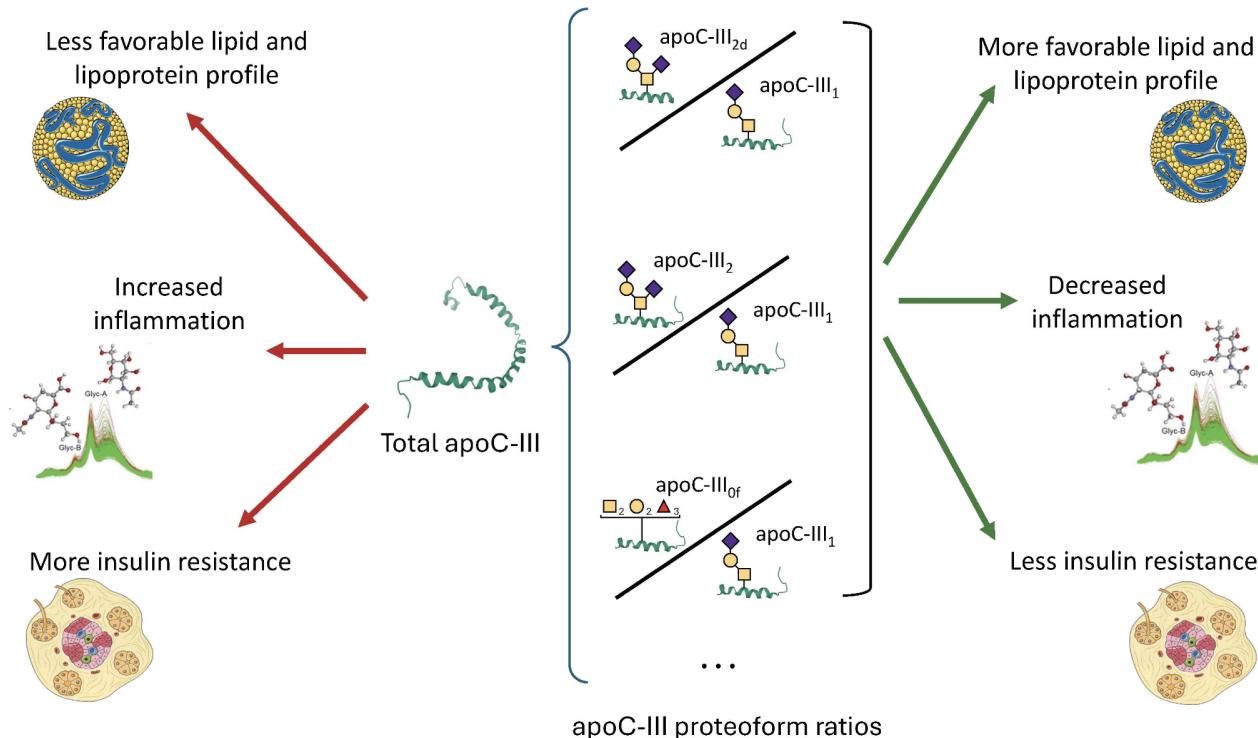
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only apoC-III but also the proportions of apoC-III proteoforms can provide valuable information since individuals with similar levels of total apoC-III could display opposite lipid profiles depending on the proportion of apoC-III proteoforms.

Graphical abstract



Keywords Apolipoprotein C-III, Proteoforms, Cardiovascular disease, Type 2 diabetes, Dyslipidemia, Insulin resistance, Inflammation, Triglycerides, Glycoproteins, Lipoproteins

Background

Apolipoprotein (apo) C-III is a small protein (8.8 kDa) that is synthesized in the liver and intestine. It is mostly bound to lipoproteins, especially very low-density lipoproteins (VLDL) and high-density lipoproteins (HDL) [1], although it can also be detected in low-density lipoproteins (LDL) and intermediate-density lipoproteins (IDL) [2]. It has raised interest as a cardiovascular risk factor: loss-of-function mutations in the APOC3 gene are associated with a lower risk of both ischemic vascular disease and coronary heart disease in two large cohort studies [3, 4], and apoC-III concentrations in VLDL and LDL are predictors of recurrent coronary events [5].

ApoC-III has multiple functions, all of which are related to a worse cardiometabolic profile, which could explain the increased cardiovascular risk associated with apoC-III. These functions can be classified into three areas: lipid metabolism, glucose homeostasis, and inflammation. With respect to lipid metabolism, apoC-III is a major regulator of triglyceride concentrations: it decreases the uptake of triglyceride-rich lipoproteins

(TRLs) by liver receptors [6], inhibits lipoprotein lipase (LPL) and hepatic lipase (HL) (although it is not clear whether LPL inhibition occurs *in vivo*) [7], and enhances the synthesis and secretion of VLDL [8].

In relation to glucose homeostasis, apoC-III impairs the function of pancreatic β cells, and preclinical studies suggest a role for apoC-III in the pathology of both type 1 and type 2 diabetes. In the context of the insulin resistance found in type 2 diabetes (T2DM), a local increase in the production of apoC-III within the pancreatic islets causes inflammation and apoptosis of β cells, thus impairing β -cell function [9]. In type 1 diabetes (T1DM), increased serum apoC-III causes an increase in intracellular Ca^{2+} and β -cell apoptosis [10].

In vitro experiments have shown that apoC-III also promotes the secretion of proinflammatory cytokines in endothelial cells [11] and induces inflammasome activation and apoptosis in monocytes [12]. Moreover, LDL particles containing apoC-III are more prone to aggregation in the endothelium [13].

This study focuses on apoC-III posttranslational modifications, which have the potential to alter, modulate or reverse the above-described functions. ApoC-III is post-translationally modified inside the cell and is secreted as a glycosylated protein. In the circulation, four main forms of the protein were initially described: nonglycosylated apoC-III (apoC-III_{0a}) and three proteoforms originating from O-glycosylation at threonine 74: apoC-III $_{0b}$, with mucin-type core-1, Galactose (Gal)- N-acetylgalactosamine (GalNAc); and apoC-III $_1$ and apoC-III $_2$, with one or two sialic acid residues bound to the Gal-GalNAc core, respectively [14].

These four proteoforms have been studied because of their different behaviors in terms of cardiovascular risk and lipid metabolism. There are several population studies reporting that higher proportions of apoC-III $_2$ and lower proportions of apoC-III $_1$ are associated with improved lipids and lipoproteins and insulin resistance, whereas less consensus exists regarding apoC-III $_{0a}$ and apoC-III $_{0b}$ [15–17]. Mechanistic *in vivo* studies have revealed a different clearance pathway of apoC-III depending on its glycosylation status: some hepatic receptors such as the heparan sulfate proteoglycan preferentially clear apoC-III $_2$, whereas others like the LDL receptor and the LDL receptor-related protein-1 are more prone to the uptake of apoC-III $_1$ [18].

ApoC-III sialylation is also a biomarker of colorectal cancer [19] and incident cardiovascular events [20, 21]. Therefore, it seems clear that not only apoC-III but also the way it is glycosylated is important in relation to the lipid profile and cardiovascular risk.

In addition to these four widely studied apoC-III proteoforms, other less abundant proteoforms have been identified by mass spectrometry: apoC-III $_{1d}$ and apoC-III $_{2d}$, with the same glycosylation pattern as apoC-III $_1$ and apoC-III $_2$, respectively, but lacking the last alanine residue; and apoC-III $_{0f}$, which is further fucosylated (Fuc) at the same residue (Gal $_2$ GalNAc $_2$ Fuc $_3$). The literature on these proteoforms is scarce and has focused mostly on proteomics [17, 22, 23]; therefore, to the best of our knowledge, cohort studies assessing the associations between these proteoforms and clinical or biochemical biomarkers are lacking.

In the present study, we quantified up to 7 apoC-III proteoforms: the four main proteoforms apoC-III $_{0a}$, apoC-III $_{0b}$, apoC-III $_1$, and apoC-III $_2$ and the three less abundant proteoforms apoC-III $_{1d}$, apoC-III $_{2d}$ and apoC-III $_{0f}$. We analyzed the associations of all these proteoforms with a comprehensive set of biomarkers related to the three areas of apoC-III functions (namely, lipid metabolism, glucose homeostasis, and inflammation). Additionally, we combined all these proteoforms to define groups of people with different metabolic and cardiovascular risk profiles.

Methods

Study design and participants

The study population consisted of a subgroup of 875 participants from the cross-sectional study of the Di@bet.es cohort, which is a population-based study of the Spanish general population conducted in 2008–10 [24].

The samples were taken from a previous study aimed at exploring an advanced NMR lipoprotein and glycoprotein profile in relation to the prevalence and incidence of diabetes and cardiovascular disease. As such, the study population was enriched with people with different cardiometabolic disorders, including diabetes, prediabetes, and cardiovascular disease (CVD). People without any of these diseases and with similar sex frequencies were also included in a proportion close to 2:1.

Anthropometric data were collected and adherence to the Mediterranean diet was assessed via a 14-item questionnaire that had been previously developed and validated [25].

Biochemistry

Upon enrolment in the Di@bet.es study, serum samples were obtained, frozen and stored at -80 °C for subsequent analyses. Lipid and routine biochemistry values were obtained as previously reported [24]. The homeostatic model assessment of insulin resistance (HOMA-IR) index was calculated from glucose and insulin measurements. Apolipoproteins, lipoprotein (a) (Lp(a)) and high-sensitivity C-reactive protein (hsCRP) were measured using immunoturbidimetric assays (apoA-I, apoB: BioSystems, Spain; apoC-III, apoE: Randox, UK; hsCRP, Lp(a): Spinreact, Spain) with a Spin240 autoanalyzer (Spinreact, Spain).

Proton nuclear magnetic resonance ($^1\text{H-NMR}$) lipoprotein and glycoprotein measurements

The particle concentrations of three subclasses (small, medium, and large) of each lipoprotein type (VLDL, LDL, and HDL) and the mean diameter of each lipoprotein type were obtained from the Liposcale® test (Biosfer Teslab SL, Spain) of serum samples, an advanced lipoprotein test based on 2D diffusion-ordered $^1\text{H-NMR}$ spectroscopy and utilizing diffusion coefficients to quantify the number of lipoprotein particles, as previously described [26].

The glycoprotein signals GlycA, GlycB, and GlycF were obtained from analysis of the region of the $^1\text{H-NMR}$ spectrum where the glycoproteins resonate (2.15–1.90 ppm) via several analytical functions, as previously described [27], by Biosfer Teslab SL (Spain). For each function, the total area (proportional to the concentration) was determined. The area of GlycA provides the concentration of protein-bound N-acetylneurameric acid, and the area of GlycB provides those of N-acetylglicosamine [28]. The

GlycF area is derived from the concentration of the acetyl groups of N-acetylglucosamine, N-acetylgalactosamine, and N-acetylneuraminic acid unbound to proteins (free fraction) [29].

Mass spectrometry immunoassay

ApoC-III proteoforms were analyzed via a mass spectrometry immunoassay at the Centre for Omic Sciences (COS)– Eurecat, Reus, Spain. Briefly, serum samples were incubated with a biotinylated goat anti-apoC-III antibody (Fortis Life Sciences, MA, USA) and total apoC-III was immobilized on streptavidin AssayMAP cartridges (Agilent Technologies, CA, USA) using an automated AssayMAP BRAVO platform (Agilent Technologies, CA, USA). After elution, total apoC-III was dried and resuspended in a sinapinic acid matrix (15 mg/mL sinapinic acid in a solution of 33% acetonitrile and 0.4% trifluoroacetic acid in water), and 1 μ L was loaded onto a ground steel MALDI plate. Mass spectra were acquired with an UltrafleXtrem III MALDI-TOF/TOF instrument (Bruker, Germany) operating in positive ion mode and with a range from 4–20 kDa. An average of 5000 laser shot mass spectra were saved for each sample spot. Mass spectra were internally calibrated using protein calibration standard-I (Bruker, Germany) and further processed using Flex Analysis 3.0 software (Bruker Daltonics). (Fig. 1A).

The peaks were labeled, and peak intensity lists were generated. The extraction of peak intensities for each proteoform was automated within a defined confidence mass range spanning the theoretical m/z values 8765 (apoC-III_{0a}), 9136 (apoC-III_{0b}), 9350 (apoC-III_{1d}), 9422 (apoC-III₁), 9641 (apoC-III_{2d}), 9713 (apoC-III₂) and 9934

(apoC-III_{0f}). Given the complexity of the spectra, the assignment of minor proteoforms was manually reviewed for each sample to ensure accuracy. For comparison, the peak intensities corresponding to each proteoform were normalized to the peak intensity of the apoC-III₁ peak (the most abundant proteoform) to account for sample dilution; therefore, ratios of each apoC-III proteoform to the apoC-III₁ proteoform were obtained: apoC-III_{0a}/apoC-III₁, apoC-III_{0b}/apoC-III₁, apoC-III_{1d}/apoC-III₁, apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁, as previously reported [16]. In some spectra, certain peak intensities could not be reliably quantified (especially those corresponding to the least abundant proteoforms) and were considered missing values (see Fig. 1 legend for the exact number of observations of each proteoform ratio). Batch correction was performed to address the inter-day variability in mass spectra acquisition.

Statistical analyses

The normality of the variables was assessed via histograms and qq-plots of the distributions. For linear regression analyses, triglycerides, Lp(a); the total VLDL particle concentration (VLDL_P); small, medium, and large VLDL particle concentrations (S-VLDL_P, M-VLDL_P, and L-VLDL_P, respectively); insulin; fasting glucose; HOMA-IR; GlycA; GlycB; GlycF; and hsCRP were log-transformed.

Multivariate linear regression models were built for each studied parameter (lipids, lipoproteins, and apolipoproteins; inflammatory markers and glucose metabolism variables) as dependent variables, with one proteoform ratio at a time used as a predictor. All the models were

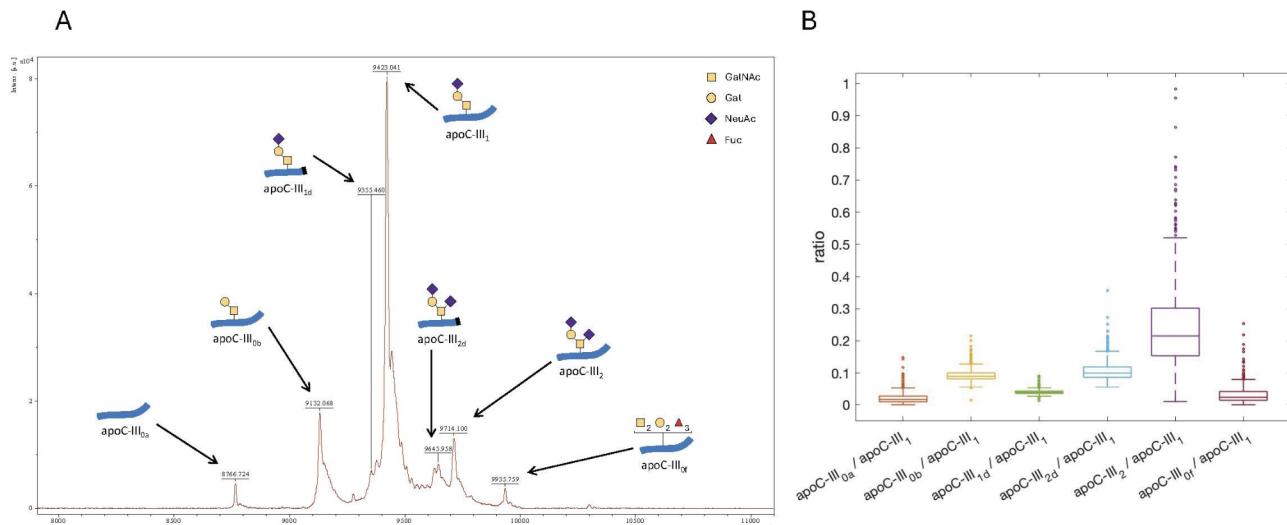


Fig. 1 Detection and distribution of apoC-III proteoforms. **A** Representative mass spectrum of apoC-III proteoforms. **B** Distribution of the six apoC-III proteoform ratios in the study population. The number of observations in which each proteoform ratio could be computed was 745 (apoC-III_{0a}/apoC-III₁), 860 (apoC-III_{0b}/apoC-III₁), 739 (apoC-III_{1d}/apoC-III₁), 823 (apoC-III_{2d}/apoC-III₁), 871 (apoC-III₂/apoC-III₁) and 687 (apoC-III_{0f}/apoC-III₁). Apo, apolipoprotein; Fuc, fucose; Gal, galactose; GalNAc, N-acetylgalactosamine; NeuAc, N-acetylneuraminic acid (sialic acid)

adjusted for age, sex, body mass index (BMI), lipid-lowering medication, exercise, and the Mediterranean diet score, plus specific confounders, depending on the analyses: smoking history for lipid- or inflammation-related variables and anti-inflammatory medication for inflammation-related variables. To study the independence of the observed effects from triglyceride levels and apoC-III, additional models were built and adjusted for triglycerides or apoC-III in addition to the abovementioned confounders. Both the dependent variable and the proteoform ratio were standardized.

Clustering of the data was performed via all of the proteoform ratios: apoC-III_{0a}/apoC-III₁, apoC-III_{0b}/apoC-III₁, apoC-III_{1d}/apoC-III₁, apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁ (only in those cases with data of all the proteoform ratios available, $n=645$). The k-means and k-medoids algorithms were tested, and the silhouette coefficient was calculated. On the basis of the silhouette values and interpretability of the data, two clusters were defined using the k-medoids algorithm. The characteristics of the two

clusters were analyzed via principal component analysis (PCA) (using all the proteoform ratios) and the loadings of each proteoform.

Differences in potential confounders (age, sex, BMI, anti-inflammatory medication, oral antidiabetic medication, insulin treatment, and smoking) between clusters were assessed using the Student's t-test for continuous, normally distributed variables; Wilcoxon's test for continuous, nonnormally distributed variables; and the chi-square test for categorical variables.

Differences in lipid, lipoprotein, glucose, and inflammation-related parameters between clusters were assessed via ANCOVA, controlling for confounders that were found to differ between clusters and could interfere with the studied variable: age and sex for all variables, plus anti-inflammatory medication for inflammation-related parameters. To compare variables related to glucose metabolism, all participants with T1DM or previously diagnosed with T2DM were excluded. The false discovery rate of the differences between clusters was controlled via the Benjamini and Hochberg method, with a false discovery rate threshold of 5%. The prevalence of metabolic disorders was compared between clusters using the chi-square test.

Univariate differences in proteoform ratios between groups of treated and nontreated participants were assessed using Wilcoxon's test.

All the statistical analyses were performed using MATLAB version R2024a (MathWorks Inc. USA).

Results

Characteristics of the study population

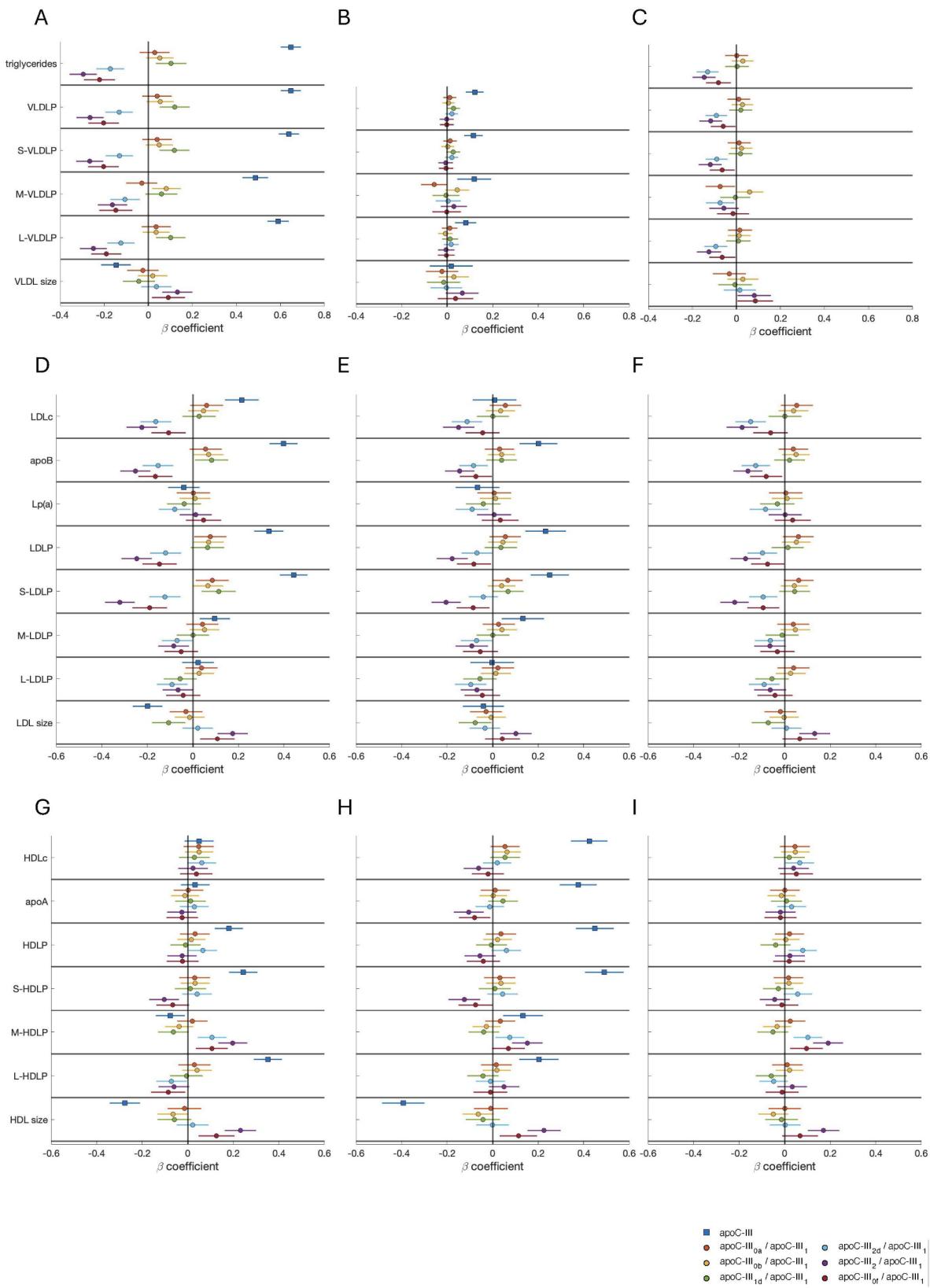
The study population was a subgroup of the Di@bet.es cohort, consisting of 875 participants with a mean age of 56.1 ± 14.6 years, 46.2% of whom were men. The mean lipid levels were within the normal range, and a high proportion of participants had diabetes: 239 (27.3%), of whom 126 (14.4% of the study population) were not previously diagnosed (without treatment) (Table 1).

The median apoC-III concentration was 10.07 mg/dL. Among the 7 measured apoC-III proteoforms, the ratios of 6 proteoforms (apoC-III_{0a}, apoC-III_{0b}, apoC-III_{1d}, apoC-III_{2d}, apoC-III₂, and apoC-III_{0f}) to the most abundant proteoform apoC-III₁ were computed. The proteoform with the highest proportion in relation to apoC-III₁ was apoC-III₂ (24% of the apoC-III₁ peak), followed by apoC-III_{2d} and apoC-III_{0b} (11% and 9%, respectively). The apoC-III_{0a}, apoC-III_{1d}, and apoC-III_{0f} peaks were less pronounced (2%, 4%, and 3% of the apoC-III₁ peak, respectively, and not quantifiable in part of the study sample) (Fig. 1B).

Table 1 Characteristics of the study population ($n=875$)

Age, y	56.08 (47.00–67.00)
Male sex, n (%)	404 (46.17)
BMI, kg/m ²	29.28 (25.93–32.06)
Systolic blood pressure, mm Hg	136.94 (123.25–150.00)
Diastolic blood pressure, mm Hg	79.33 (71.62–85.50)
Obesity, n (%)	338 (38.99)
Type 2 diabetes, n (%)	220 (25.14)
Hypertension, n (%)	515 (59.06)
Metabolic syndrome, n (%)	458 (54.39)
Under treatment	
Lipid-lowering medication, n (%)	204 (23.34)
Oral antidiabetic medication, n (%)	77 (8.80)
Insulin treated, n (%)	31 (3.54)
Anti-hypertensive medication, n (%)	305 (34.86)
Anti-inflammatory medication, n (%)	196 (22.43)
Current smoking, (%)	187 (21.37)
Total cholesterol, mg/dL	199.00 ± 39.32
LDLc, mg/dL	107.65 ± 29.88
HDLC, mg/dL	50.34 (41.18–57.23)
Triglycerides, mg/dL	133.05 (82.15–157.88)
Lp(a), mg/dL	26.61 (4.43–37.32)
apoA-I, mg/dL	130.39 (105.64–150.34)
apoB100, mg/dL	90.93 ± 13.95
apoC-III, mg/dL	10.07 (7.63–11.87)
apoE, mg/dL	4.08 (3.51–4.55)
Fasting glucose, mg/dL	108.60 (89.82–115.74)
hsCRP, mg/L	4.07 (0.97–4.49)

The number of observations and percentage are shown for categorical variables, the mean ± standard deviation for normally distributed continuous variables, and the median (quartile 1–quartile 3) for nonnormally distributed continuous variables. Apo, apolipoprotein; BMI, body mass index; HDLC, high-density lipoprotein cholesterol; hsCRP, high-sensitivity C-reactive protein; LDLc, low-density lipoprotein cholesterol; Lp(a), lipoprotein (a)

**Fig. 2** (See legend on next page.)

(See figure on previous page.)

Fig. 2 Associations between apoC-III proteoforms and parameters of TRL (**A–C**), LDL (**D–F**) and HDL (**G–I**) metabolism. Beta coefficients and 95% confidence intervals of apoC-III or proteoform ratios (predictors) for individual multivariate linear regression models on each lipid-related variable (dependent variables) are shown. In each model, both the predictor and dependent variable are standardized; therefore, the coefficients indicate the SD variation in the lipid-related parameter for a 1 SD increase in the apoC-III or apoC-III proteoform ratio. **A, D, G:** Models were adjusted for age, sex, BMI, lipid-lowering medication, exercise, Mediterranean diet score, and smoking history. **B, E, H:** Models were adjusted for confounders in the first models (**A, D, G**) plus triglycerides. **C, F, I:** Models were adjusted for confounders in the first models (**A, D, G**) plus apoC-III. Apo, apolipoprotein; BMI, body mass index; HDL, high-density lipoprotein; HDLc, HDL cholesterol; HDLP, HDL particle concentration; L-HDLP, large HDL particle concentration; L-LDLP, large LDL particle concentration; L-VLDLP, large VLDL particle concentration; LDL, low-density lipoprotein; LDLc, LDL cholesterol; LDLP, LDL particle concentration; Lp(a), lipoprotein (a); M-HDLP, medium HDL particle concentration; M-LDLP, medium LDL particle concentration; M-VLDLP, medium VLDL particle concentration; VLDL, very low-density lipoprotein; VLDLP, VLDL particle concentration; S-HDLP, small HDL particle concentration; S-LDLP, small LDL particle concentration; S-VLDLP, small VLDL particle concentration; SD, standard deviation; TRL, triglyceride-rich lipoprotein

ApoC-III, apoC-III proteoforms, and lipid metabolism

Triglycerides and VLDL

Total apoC-III was positively associated with triglyceride ($\beta=0.648$, $p<0.001$) and VLDL particle concentrations ($\beta=0.648$, $p<0.001$; $\beta=0.639$, $p<0.001$; $\beta=0.486$, $p<0.001$ and $\beta=0.590$, $p<0.001$; for total, small, medium and large VLDL particles, respectively) (Fig. 2A). The association with all VLDL particle subclasses was still significant after controlling for the triglyceride concentration, although the magnitude of the effect was markedly lower (Fig. 2B).

Analysis of individual apoC-III proteoforms revealed that the ratio apoC-III_{1d}/apoC-III₁ was also positively associated with triglycerides, total, large, and small VLDL particles. However, the ratios of three proteoforms (apoC-III_{2d}, apoC-III₂, and apoC-III_{0f}) to apoC-III₁ were negatively associated with triglycerides and the concentrations of all VLDL particles. ApoC-III₂/apoC-III₁ had the greatest negative associations ($\beta=-0.297$, $p<0.001$; $\beta=-0.265$, $p<0.001$; $\beta=-0.267$, $p<0.001$; $\beta=-0.163$, $p<0.001$; $\beta=-0.250$, $p<0.001$; for triglycerides; total, small, medium and large VLDL particle concentrations, respectively), but all three ratios had similar regression coefficients (Fig. 2A). These effects were significant even after controlling for total apoC-III concentrations (except with medium VLDL particles), albeit with a lower magnitude (Fig. 2C), but were lost after adjusting for triglycerides (Fig. 2B). An interesting negative association between the same three ratios (apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁) and VLDL cholesterol (VLDLc) ($\beta=-0.135$, $p<0.001$; $\beta=-0.206$, $p<0.001$; $\beta=-0.160$, $p<0.001$; respectively) was also observed, although it was not independent of triglyceride levels either (data not shown).

An increase in total apoC-III was associated with a smaller VLDL size, whereas the ratios apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁ were associated with a larger VLDL size (Fig. 2A). For the ratio apoC-III₂/apoC-III₁, this association was independent of total apoC-III (Fig. 2C) but was lost when controlling for triglycerides (Fig. 2B).

LDL

Concerning the metabolism of LDL cholesterol (LDLc), total apoC-III was positively associated with LDLc ($\beta=0.214$, $p<0.001$), apoB100 ($\beta=0.399$, $p<0.001$), and total, small and medium LDL particle concentrations ($\beta=0.333$, $p<0.001$; $\beta=0.443$, $p<0.001$; $\beta=0.096$, $p=0.004$; respectively) (Fig. 2D). Except for LDLc, this effect was independent of the triglyceride concentration (Fig. 2E).

The associations of apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁ ratios were opposite to those of total apoC-III, with apoC-III₂/apoC-III₁ demonstrating the strongest negative association with LDLc ($\beta=-0.223$, $p<0.001$), apoB100 ($\beta=-0.253$, $p<0.001$) and LDL particles ($\beta=-0.246$, $p<0.001$; $\beta=-0.320$, $p<0.001$; $\beta=-0.084$, $p<0.001$ for total, small and medium LDL, respectively) (Fig. 2D). These effects remained significant after controlling for triglycerides (all the associations) (Fig. 2E) or total apoC-III (all except medium LDL particles; Fig. 2F).

Interestingly, higher levels of apoC-III were related to smaller LDL particles ($\beta=-0.199$, $p<0.001$), but a greater proportion of apoC-III₂ and apoC-III_{0f} over apoC-III₁ was associated with larger particles ($\beta=0.175$, $p<0.001$; $\beta=0.108$, $p=0.005$), which, in the case of apoC-III₂, was still significant after controlling for total triglycerides or total apoC-III.

HDL

Total apoC-III was also associated with increased HDL cholesterol (HDLc) ($\beta=0.424$, $p<0.001$), apoA-I ($\beta=0.376$, $p<0.001$) and HDL particles ($\beta=0.449$, $p<0.001$; $\beta=0.491$, $p<0.001$; $\beta=0.134$, $p=0.003$; $\beta=0.203$, $p<0.001$; for total, small, medium and large HDL particles, respectively) when regressions were adjusted for triglyceride levels (due to the strong relationship between triglycerides and HDL, both directly related to apoC-III, the magnitude and significance of some of the previous associations was only evident after adjusting for triglycerides, Fig. 2G–H).

After adjusting for triglyceride concentrations, the ratios apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁ showed the opposite trend to that of total apoC-III in

relation to apoA-I ($\beta=-0.105$, $p=0.002$ for apoC-III₂/apoC-III₁; $\beta=-0.079$, $p=0.024$ for apoC-III_{0f}/apoC-III₁) and small HDL particles ($\beta=-0.124$, $p<0.001$ for apoC-III₂/apoC-III₁ and a nonsignificant trend for apoC-III_{0f}/apoC-III₁: $\beta=-0.075$, $p=0.052$), although this trend was not independent of total apoC-III. These two ratios, together with ApoC-III_{2d}/apoC-III₁, were positively associated with medium HDL particles after adjusting for total apoC-III ($\beta=0.102$, $p=0.001$; $\beta=0.191$, $p<0.001$; $\beta=0.096$, $p=0.009$ for apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁, respectively. Figure 2H-I).

An increase in apoC-III concentrations was related to smaller HDL particles ($\beta=-0.393$, $p<0.001$ with HDL size, controlling for triglycerides), whereas increased apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁ ratios were associated with larger HDL particles ($\beta=0.226$, $p<0.001$; $\beta=0.113$, $p=0.007$, respectively, controlling for triglycerides). The association with apoC-III₂/apoC-III₁ remained significant after adjusting for total apoC-III (Fig. 2H-I).

ApoC-III, apoC-III proteoforms, and inflammation

Because of the proinflammatory role of apoC-III, the associations between apoC-III and its proteoforms and distinct markers of inflammation (hsCRP and ¹H-NMR-assessed glycoprotein signals GlycA, GlycB, and GlycF) were explored.

Strong and positive associations between apoC-III and GlycA ($\beta=0.684$, $p<0.001$), GlycB ($\beta=0.289$, $p<0.001$), and GlycF ($\beta=0.562$, $p<0.001$) (Fig. 3A) were observed, which remained significant after adjusting for triglycerides. After this adjustment, a weak negative association with hsCRP ($\beta=-0.110$, $p=0.015$) was discovered (Fig. 3B).

The apoC-III_{0b}/apoC-III₁ ratio was also positively associated with GlycA ($\beta=0.116$, $p<0.001$) and GlycB ($\beta=0.116$, $p<0.001$), and this effect was independent of triglycerides or total apoC-III. Conversely, the apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁ ratios exhibited the opposite trend in terms of their relationships with GlycA ($\beta=-0.148$, $p<0.001$; $\beta=-0.263$, $p<0.001$; $\beta=-0.211$, $p<0.001$) and GlycF ($\beta=-0.138$,

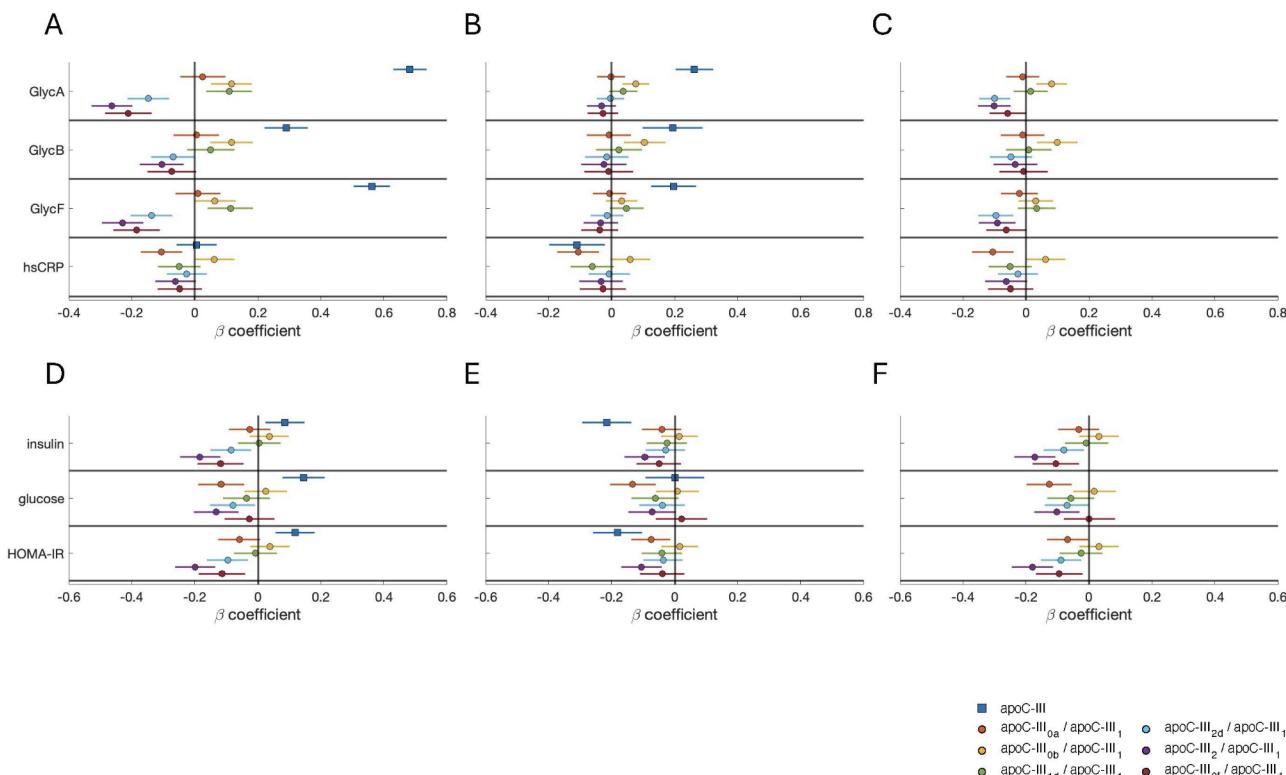


Fig. 3 Associations between apoC-III proteoforms and parameters of inflammation (A–C) and glucose metabolism (D–F). Beta coefficients and 95% confidence intervals of apoC-III or proteoform ratios (predictors) for individual multivariate linear regression models on each inflammation- or glucose-related variable (dependent variables) are shown. In each model, both the predictor and dependent variable are standardized; therefore, the coefficients indicate the SD variation in the inflammation- or glucose-related parameters for a 1 SD increase in the apoC-III or apoC-III proteoform ratio. **A:** Models were adjusted for age, sex, BMI, lipid-lowering medication, exercise, Mediterranean diet score, smoking history, and anti-inflammatory medication. **B:** Models were adjusted for confounders in A plus triglycerides. **C:** Models were adjusted for confounders in A plus apoC-III. **D:** Models were adjusted for age, sex, BMI, lipid-lowering medication, exercise, and the Mediterranean diet score. **E:** Models were adjusted for confounders in D plus apoC-III. **F:** Models were adjusted for confounders in D plus apoC-III. Apo, apolipoprotein; BMI, body mass index; HOMA-IR, homeostatic model assessment of insulin resistance; hsCRP, high-sensitivity C-reactive protein; SD, standard deviation

$p<0.001$; $\beta=-0.230$, $p<0.001$; $\beta=-0.1845$, $p<0.001$). The trends involving ratio of apoC-III_{2d} and apoC-III₂ were independent of total apoC-III, but none of them resisted the adjustment for triglycerides. The apoC-III_{0a}/apoC-III₁ ratio was negatively associated with hsCRP levels ($\beta=-0.106$, $p=0.002$) independently of triglycerides or total apoC-III, whereas the apoC-III_{0b}/apoC-III₁ ratio showed the opposite trend (Fig. 3A-C).

ApoC-III, apoC-III proteoforms, and glucose metabolism

Since apoC-III is tightly controlled by insulin and glucose and has been reported to affect the function of β cells in pancreatic islets, the relationships between apoC-III and its proteoforms and the clinical parameters of glucose metabolism were also studied. In this context, participants under treatment for type 1 or type 2 diabetes were excluded to eliminate the potential effects of drugs or insulin injection on the studied parameters.

Total apoC-III was associated with increased plasma concentrations of insulin ($\beta=0.086$, $p=0.007$) and fasting glucose ($\beta=0.145$, $p<0.001$) and, consequently, with an increased HOMA-IR index ($\beta=0.118$, $p<0.001$) (Fig. 3D). Interestingly, after adjustment for triglycerides, the association with HOMA-IR became negative ($\beta=-0.181$, $p<0.001$) (Fig. 3E).

The apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁ ratios showed the opposite association to that observed for total apoC-III in relation to HOMA-IR ($\beta=-0.096$, $p=0.003$; $\beta=-0.199$, $p<0.001$ and $\beta=-0.114$, $p=0.002$, respectively) as did apoC-III_{0a}/apoC-III₁ ($\beta=-0.060$, $p=0.077$). These relationships were independent of total apoC-III, but only apoC-III₂/apoC-III₁ and apoC-III_{0a}/apoC-III₁ were significantly associated with HOMA-IR after controlling for triglycerides (Fig. 3D-F).

Clusters of apoC-III proteoforms

The previous results were obtained from models that used only one proteoform ratio at a time. Since interesting associations were observed in more than just one proteoform ratio, we wanted to assess whether the combination of all proteoforms could characterize subgroups of people with different profiles. All 6 ratios of apoC-III proteoforms were used to cluster the data into two clusters using the k-medoids algorithm (since this number of clusters and this algorithm retrieved the best average silhouette coefficient among those tested). Only the observations with available data for all ratios were used for this analysis ($n=645$).

The PCA of all 6 ratios revealed that the two clusters were separated by principal component (PC) 1, with Cluster 1 ($n=494$) having mostly positive values and Cluster 2 ($n=151$) having negative values for PC1 (Fig. 4A). This principal component was defined by positive loadings for apoC-III_{1d}/apoC-III₁ and, with a greater magnitude, apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁ and negative values of apoC-III_{0a}/apoC-III₁ and apoC-III_{0b}/apoC-III₁ (although less important in magnitude) (Fig. 4B). Therefore, high values of the three proteoform ratios that were associated with a more protective profile (in terms of lipids, lipoproteins, biomarkers of inflammation, and glucose metabolism, according to the results from the previous section) defined Cluster 2, whereas low values of these proteoform ratios defined Cluster 1.

Compared with those in Cluster 2, the participants in Cluster 1 were older ($p=0.002$) and had a higher BMI ($p<0.001$), as well as a higher proportion of individuals treated with anti-inflammatory drugs ($p=0.045$) or insulin ($p=0.007$) (Table S1); therefore, subsequent analyses were performed taking into account these potential confounders.

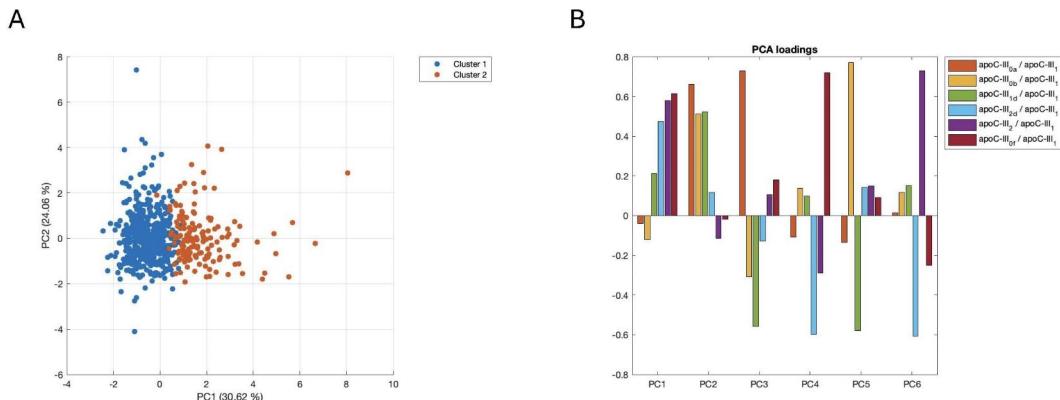


Fig. 4 Clusters of apoC-III proteoforms. **A:** PCA of the study sample (only observations with data available for all proteoform ratios, $n=645$) generated via the 6 apoC-III proteoform ratios showing the two clusters. **B:** PCA loadings of the 6 principal components. Apo, apolipoprotein; PC, principal component; PCA, principal component analysis

Lipid metabolism, inflammation, and glucose metabolism parameters were compared across the two clusters (Table 2). Compared with those in Cluster 2, participants in Cluster 1 presented higher triglyceride ($p<0.001$), apoC-III ($p<0.001$), VLDLc ($p<0.001$), and VLDL particle ($p=0.002$) concentrations. LDLc ($p=0.001$), apoB100 ($p=0.003$), and the concentration of LDL particles ($p=0.002$) were also higher in Cluster 1. In addition, Cluster 1 displayed increased levels of small LDL particles ($p<0.001$) and a smaller mean LDL size ($p=0.001$). Cluster 2 had higher concentrations of medium HDL particles ($p<0.001$) and larger HDL particles ($p=0.003$).

With respect to glucose metabolism and inflammation, Cluster 1 had increased insulin resistance, as assessed by HOMA-IR ($p=0.008$), and the ¹H-NMR-assessed biomarkers of inflammation, GlycA, and GlycF were also higher in Cluster 1 ($p<0.001$ and $p=0.003$, respectively) than in Cluster 2 (Table 2).

Since the above results for lipids, glucose metabolism, and inflammation clearly revealed one cluster with a worse metabolic and inflammatory profile, we studied whether there were any differences in the prevalence of several metabolic conditions across the two clusters. We found a greater prevalence of obesity ($p=0.001$), metabolic syndrome ($p=0.013$), and T2DM ($p=0.022$) within Cluster 1. Surprisingly, the history of cardiovascular events was higher in Cluster 2 ($p=0.009$) (Table 3).

Discussion

In the present study, we were able to quantify seven different apoC-III proteoforms in more than 800 individuals from a subgroup of the Di@bet.es cohort and assess their relationship with a complete set of parameters related to cardiovascular risk.

Lipoprotein profile

In terms of lipid metabolism, we observed that three proteoform ratios (apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁, and apoC-III_{0f}/apoC-III₁) displayed the opposite behavior to that of total apoC-III since they were associated with lower levels of triglycerides and LDLc, as well as their transport particles (VLDL and LDL) and apoB100. Notably, the strongest association between these three ratios and LDL particles was found with the atherogenic small LDL subtype, a hallmark of diabetic dyslipidemia [30, 31] and associated with a higher risk of CVD [32]. This feature was again opposed to those of total apoC-III. While the associations with triglyceride-related parameters were dependent on total triglyceride concentrations, the negative association with LDLc and LDL particles was, in part, independent of triglycerides. This finding is especially relevant in the case of reduced small LDL particles, a subtype that is normally a consequence of increased triglyceride concentrations [33]

and highlights the importance of apoC-III glycosylation beyond its effects on triglyceride metabolism. Some of these protective proteoform ratios were negatively correlated with total apoC-III (Supplemental Figure S1). However, the observed associations were in part independent of apoC-III levels, which indicated that they were not completely driven by the lower apoC-III levels associated with these proteoforms and emphasized the importance of glycosylation.

The literature on the associations between minor apoC-III proteoforms (apoC-III_{1d}, apoC-III_{2d}, and apoC-III_{0f}) and lipid or lipoprotein parameters is scarce, and most of the available studies analyze the four main proteoforms with a focus on the apoC-III₂/apoC-III₁ ratio. Our results on these proteoforms and triglyceride metabolism are in line with those reported from previous studies on people without diabetes [15, 34], with prediabetes or diabetes [16], with hypertriglyceridemia and receiving apoC-III-lowering therapy [18] or in the MESA cohort [20]. Yassine et al. reported that the ratios of apoC-III_{0a}, apoC-III_{0b}, and apoC-III₁ to apoC-III₂ were positively correlated with fasting triglycerides, which supports our findings that higher apoC-III₂ and/or lower apoC-III₁ were associated with fewer triglycerides and VLDL. We were unable to find such clear associations regarding the proportion of apoC-III_{0a} and apoC-III_{0b}, but in our results, we normalized these proteoforms by apoC-III₁, and in the mentioned article, the ratios are computed to apoC-III₂. These results suggest that apoC-III_{0a} and apoC-III_{0b}, as well as apoC-III₁, are directly related to triglycerides, which, in our method, could mask the associations between the ratios of these proteoforms and triglycerides. Koska et al. showed that both triglycerides and LDLc are strongly and negatively correlated with the ratio of apoC-III₂/apoC-III₁, which is in agreement with the trends found in our study regarding these proteoforms. This protective role of a greater relative proportion of apoC-III₂ that we and others have observed in relation to triglyceride metabolism could be explained by less efficient interference with TRL uptake by the liver [35] or less inhibition of LPL activity [16].

The strong relationship between apoC-III₂/apoC-III₁ and fewer small LDL particles (or a larger mean LDL size) that we observed was also reported in the above-mentioned study, also in an apoC-III-independent fashion [16]; and, in Mendoza et al., apoC-III₂ was the only proteoform that was not related to a decreased LDL size [17]. However, other studies have shown a negative association between the apoC-III₂ production rate and LDL size [36]. Further research with comparable proteoform metrics (ratios, absolute concentrations, and kinetic metrics) is needed to understand the full picture of the relationship between apoC-III proteoforms and LDL size.

Table 2 Lipid, lipoprotein, glucose, and inflammation-related differences between cluster 1 and 2

	Cluster 1 (n=494)	Cluster 2 (n=151)	p value
triglycerides, mg/dL	130.20 (95.66-177.15)	96.55 (71.74-137.29)	0.004
HDLc, mg/dL	47.56 (40.22-56.07)	51.43 (41.57-59.55)	0.470
LDLc, mg/dL	111.78±29.15	102.85±30.43	0.006
VLDLc, mg/dL	41.38 (34.80-48.72)	37.51 (31.42-45.15)	0.004
Lp(a), mg/dL	13.04 (4.52-37.68)	12.77 (4.55-34.61)	0.384
apoB100, mg/dL	93.22±13.83	89.42±14.13	0.007
apoA-I, mg/dL	122.28 (103.77-146.66)	130.54 (109.84-153.50)	0.904
apoE, mg/dL	4.04 (3.58-4.63)	4.06 (3.48-4.59)	0.382
apoC-III, mg/dL	10.12 (8.12-12.72)	8.99 (6.87-11.45)	0.004
VLDLP, nmol/L	54.07 (35.66-81.43)	37.61 (29.20-58.86)	0.006
S-VLDLP, nmol/L	47.76 (30.99-73.52)	32.80 (25.65-51.10)	0.006
M-VLDLP, nmol/L	4.59 (3.36-6.09)	3.79 (2.68-4.92)	0.116
L-VLDLP, nmol/L	1.44 (1.07-2.02)	1.12 (0.83-1.53)	0.058
LDLP, nmol/L	1460.25±280.25	1380.63±265.43	0.007
S-LDLP, nmol/L	828.41 (733.71-937.63)	764.43 (681.74-847.47)	<0.001
M-LDLP, nmol/L	413.73±136.88	416.25±140.62	0.705
L-LDLP, nmol/L	191.89±38.46	192.70±38.49	0.730
HDLP, μmol/L	27.47 (24.47-30.58)	28.28 (25.57-31.23)	0.884
S-HDLP, μmol/L	18.63±4.01	18.63±4.08	0.387
M-HDLP, μmol/L	8.92 (8.06-9.75)	9.38 (8.54-10.45)	0.005
L-HDLP, μmol/L	0.28 (0.25-0.31)	0.28 (0.25-0.30)	0.528
VLDL size, nm	41.88 (41.62-42.13)	42.01 (41.75-42.22)	0.120
LDL size, nm	20.96 (20.70-21.15)	21.07 (20.83-21.28)	0.007
HDL size, nm	8.25 (8.20-8.30)	8.27 (8.23-8.33)	0.007
fasting insulin, mIU/L	9.16 (6.38-13.10)	6.44 (4.96-8.19)	0.010
fasting glucose, mg/dL	99.00 (90.36-112.45)	94.41 (86.04-105.39)	0.096
HOMA-IR	2.29 (1.54-3.45)	1.51 (1.13-2.04)	0.016
GlycA, μmol/L	734.14 (646.91-851.53)	660.54 (596.33-783.84)	0.002
GlycB, μmol/L	258.34 (227.31-296.65)	250.97 (215.50-287.38)	0.465
GlycF, μmol/L	293.12 (258.72-330.04)	273.93 (236.92-312.41)	0.006
hsCRP, mg/L	2.21 (1.07-4.68)	1.76 (0.72-3.60)	0.393

The mean±standard deviation is reported for variables that are normally distributed in both clusters, and the median (quartile 1-quartile 3) is reported for variables that are nonnormally distributed in at least one cluster. P values were calculated via ANCOVA with age and BMI as covariates (for all variables except inflammation-related variables) and age, BMI, and anti-inflammatory medication for GlycA, GlycB, GlycF, and hsCRP; and further corrected for multiple comparisons via the Benjamini and Hochberg procedure with a false discovery rate threshold of 5%. Participants with T1DM or previously diagnosed T2DM were excluded from the models for glucose, insulin, and HOMA-IR. Apo, apolipoprotein; HDL, high-density lipoprotein; HDLc, HDL cholesterol; HDLP, HDL particle concentration; HOMA-IR, homeostatic model assessment of insulin resistance; hsCRP, high-sensitivity C-reactive protein; L-HDLP, large HDL particle concentration; L-LDLP, large LDL particle concentration; L-VLDLP, large VLDL particle concentration; LDL, low-density lipoprotein; LDLc, LDL cholesterol; LDLP, LDL particle concentration; Lp(a), lipoprotein (a); M-HDLP, medium HDL particle concentration; M-LDLP, medium LDL particle concentration; M-VLDLP, medium VLDL particle concentration; VLDL, very low-density lipoprotein; VLDLc, VLDL cholesterol; VLDLP, VLDL particle concentration; S-HDLP, small HDL particle concentration; S-LDLP, small LDL particle concentration; S-VLDLP, small VLDL particle concentration T1DM, T2DM,

Table 3 Prevalence of metabolic disorders across the clusters defined by apoC-III proteoforms

	Cluster 1	Cluster 2	p value
Prediabetes	116 (25.72%)	26 (20.97%)	0.277
Type 2 diabetes	87 (19.29%)	13 (10.48%)	0.022
CVD	100 (20.24%)	46 (30.46%)	0.009
obesity	210 (42.86%)	42 (28.19%)	0.001
metabolic syndrome	288 (60.63%)	70 (48.95%)	0.013
hypertension	304 (61.91%)	81 (53.64%)	0.07

The number of observations and percentage are reported for each outcome. P values were computed via the chi-square test. For the prevalence of prediabetes and type 2 diabetes, those participants with T1DM or previously diagnosed with T2DM were excluded. CVD, cardiovascular disease

Figure titles and legends

In relation to HDL, we observed a clear positive association of total apoC-III with HDLc and HDL particles after adjusting for triglycerides. This relationship may seem counterintuitive because of the known association of apoC-III with a more proatherogenic lipid profile, but it could be explained by the presence of apoC-III on the surface of HDL particles and, after controlling for triglyceride levels (which impact the HDL particle composition [33]), apoC-III and HDL were directly related, as previously observed in the MESA cohort [20]. ApoC-III₂/apoC-III₁ and apoC-III_{0f}/apoC-III₁ were associated with decreased small HDL and a larger mean HDL size. This finding is consistent with the protective lipid profile associated with these proteoform ratios that we observed regarding the LDL and VLDL parameters since small and dense HDL are a hallmark of diabetic dyslipidemia, and a larger HDL size is related to reduced cardiovascular risk [37]. However, HDL size is a controversial parameter: most of the published results on HDL size and cardiovascular risk are not independent of HDLc or other traditional risk factors, and some studies even reported opposite associations with cardiovascular mortality [38]. Here, we also observed an association of these proteoforms with medium HDL independent of the total apoC-III concentration, which should be further studied. Other studies showed that apoC-III₂ was also associated with increased HDLc and that apoC-III₁ was associated with decreased HDLc, which supports the suggested protective role of the apoC-III₂/apoC-III₁ ratio [20, 34]; however, in our study, we did not observe such associations.

Inflammation

While total apoC-III was undoubtedly associated with more inflammation when assessed by GlycA, GlycB, or GlycF, there was no association between apoC-III and hsCRP (and it was even negative after controlling for triglycerides). This finding is in line with previous data from our group, where iPCSK9 therapy resulted in a parallel decrease in apoC-III and glycoprotein signals, while no such association was observed with hsCRP [39].

The negative associations between apoC-III_{2d}/apoC-III₁, apoC-III₂/apoC-III₁, and apoC-III_{0f}/apoC-III₁ and ¹H-NMR-glycoprotein signals are explained by plasma triglycerides, and the positive relationship between glycoprotein signals and total apoC-III was also diminished when adjusting for triglycerides (although it remained significant). This result was expected because of the pro-inflammatory nature of triglycerides and their high correlation with glycoproteins. However, the positive association of apoC-III_{0b}/apoC-III₁ with GlycA and GlycB seemed to be partly independent of triglyceride concentrations and total apoC-III. The apoC-III_{0a}/apoC-III₁ ratio was the only ratio that was associated with lower hsCRP, whereas the ratio of the other proteoform with no sialic acids, apoC-III_{0b}/apoC-III₁, showed the opposite trend, suggesting that not only sialic acids but also the GalGalNAc moiety is related to differential associations among apoC-III proteoforms.

To the best of our knowledge, we are among the first group to report associations between apoC-III proteoforms and ¹H-NMR-assessed glycoprotein signals, and most importantly, these associations were partly independent of total apoC-III concentrations.

Glycoproteins are strongly related to cardiometabolic risk [40, 41] and are predictors of CVD [42] and T2DM [43]. Accordingly, the same proteoforms that are associated with a more protective lipid profile also show negative regression coefficients with GlycA, GlycF and, to a lesser extent, GlycB. However, Hiukka et al. [13] reported that, compared with other proteoforms, apoC-III₂ stimulated greater secretion of proinflammatory cytokines in vitro; this finding could also be explained by the different types of inflammation that are assessed and the methodology used, although further research on the role of apoC-III glycosylation in inflammation should be performed, including a greater number of biomarkers of inflammation, to fully understand its implications.

Glucose metabolism

Few glucose homeostasis biomarkers are available in our cohort, but the same protective proteoform ratios were found to be associated with reduced insulin resistance, in agreement with the lipid profile associated with these proteoforms. ApoC-III_{0a}/apoC-III₁ also showed a similar coefficient with HOMA-IR, which was less expected because, in general, it exhibited a trend towards a more dyslipidaemic lipid profile and a significant association with the small LDL subclass; but, conversely, it was also related to less inflammation, as assessed by hsCRP. The literature provides similar results in relation to fasting glucose in the MESA cohort [20] and in people with diabetes [16]. In addition, the present results revealed that the associations between these proteoforms and

insulin resistance were again independent of total apoC-III concentrations.

The analyses performed in all three areas (lipid metabolism, inflammation, and glucose homeostasis) revealed protective associations among the three proteoform ratios. Nevertheless, multivariate models including all proteoform ratios confirmed an independent effect of apoC-III₂/apoC-III₁ but suggested that the associations of apoC-III_{2d}/apoC-III₁ and, to a lesser extent, apoC-III_{0f}/apoC-III₂ were dependent on the apoC-III₂/apoC-III₁ ratio (data not shown).

ApoC-III proteoform clusters

Measuring and analyzing as many as seven apoC-III proteoforms allowed us to identify more proteoforms associated with a protective lipid profile than those previously reported. The PCA loadings showed that the three protective proteoform ratios (all three in the same direction) were the variables that contributed the most to the unsupervised clustering of the sample by the k-medoids algorithm, splitting the population into one small cluster with high values and another greater cluster with smaller values of these ratios. As expected, they differed in most of the lipid, lipoprotein, inflammation, and glucose homeostasis parameters that were already associated with these ratios and clearly showed a more proatherogenic profile of Cluster 1 versus a more protective profile of Cluster 2, which translated to a higher prevalence of metabolic disorders in Cluster 1.

Surprisingly, the history of cardiovascular events was significantly lower in the first cluster. In the literature, similar findings have been reported in the MESA cohort, where apoC-III₂/apoC-III₁ shows a positive association and apoC-III_{0b}/apoC-III₁ shows a negative association with the risk of PAD [21] and CVD [20], and several studies have linked the presence of sialic acid in plasma with greater inflammation and CVR [44–46]. In other studies, a lower incidence of MACE has been reported in people with a greater apoC-III₂/apoC-III₁ ratio in a triglyceride-dependent fashion [16]. However, given that all cardiovascular risk factors were decreased in Cluster 2, the observed higher prevalence of CVD in this cluster might be due to certain confounders, such as treatment (see below).

ApoC-III proteoforms and lipid-lowering and anti-inflammatory therapies

Lipid-lowering therapies and antidiabetic treatment can alter the proportion of apoC-III proteoforms towards a higher apoC-III₂/apoC-III₁ ratio [16, 47, 48], and we observed that people under either lipid-lowering or anti-inflammatory medications showed increased proportions of some of the protective proteoform ratios (Supplemental Figure S2 A-B). In our case, we cannot rule out

the possibility that our finding for CVD prevalence was affected by treatment. A similar situation might occur regarding the prevalence of T2DM: Cluster 2 showed a lower prevalence of T2DM when we excluded treated diabetes from the analysis (Table 3), but we observed no significant differences when we also included people with treated diabetes (data not shown), who had increased ratios of protective proteoforms and were classified into Cluster 2 (Supplemental Figure S2 C-E).

Overall, the results of the present study provide information on proteoforms that are not usually studied (apoC-III_{1d}, apoC-III_{2d}, and apoC-III_{0f}) and complete the existing knowledge on previously studied proteoforms by assessing their relationship with advanced biomarkers (the complete lipoprotein profile and ¹H-NMR-measured Glyc concentrations). Owing to the study design, the associations observed throughout the study do not imply a causal role of proteoform ratios on the studied parameters. The fact that differences in proteoform ratios exist between treatment groups could suggest that, to some extent, the proteoform composition might be a consequence of the metabolic state. Conversely, other evidence from in vitro and mechanistic studies supports a direct effect of proteoform composition on some of the studied roles, as discussed above. To gain a deeper understanding of the physiological role and mechanisms of action of the different apoC-III proteoforms, further research in more controlled environments, such as in vitro systems or animal models, could complement the present findings. Another limitation of the study is the great variability of the study sample in the prevalence and duration of exposure to metabolic disorders and treatments, and despite robust control for covariates, other confounders that are not collected in our dataset may be important. From a clinical perspective, the study of the potential therapeutic implications of the observed results, i.e., different responses to triglyceride-lowering treatments depending on the proteoform distribution, would be of interest. Additionally, for future large cohort studies on apoC-III proteoforms or to consider any application in a clinical environment, a faster and simpler way to detect the most informative proteoforms would be highly useful.

Conclusions

In conclusion, our results support the importance of measuring not only apoC-III but also the relative proportions of its proteoforms, since similar levels of total apoC-III could be related to very different lipid profiles in people with different distributions of apoC-III proteoforms, not only in relation to lipoprotein metabolism but also inflammation and glucose metabolism.

Abbreviations

apo	Apolipoprotein
BMI	Body mass index

CVD	Cardiovascular disease
Fuc	Fucose
Gal	Galactose
GalNAc	N-acetylgalactosamine
¹ H-NMR	Proton nuclear magnetic resonance
HDL	High-density lipoprotein
HDLc	HDL cholesterol
HDLP	HDL particle concentration
HL	Hepatic lipase
HOMA-IR	Homeostatic model assessment of insulin resistance
hsCRP	High-sensitivity C-reactive protein
L-HDLP	Large HDL particle concentration
L-LDLP	Large LDL particle concentration
L-VLDLP	Large VLDL particle concentration
LDL	Low-density lipoprotein
LDLc	LDL cholesterol
LDLP	LDL particle concentration
Lp(a)	Lipoprotein (a)
LPL	Lipoprotein lipase
M-HDLP	Medium HDL particle concentration
M-LDLP	Medium LDL particle concentration
M-VLDLP	Medium VLDL particle concentration
PC	Principal component
PCA	Principal component analysis
S-HDLP	Small HDL particle concentration
S-LDLP	Small LDL particle concentration
S-VLDLP	Small VLDL particle concentration
T1DM	Type 1 diabetes
T2DM	Type 2 diabetes
TRL	Triglyceride-rich lipoprotein
VLDL	Very low-density lipoprotein
VLDLc	VLDL cholesterol
VLDLP	VLDL particle concentration

Supplementary Information

The online version contains supplementary material available at <https://doi.org/10.1186/s12933-024-02531-5>.

Supplementary Material 1

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Author contributions

MG, JR, JG, and PR were responsible for the conception and design of the work. GR, RR, YE, PR, HB, and GG-A acquired the data. PR, JG, EO, HB, GG-A, MG, and JR analyzed the data. PR, JG, MG, JR, GG-A, HB, AG-L, and NA interpreted the data. PR, JG, MG, and JR drafted the manuscript. JR, JG, MG, and GG-A revised the manuscript. All authors approved the final version of the manuscript.

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Data availability

The datasets used and analyzed during the current study are available from the corresponding author upon reasonable request.

Declarations

Ethics approval and consent to participate

The research was carried out in accordance with the Declaration of Helsinki (WHO 2011) of the World Medical Association. Written informed consent was obtained from all the participants. The study was approved by the Ethics and Clinical Investigation Committee of the Hospital Regional Universitario de Málaga (Malaga, Spain) in addition to other regional ethics and clinical investigation committees all over Spain.

Consent for publication

Not applicable.

Competing interests

N.A. is a stock owner of Biosfer Teslab and has a patent on the method for lipoprotein profiling described in the present manuscript.

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