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# **PNPLA3** rs738409 and Risk of Fibrosis in NAFLD: Exploring Mediation Pathways Through Intermediate Histological Features

Eduardo Vilar-Gomez<sup>1</sup>, Carlos J. Pirola<sup>2</sup>, Silvia Sookoian<sup>2</sup>, Laura A. Wilson<sup>3</sup>, Tiebing Liang<sup>1</sup>, Naga Chalasani<sup>1</sup>

<sup>1</sup>Department of Medicine, Division of Gastroenterology and Hepatology, Indiana University School of Medicine, Indianapolis, IN, US.

<sup>2</sup>Molecular Genetics and Biology of Complex Diseases and Department of Clinical and Molecular Hepatology, Institute of Medical Research (IDIM), University of Buenos Aires-National Scientific and Technical Research Council (CONICET), Ciudad Autonoma de Buenos Aires, Argentina.

<sup>3</sup>Johns Hopkins Bloomberg School of Public Health, Baltimore, MD

# Abstract

**Background & Aims**—It is unclear whether rs738409 (p.I148M) missense variant in patatinlike phospholipase domain-containing 3 (*PNPLA3*) rs738409 promotes fibrosis development by triggering specific fibrogenic pathways or by creating an unfavorable microenvironment by promoting steatosis, inflammation, and ultimately fibrosis. We tested the hypothesis that intermediate histologic traits, including steatosis, lobular and portal inflammation, and ballooning may determine the effect of rs738409 on liver fibrosis among individuals with biopsy-proven NAFLD.

**Corresponding Author:** Naga Chalasani, MD, Indiana University School of Medicine, 702 Rotary Circle, Suite 225, Indianapolis, IN 46202, nchalasa@iu.edu, Fax: + 1-317-278-1949. EVG, CJP, SS, and NC contributed equally

Contributions

All authors made substantial contributions to the intellectual content of the paper and approved the final version of the manuscript. Conception and design: Chalasani, Vilar-Gomez, Sookoian, Pirola.

Acquisition of data: Wilson, Chalasani, Vilar-Gomez, Liang.

Analysis and interpretation of data: Chalasani, Vilar-Gomez, Sookoian, Pirola, Wilson.

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Statistical analysis: Vilar-Gomez, Pirola.

Obtaining funding: Chalasani.

Supervision: Chalasani.

Naga Chalasani, MD had full access to all the data in the study and takes responsibility for the integrity of the data and the accuracy of the data analysis.

Conflicts of Interests

There are none for this paper. For full disclosure, Dr. Chalasani has ongoing paid consulting activities (or had in the preceding 12 months) with Abbvie, Madrigal, Zydus, Galectin, Altimmune, Boehringer-Ingelheim, Lilly, and Foresite. These consulting activities are generally in the areas of nonalcoholic fatty liver disease and drug hepatotoxicity. Dr. Chalasani receives research grant support from Exact Sciences, DSM, and Galectin Therapeutics where his institution receives the funding. Drs. Vilar-Gomez, Sookoian, Pirola, Wilson, Liu, and Liang have nothing to disclose.

Code availability

The source macro "PROCESS" used in our causal mediation analysis to generate results included in all Tables and Figures of the manuscript can be downloaded from the following link: http://processmacro.org/download.html

Version 4.0 of PROCESS operates on both Windows and Mac versions of SPSS and SAS. PROCESS for SPSS requires SPSS version 19 or later but works best on versions 22 and above. PROCESS for SAS requires PROC IML. PROCESS for R was written in R base 3.6.1 and requires no additional packages.

**Approach and Results**—Causal mediation models including multiple mediators in parallel or sequentially were performed to examine the effect of rs738409, by decomposing its total effect on fibrosis severity into direct and indirect effects, mediated by histology traits in 1153 Non-Hispanic White (NHW) patients. Total effect of rs738409 on fibrosis was  $\beta$ =0.19 (95% CI: 0.09–0.29). The direct effect of rs738409 on fibrosis upon removing mediators' effects was  $\beta$ =0.09 (95% CI: 0.01–0.17) and the indirect effect of rs738409 on fibrosis through all mediators' effects were  $\beta$ =0.010 (95% CI: 0.04–0.15). Among all mediators, the greatest estimated effect size was displayed by portal inflammation ( $\beta$ =0.09, 95% CI: 0.05–0.12). Among different sequential combinations of histology traits, the path including lobular inflammation followed by ballooning degeneration displayed the most significant indirect effect ( $\beta$ =0.023, 95% CI: 0.011–0.037). Mediation analysis in a separate group of 404 individuals with biopsy-proven NAFLD from other races and ethnicity showed similar results.

**Conclusions**—In NAFLD, nearly half of the total effect of the rs738409 G allele on fibrosis severity could be explained by a direct pathway, suggesting that rs738409 may promote fibrosis development by activating specific fibrogenic pathways. A large proportion of the indirect effect of rs738409 on fibrosis severity is mediated through portal inflammation.

#### **Graphical Abstract**





#### **Keywords**

*PNPLA3* rs738409; nonalcoholic fatty liver disease; fibrosis; steatosis; portal inflammation; mediation analysis

#### Introduction

The rs738409 (p.I148M) missense variant in patatin-like phospholipase domain-containing 3 (*PNPLA3*) has consistently been associated with an increased risk of fatty liver, steatohepatitis, fibrosis, cancer, and liver-related mortality, and these associations are independent of body mass index (BMI), age, sex, and insulin resistance. (1–6) Despite the unquestionable association of rs738409 with NAFLD and its severity, the molecular mechanisms through which this variant may lead to hepatic advanced fibrosis remain unclear. There has been an intense debate on whether rs738409 promotes fibrosis

development by triggering specific fibrogenic pathways or by creating a favorable microenvironment by promoting steatosis, inflammation, and ultimately fibrosis. (7) Some recent studies have shed light on the molecular and physiological implications of rs738409 in the liver. *In-vitro* studies have shown that the PNPLA3 protein has triacylglycerol hydrolase, acyltransferase, and transacylase activities, which promote lipid droplet remodeling in hepatocytes and hepatic stellate cells. (8, 9) The rs738409 has been associated with reduced fatty acid hydrolysis and impaired mobilization of triglycerides (TG), resulting in TG accumulation in the liver. (8–15)

The natural history of NAFLD is not uniform across the affected individuals, and the presence and the severity of intermediate histologic traits might explain partly the clinical phenotypic variability of the disease. (16–18) Hepatocellular ballooning is believed to be an important determinant of worse histologic phenotypes, including liver cirrhosis. (19) Likewise, the increased portal (20) and lobular inflammation (21) have been associated with an increased risk of progressive disease.

Here, we contrasted the hypothesis that intermediate histologic traits, including steatosis, lobular and portal inflammation, and hepatocyte ballooning degeneration may be determinants of the effect of rs738409 on liver fibrosis. Thus, we sought to test the model in which the rs738409 variant is the exposure variable and histologic steatosis, lobular and portal inflammation, ballooning are the mediators of the fibrosis severity as the outcome. To test this assumption, we used a causal mediation analysis that can quantify the proportion of direct or indirect (via histologic intermediate traits) exposure effects on the outcome of interest. Since other metabolic features may confound the relationship between rs738409 and all histology scores, all our mediation analyses were controlled for BMI, diabetes, and other relevant confounders.

### **Material and Methods**

#### Study design and patient population

A detailed description of the study design and individuals included in this cross-sectional analysis has been published elsewhere. (22, 23) Briefly, adults 18 years with biopsyconfirmed NAFLD were prospectively recruited at 9 medical centers across the U.S. and enrolled in different studies conducted by the National Institute of Diabetes and Digestive and Kidney Diseases (NIDDK)-sponsored Nonalcoholic Steatohepatitis Clinical Research Network (NASH CRN) including NAFLD Adult Database 1, NAFLD Adult Database 2 (clinicaltrial.gov identifier: NCT01030484) and PIVENS (Pioglitazone vs Vitamin E vs Placebo for Treatment of Non-Diabetic Patients With Nonalcoholic Steatohepatitis) (clinicaltrial.gov identifier: NCT00063622) and FLINT (The Farnesoid X Receptor Ligand Obeticholic Acid in NASH Treatment) (clinicaltrial.gov identifier: NCT01265498) trials. (24-26) After excluding participants with excessive alcohol consumption (>7 and >14 standard drinks per week for women and men, respectively), other causes of chronic liver disease, history of total parenteral nutrition, biliopancreatic diversion or bariatric surgery, short bowel syndrome, suspected or confirmed hepatocellular carcinoma, and positivity for HIV, our study population comprised 1557 individuals who had complete information on central review of liver histology and rs738409 genotyping through July 2019. All study

protocols were approved by the Institutional Review Board of each participating center, and all participants provided written informed consent. More details on our study design and participants can be found in the Supplemental Material.

#### Assessment and Definitions of Exposure, Mediator, Outcome, and Relevant Confounders

**Exposure variable: the rs738409 variant**—DNA samples from 1557 were analyzed; rs738409 was successfully genotyped in 100% of the samples. All samples were blindly duplicated to assess the reproducibility of the genotype, and reproducibility of 100% was obtained. The association between rs738409 and mediators/outcome was explored using an additive model (CC, CG, GG) of inheritance. A description of the rs738409 genotyping method is available in the Supplemental Material.

**Mediators and Outcome variables: Liver histology scores**—All liver biopsies were centrally read in a blinded fashion by the pathology committee of the NASH CRN as described previously. (27) NAFLD was defined as 5% of hepatocytes containing macrovesicular fat. Liver histology reports were based on the NASH CRN Scoring System, which assesses the severity of steatosis (0–3), lobular inflammation (0–2), hepatocyte ballooning degeneration (0–2), portal inflammation (0–2), and fibrosis (0–4). (27, 28) Fibrosis severity was considered the outcome of interest, whereas steatosis, lobular inflammation, hepatocyte ballooning degeneration, and portal inflammation were considered the mediators.

**Statistical analysis**—Before testing for mediation, potential correlations, and collinear effects between potential mediators (steatosis, lobular inflammation, hepatocyte ballooning degeneration, and portal inflammation) and fibrosis severity were checked using the multivariable linear regression models. The tolerance and the variance inflation factor (VIF), two collinearity diagnostic factors, were used to identify multicollinearity between mediators and the outcome. A small tolerance value, typically less than 0.1, might suggest strong multicollinearity. Although there is no formal VIF value for determining the presence of multicollinearity, VIF values that exceed 2.5 are often regarded as indicating multicollinearity. (29, 30)

Two different mediation models including either multiple mediators in parallel or sequentially were conducted to examine the effect of rs738409, by decomposing its total effect on fibrosis severity into direct and indirect effects, mediated by steatosis, lobular inflammation, ballooning, and portal inflammation. Regarding the analysis examining the effect of including mediators sequentially, we considered the inclusion of up to two consecutive histology traits (ie., steatosis  $\rightarrow$  lobular inflammation, steatosis  $\rightarrow$  ballooning, lobular inflammation  $\rightarrow$  ballooning, etc.) The inclusion of 3 or more sequential traits did not improve model predictions (results are not shown). Overall, a mediation model displays 3 main types of path-specific estimates: 1) direct effect (represents the direct effect of rs738409 on fibrosis score, not operating through mediators "steatosis, lobular and portal inflammation and ballooning degeneration scores"), 2) indirect effect (represents the effect of rs738409 on fibrosis score that operates through mediators), 3) total effect (represents the sum of direct and indirect effects of rs738409 on fibrosis score). (31) Since age, gender,

BMI, type 2 diabetes mellitus (T2DM), non-heavy alcohol intake, and other genetic variants (*HSD17B13* rs72613567, *TM6SF2* rs58542926, *MBOAT7* rs641738) may be significantly associated with both the mediators and the outcome, all mediation analyses were adjusted by these relevant confounding factors.

Standardized regression coefficients express effect size measurements for total, direct, and indirect paths. Statistical significance for the total, natural direct, and natural indirect effects of rs738409 genotypes on fibrosis scores were determined using 95% bootstrap bias-corrected confidence intervals (CIs) based on 10,000 bootstrap samples. (32, 33) If the 95% bias-corrected CIs do not contain zero, the associations are considered significant. No missing observations were handled in our analyses. The mediation effects were estimated by linear regression-based mediation using the *PROCESS* macro, version 4.0, models 4 (parallel mediation) or 6 (sequential mediation), in SPSS (Version 27; Chicago, IL, USA). (33) The acyclic graphic or causal diagram (Suppl. Figure 1) shows our hypothesized associations between exposure, mediators, outcome, and relevant confounders. In the diagram, the indirect "mediation" effect is represented by the path from exposure to the outcome via the mediator (path a x path b). It expresses the fraction of the exposure effect that is mediated through a specific mediator. Mediation effects can be either positive or negative, depending on the signs of the *a* and *b* effects. When *a* is positive and *b* is negative, the mediation effect becomes negative. Path c represents the direct effect whereas the total effect is c'(c + a x b). Additional details regarding our mediation models are given in the Supplemental Material.

Because our study population mostly comprised non-Hispanic (NH) White participants, the main analysis was performed in this ethnic group. However, to reproduce our results, a sensitivity analysis was conducted in a cohort including other races and ethnicities (n=404). A description of our selected cohort of NH-White has been previously published. (22, 23)

Monte Carlo power analyses as recommended by Schoemann et al. (34) with 10,000 repetitions, 20,000 Monte Carlo draws, and a 95% confidence interval, indicated 400 participants were needed to achieve between 0.79 and 0.84 statistical powers to detect a significant indirect effect in our model including 4 mediators in parallel. More details are given in Supplemental Material.

**Data availability statement**—Data used in this study are deposited to the data coordinating center of the Nonalcoholic Steatohepatitis Clinical Research Network. Data can be made available by submitting a request to the NASH CRN data coordinating center, at https://jhuccs1.us/nash/ in compliance with its data-sharing policies and procedures.

# Results

Most of the participants were NH-White (n=1153, 74%), followed by Hispanic (n=156, 10%), NH-Asian (n=106, 7%), NH-Black (n=52, 3%) and other or multiracial (n=90, 6%). Among all participants, rs738409 genotypes were distributed as follows: CC (n=490, 31%), CG (n=680, 44%) and GG (n=387, n=25%). The average age and BMI were 48.5 years (SD=11.5) and 34.4 kg/m<sup>2</sup> (SD=6.4) with 64% (n= 989) being female, 36% (n=560)

had a history of T2DM and 36% (n=567) being classified as non-heavy drinker. Table 1 summarizes the baseline characteristics of the study population, including the NH-White cohort.

Even though all individual histological scores were independently correlated with the fibrosis score even after controlling for important confounders, we did not find relevant multicollinearity issues in the multiple linear regression analysis. The tolerance and the variance inflation factor, two collinearity diagnostic factors, were typically greater than 0.1 and less than 2.5, respectively (Table 2). (29)

#### Relationship between rs738409 and mediators (histology scores)

**NH-White population (n=1153)**—We detected positive and significant relationships between rs738409 and steatosis ( $\beta$ =0.11, 95% CI: 0.05–0.18), and lobular ( $\beta$ =0.09, 95% CI: 0.04–0.15) and portal ( $\beta$ =0.11, 95% CI: 0.06–0.16) inflammation, signifying that rs738409 increases the risk of steatosis and portal and lobular inflammation, but not ballooning degeneration ( $\beta$ =0.03, 95% CI: –0.04 to 0.10) (Paths *a* on the Figure 1A).

Other racial and ethnic groups (n=404)—The rs738409 was positively associated with steatosis ( $\beta$ =0.12, 95% CI: 0.02–0.22), and lobular ( $\beta$ =0.09, 95% CI: 0.002–0.18) and portal ( $\beta$ =0.10, 95% CI: 0.02–0.18) inflammation. No association was found between rs738409 and the risk of ballooning degeneration ( $\beta$ =0.05, 95% CI: –0.05 to 0.16) (Paths *a* on the Figure 1B).

#### Relationship between mediators (histology scores) and fibrosis severity

**NH-White population (n=1153)**—Both ballooning degeneration ( $\beta$ =0.54, 95% CI: 0.46–0.62) and portal inflammation ( $\beta$ =0.77, 95% CI: 0.67–0.88) were significantly associated with an increased risk of fibrosis. Lobular inflammation ( $\beta$ =0.08, 95% CI: –0.01 to 0.17) tended to be positively associated with fibrosis but did not reach the statistical significance (Paths *b* on Figure 1A). Notably, steatosis ( $\beta$ = –0.11, 95% CI: –0.18 to –0.04) was negatively associated with fibrosis, meaning that lower steatosis scores were associated with advanced fibrosis.

To better understand the relationship within the mediators ("intermediate histology scores"), covariate-adjusted linear regression analyses were additionally performed. After controlling for rs738409 and other important confounders, steatosis was inversely correlated with portal inflammation (Adj.  $\beta$ = -0.07, P<0.01) and fibrosis (Adj.  $\beta$ = -0.11, P=0.01), but positively correlated with lobular inflammation (Adj.  $\beta$ =0.16, P<0.01) and ballooning degeneration (Adj.  $\beta$ =0.07, P=0.02). Lobular inflammation, ballooning degeneration, and portal inflammation were positively correlated with each other (Table 3). Since steatosis was negatively correlated with both fibrosis and portal inflammation, we sought to examine whether these correlations remained significant across all rs738409 genotypes (Table 4). Of note, steatosis remained negatively correlated with portal inflammation and fibrosis in participants with GC (Adj.  $\beta$ = -0.05, P=0.047 and Adj.  $\beta$ = -0.19, P<0.01) and GG genotypes (Adj.  $\beta$ = -0.16, P<0.01 and Adj.  $\beta$ = -0.21, P=0.03) but not in those with CC (Adj.  $\beta$ = -0.04, P=0.287 and Adj.  $\beta$ =0.06, P=0.450). The same analysis focusing on other

racial/ethnic groups showed significant and negative correlations of steatosis with portal inflammation and fibrosis in those with rs738409 GG genotype (Table 5).

# Total, direct, and indirect effect of rs738409 on fibrosis severity. Analysis incorporating mediators in parallel.

**NH-White population (n=1153)**—Figure 1A depicts the estimated total and direct effect of rs738409 on fibrosis score, as well as the estimated indirect effects through each mediator "histological score". The total effect (c' path on Figure 1A) of rs738409 on fibrosis severity was  $\beta$ =0.19 (95% CI: 0.09–0.29). The direct effect (*c* path on Figure 1A) of rs738409 on fibrosis removing mediators' effect was estimated at  $\beta$ =0.09 (95% CI: 0.01–0.17), which represents 47% of the total effect of rs738409 on fibrosis. The indirect effect of rs738409 on fibrosis through all mediators' effects was estimated at  $\beta$ =0.010 (95% CI: 0.04–0.15) (Total ab path on Figure 1A). Thus, the percentage of total effect contributed by all mediators was estimated to be 53%. Among all mediators, the greatest estimated effect size was displayed by portal inflammation ( $\beta$ =0.09, 95% CI: 0.047–0.120), followed by lobular inflammation  $(\beta = 0.008, 95\% \text{ CI: } 0.001 - 0.02)$ , and steatosis  $(\beta = -0.01, 95\% \text{ CI: } -0.03 \text{ to } -0.003)$ . In other words, the effects of rs738409 variant, as per G allele, on fibrosis that is attributed to variations in portal inflammation, lobular inflammation, and steatosis are 0.09, 0.008, and -0.01, respectively. The percentage of total indirect effect contributed by each mediator was estimated to be 89%, 8.7%, and -12% for portal inflammation, lobular inflammation, and steatosis, respectively. Ballooning degeneration did not significantly mediate the relationship between rs738409 and fibrosis, although a positive marginal trend was observed ( $\beta$ =0.01, 95% CI: -0.02 to 0.05).

**Other racial/ethnic groups (n=404)**—We replicated our analysis in the cohort with different racial/ethnic groups, and results did not differ significantly from those obtained in the NH-White population (Figure 1B) even after adjusting for the same confounding factors along with race/ethnicity. The total effect of rs738409 on fibrosis was  $\beta$ =0.21 (95% CI: 0.07–0.34). The direct effect of rs738409 on fibrosis excluding mediators' effect was estimated at  $\beta$ =0.13 (95% CI: 0.02–0.23), which represents 62% of the total effect of rs738409 on fibrosis. The indirect effect of rs738409 on fibrosis through all mediators' effects was estimated at  $\beta$ =0.08 (95% CI: 0.001–0.17), signifying 38% of the total effect. Steatosis did not significantly mediate the effect between rs738409 and fibrosis. Portal inflammation and lobular inflammation remained the most important mediators, yielding 63% and 25% of the total indirect effects.

# Sensitivity analysis

# rs738409 effect through steatosis after excluding participants with advanced fibrosis. Analysis based on the whole cohort (n=1129)

Supplemental Figure 2. depicts the distribution of the steatosis severity (0–3) across fibrosis stages (0–4). An inverse association between the severity of steatosis and fibrosis was observed; higher fibrosis stages (3 and 4) were associated with lower steatosis scores (0 and 1). Thus, we decided to examine the effect of rs738409 on fibrosis via steatosis after excluding participants with advanced fibrosis (stages 3 and 4). Overall, our mediation

analysis (Supplemental Figure 3) showed the same results that those obtained in NH-White and other racial/ethnic populations. However, steatosis ( $\beta$ =0.06, 95% CI: 0.01–0.11) was positively associated with fibrosis, and therefore, the indirect effect of rs738409 through steatosis was also positive ( $\beta$ =0.01, 95% CI: 0.002–0.02). The total, direct and indirect effects of rs738409 on fibrosis were estimated at  $\beta$ =0.08 (95% CI: 0.02–0.14),  $\beta$ =0.03 (95% CI: 0.001–0.09) and  $\beta$ =0.05, 95% CI: 0.01–0.08), respectively. The last two estimates represent 38% and 62% of the indirect or direct effects of rs738409 on fibrosis. Among the intermediate histology traits, portal inflammation remained the most robust mediator, followed by lobular inflammation and steatosis.

# Total, direct, and indirect effect of rs738409 on fibrosis. Analysis incorporating mediators sequentially.

The mediation analysis was performed in the whole population (n=1557) and confirmed that rs738409 is directly associated with fibrosis ( $\beta$ =0.09, 95% CI: 0.04–0.13), meaning 50% of the total effect. Importantly, the indirect effect of rs738409 on fibrosis might be partly explained by portal inflammation (78%), lobular inflammation (8%), and steatosis (12%) when analyzed as single mediators. Ballooning degeneration as a single mediator did not influence the association between rs738409 and fibrosis. The most important sequential indirect paths were those including lobular inflammation followed by ballooning ( $\beta$ =0.023, 95% CI: 0.011–0.037) or portal inflammation (β=0.004, 95% CI: 0.001–0.008). A summary of all direct and indirect paths tested in the model is provided in Supplemental Table 1. A sequential mediation analysis performed in the population without advanced fibrosis (n=1129, Supplemental Table 2) confirmed the above-mentioned results. rs738409 displayed a significant direct effect of fibrosis ( $\beta$ =0.03, 95% CI: 0.001–0.09), signifying 38% of the total effect. Portal (52%) and lobular (30%) inflammation and steatosis (22%) significantly mediated the association between rs738409 and fibrosis. Among different sequential combinations of histology traits, the path including lobular inflammation followed by ballooning degeneration displayed the most remarkable indirect effect ( $\beta$ =0.020, 95% CI: 0.010–0.031). In both sequential mediations analyses, a sequential path of steatosis and then lobular inflammation remained significant, but with a minor contribution to the total indirect effect.

# Discussion

In this observational and prospective study, we examined whether and to what extent steatosis, lobular inflammation, ballooning degeneration, and portal inflammation might mediate the effect of rs738409 on fibrosis severity by analyzing a relatively large U.S. population with biopsy-proven NAFLD.

#### **Principal findings**

Our mediation analyses suggested that rs738409 increases the risk of overall fibrosis, and part of its effects might partly be explained by direct (47% and 62%) and indirect (53% and 38%) histology pathways. Among the indirect histology pathways, a remarkable proportion of the effect of rs738409 on fibrosis was explained through the portal inflammation pathway (89% and 63%). It is noteworthy to mention that higher effect size estimates were

The contribution of either steatosis or lobular inflammation as histology mediators between rs738409 and the risk of overall fibrosis was relatively small and about 10%. Ballooning degeneration as a single mediator did not influence the association between rs738409 and overall fibrosis; this finding is likely explained by the lack of association between rs738409 and ballooning degeneration. Our mediation analyses testing the sequential effects of up to 2 histology traits showed that lobular inflammation followed by ballooning degeneration was the most significant combinatorial pathway, explaining between 26% and 40% of the total indirect effect of rs738409 on overall fibrosis.

#### Interpretation of results

Data from the cross-sectional analysis have shown a positive link between steatosis severity and increased risk of lobular inflammation, zone 3 fibrosis, and definite NASH, however, its association with ballooning and advanced fibrosis is less clear in adults with NAFLD. (35) Chronic portal inflammation is another histological marker of advanced NAFLD; its association is especially strong with bridging fibrosis and cirrhosis. (36, 37) In a seminal study, Brunt et al. found an inverse association between chronic portal inflammation and steatosis severity. (36) Previous studies have reported that liver fat declines in patients with advanced fibrosis (burnt-out NASH). (18, 38)

Consistent with the above-mentioned reports, we observed that portal inflammation and fibrosis severity were strongly correlated with each other, and both were negatively associated with steatosis severity. Interestingly, the inverse relationships between steatosis and portal inflammation and fibrosis severity were stronger in participants with rs738409 genotypes GC and GG as compared with CC. The mechanisms underpinning these associations are not well understood. One potential explanation can be that carriers of the rs738409 G allele are at increased risk of stages of fibrosis and higher degrees of portal inflammation, which can result in less accumulation of fat.

We tested this hypothesis by performing further mediation analyses (Supplemental Figure 3 and Supplemental Table 2) in a subpopulation that excluded participants with advanced stages of fibrosis (3). These analyses showed that steatosis and fibrosis scores were positively associated; therefore, the indirect estimate of rs738409 on fibrosis via steatosis was also positive. Taken altogether, these sensitivity analyses might confirm that the negative relationship between steatosis and fibrosis scores might be largely influenced by the significant proportion of individuals with advanced fibrosis (28%) enrolled in our study population.

One of the key findings of our study was that 47% and 62% of the total effect of the rs738409 G allele on overall fibrosis severity could be explained by a direct effect without the mediation of other histology factors, supporting the hypothesis that rs738409 likely promotes fibrosis development by triggering specific fibrogenic pathways. (39–42)

Consistently, various epidemiological studies have indicated that rs738409 not only confers susceptibility to liver fat accumulation but also increases the risk of liver fibrosis and its progression in NAFLD patients. (2–5, 43, 44) Recent studies have reported that rs738409 increases the risk of inflammation and fibrosis regardless of the severity of steatosis, (43, 45) which suggests that other mechanisms not implicated in the lipid biosynthesis may also be playing a key role in the NAFLD progression. (39, 40, 46, 47) Our findings might also have important therapeutic implications as targeting the rs738409 variant is expected to be an excellent pharmacological strategy to treat NAFLD patients. Our mediation analyses identified the most common histology pathways through which rs738409 might influence fibrosis development. These pathways may offer a better understanding of how rs738409 affects disease progression and the potential benefits of a targeted-PNPLA3 intervention to reduce inflammation and fibrosis.

#### Strengths and limitations of this study

Our study has several strengths. This is the first study to examine whether intermediate histologic traits may be determinants of the effect of rs738409 on liver fibrosis using causal mediation analysis. (31, 48) Biopsies were evaluated centrally by the NASH CRN Pathology Committee. Adjustment for relevant confounders that could be associated with either rs738409 or histology scores allow us to disentangle the effect of rs738409 on fibrosis from the effects of these relevant confounders. Total, direct, and indirect effect size estimates of rs738409 on overall fibrosis were fairly reproduced and gave the same results in two different racial and ethnic subpopulations (NH-White and other racial/ethnic groups). This is important as the severity of NAFLD and the rs738409 minor allelic frequent distribution may differ across racial/ethnic groups. (1, 5, 49)

Our study has limitations that must be considered in the interpretation of the findings. Despite the relatively large sample size, results from our mediation analyses cannot be used to infer causality due to the cross-sectional nature of the study, even though temporality between exposure, mediator, and outcome variables were maintained. Future longitudinal research is needed to examine the links between rs738409, fibrosis, and intermediate histology traits and provide more reliable insights into the direction of the causal flow, although this study design would require serial liver biopsies resulting in significant ethic concerns. While our results did not significantly vary between the NH-White and other racial and ethnic groups, replication of this study would be required in individual racial/ ethnic groups (e.g., NH-Black and Hispanic). Finally, mediation analysis is not suitable for identifying effective mediators rather than testing the significance of an assumed causal mediator.

In summary, our findings suggest that half of the total effect of rs738409 on overall fibrosis severity could be explained by a direct pathway without the mediation of other histology factors, supporting the hypothesis that rs738409 likely promotes fibrosis development by triggering specific fibrogenic pathways. The other half of the total effect of rs738409 on fibrosis severity seems to be mediated primarily through portal inflammation, highlighting the need for further investigations to better understand the pathogenesis and significance of portal inflammation, especially in the context of *PNPLA3* genetic variation.

# Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

# Acknowledgments

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# Abbreviations

PNPLA3	patatin-like phospholipase domain-containing 3
BMI	body mass index
TG	triglycerides
NASH	non-alcoholic steatohepatitis
CRN	clinical research network
VIF	variance inflation factor
T2DM	type 2 diabetes mellitus
CIs	confidence intervals
NH	non-Hispanic
SD	standard deviation
SE	standard error
HSD17B13	hydroxysteroid 17-beta dehydrogenase 13
TM6SF2	transmembrane 6 superfamily member 2
MBOAT7	membrane-bound o-acyltransferase domain-containing

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#### Figure 1.

Statistical diagram of a parallel mediation model including 4 mediators. **A**) The non-Hispanic White population (n=1153). 
. **B**) Hispanic, non-Hispanic Black, non-Hispanic Asian, and other/multiracial (n=404).

a: The effect of rs738409 on the mediator (individual histological score)

*b:* The effect of the mediator (individual histological score) on the fibrosis score.

*ab:* The indirect effect of the rs738409 on the fibrosis score through each mediator (individual histological score).

*Total ab*: The sum of all indirect effects of the rs738409 on the fibrosis score through all mediators.

*c:* The direct effect of rs738409 on the fibrosis score, not operating through mediators. *c':* the total effect of rs738409.

 $\beta$  indicates bootstrap coefficients.

All analyses adjusted for age, gender, BMI (kg/m<sup>2</sup>), T2DM, non-heavy alcohol intake, *PNPLA3* rs738409, *HSD17B13* rs72613567, *TM6SF2* rs58542926, *MBOAT7* rs641738. Race/ethnicity was further included in the multivariable analysis focusing on the other racial/ethnic groups.

The star symbol (\*) represents statistically significant paths.

# Table 1.

### Baseline characteristics of the study population.

	Entire cohort	Non-Hispanic White co
Variables	N=1557	N=1153
Age (years)	$48.5\pm11.5$	$50.7 \pm 11.5$
Gender (female), n (%)	989 (64)	727 (63)
Type 2 diabetes n (%)	560 (36)	408 (35)
Hypertension, n (%)	873 (56)	685 (59)
Body mass index (kg/m <sup>2</sup> )	$34.4\pm6.4$	$34.9\pm6.4$
Waist circumference (cm)	$109.2 \pm 14.3$	$110.4 \pm 14.2$
Race/ethnicity, n (%)		
Non-Hispanic White	1153 (74)	-
Hispanic	156 (10)	-
Non-Hispanic Black	52 (3)	-
Non-Hispanic Asian	106 (7)	-
Other or multiracial	90 (6)	-
Non-heavy alcohol intake, (%)	567 (36)	433 (38)
Genetic variants, n (%)		
PNPLA3 rs738409		
CC	490 (31)	377 (33)
CG	680 (44)	528 (46)
GG	387 (25)	248 (22)
<i>HSD17B13</i> rs72613567		
_/_	1028 (66)	737 (64)
-/A	446 (29)	348 (30)
A/A	83 (5)	68 (6)
TM6SF2 rs58542926		
CC	1005 (78)	866 (76)
TC	328 (21)	254 (22)
TT	24 (1)	19 (2)
MBOAT7 rs641738		
CC	511 (33)	273 (24)
TC	721 (46)	550 (48)
TT	325 (21)	317 (28)
Lab reports		
Alanine aminotransferase (U/L)	$72.0\pm50.2$	$69.9 \pm 47.2$
Aspartate aminotransferase (U/L)	$51.7\pm33.0$	$51.3\pm32.3$
Triglycerides (mg/dl)	$180.7\pm166.1$	$185.6\pm178.1$
Total cholesterol (mg/dl)	$192.0\pm43.7$	$192.4\pm44.3$
HDL cholesterol (mg/dl)	$43.7\pm11.9$	$43.3\pm11.6$
LDL cholesterol (mg/dl)	$115.8\pm36.9$	$115.7 \pm 37.3$

	Entire cohort	Non-Hispanic White cohort
Variables	N=1557	N=1153
Histology reports		
Steatosis, n (%)		
<5%	31 (2)	21 (1.8)
5-33%	577 (37.1)	420 (36.5)
33–66%	561 (36)	413 (35.8)
>66%	388 (24.9)	299 (25.9)
Lobular inflammation, n (%)		
No foci	7 (0.4)	2 (0.2)
<2 foci/200x	783 (50.3)	606 (52.6)
2-4 foci/200x	585 (37.6)	419 (36.3)
>4 foci/200x	182 (11.7)	126 (10.9)
Ballooning, n (%)		
None	513 (33)	383 (33.2)
Few	444 (28.5)	320 (27.8)
Many	600 (38.5)	450 (39)
Portal inflammation, n (%)		
None	184 (11.8)	126 (10.9)
Mild	994 (63.8)	740 (64.2)
> Mild	379 (24.4)	287 (24.9)
Fibrosis stages, n (%)		
0	362 (23.2)	258 (22.4)
1	461 (29.6)	313 (27.2)
2	306 (19.7)	238 (20.6)
3	296 (19)	227 (19.7)
4	132 (8.5)	117 (10.1)

Quantitative variables are displayed as mean  $\pm$  SD.

#### Table 2.

Correlations between mediator scores and the fibrosis stage (0-4). Non-Hispanic White (n=1153) and other racial/ethnic groups (n=404) cohorts. Analysis based on multivariable linear regression.

	Non-Hispanic White population					
	Ac	Adjusted estimates			Collinearity statistics	
Histology scores	$\boldsymbol{\beta}$ coefficient	95% CI	P value *	Tolerance	VIF†	
Steatosis (0–3)	-0.11	-0.18 to -0.04	0.002	0.897	1.115	
Lobular inflammation (0-3)	0.08	-0.01 to 0.17	0.093	0.765	1.307	
Ballooning degeneration (0-2)	0.54	0.46 to 0.62	< 0.001	0872	1.363	
Portal inflammation (0-2)	0.78	0.67 to 0.88	< 0.001	0.872	1.146	
	Other racial/ethnic groups					
Steatosis (0-3)	-0.08	-0.18 to 0.03	0.145	0.865	1.157	
Lobular inflammation (0-3)	0.18	0.06 to 0.31	0.005	0.778	1.286	
Ballooning degeneration (0-2)	0.57	0.45 to 0.68	< 0.001	0.752	1.330	
Portal inflammation (0-2)	0.48	0.33 to 0.63	< 0.001	0.830	1.205	

<sup>\*</sup>Adjustment for age, gender, body mass index (kg/m<sup>2</sup>), T2DM, non-heavy alcohol intake, *PNPLA3* rs738409, *HSD17B13* rs72613567, *TM6SF2* rs58542926, *MBOAT7* rs641738. Race/ethnicity was further included in the multivariable analysis focusing on the other racial/ethnic groups. All histology scores were included in the same multivariable model along with other previously mentioned confounders.

All correlation coefficients were below 0.70, reducing the concern of the presence of multicollinearity. (30)

#### Table 3.

Covariate-adjusted \* correlations between all histological lesions. Results based on multivariable linear regression. NH-White (n=1153) and other racial/ethnic groups (n=404) populations.

	Non-Hispanic White population					
		Steatosis	Lobular inflammation	Ballooning degeneration	Portal inflammation	Fibrosis
Steatosis	Adj. β		0.16	0.07	-0.07	-0.11
	P-value		< 0.001	0.018	0.001	0.011
Lobular inflammation	Adj. β			0.49	0.11	0.41
	P-value			< 0.001	< 0.001	< 0.001
Ballooning degeneration	Adj. β				0.12	0.65
	P-value				< 0.001	< 0.001
Portal inflammation	Adj. β					0.94
	P-value					< 0.001
			Other	racial/ethnic groups		
Steatosis	Adj. β		0.13	-0.07	-0.08	-0.13
	P-value		0.005	0.192	0.036	0.05
Lobular inflammation	Adj. β			0.42	0.11	0.46
	P-value			< 0.001	0.008	< 0.001
Ballooning degeneration	Adj. β				0.14	0.70
	P-value				< 0.001	< 0.001
Portal inflammation	Adj. β					0.68
	P-value					< 0.001

\* Multivariable linear regression models adjusting for age, gender, body mass index (kg/m<sup>2</sup>), T2DM, non-heavy alcohol intake, *PNPLA3* rs738409, *HSD17B13* rs72613567, *TM6SF2* rs58542926, *MBOAT7* rs641738. Race/ethnicity was further included in the multivariable analysis focusing on the other racial/ethnic groups cohort.

#### Table 4.

Covariate-adjusted \* correlations between all histological lesions. Results based on multivariable linear regression. Sensitivity analysis by each rs738409 genotype. NH-White population (n=1153).

		rs738409 CC genotype (n=377)				
		Steatosis	Lobular inflammation	Ballooning degeneration	Portal inflammation	Fibrosis
Steatosis	Adj. β		0.12	0.08	-0.04	0.06
	P-value		0.004	0.137	0.287	0.450
Lobular inflammation	Adj. β			0.54	0.17	0.52
	P-value			< 0.001	< 0.001	< 0.001
Ballooning degeneration	Adj. β				0.11	0.65
	P-value				0.004	< 0.001
Portal inflammation	Adj. β					0.92
	P-value					< 0.001
			rs	738409 CG genotype (n=528)		
Steatosis	Adj. β		0.16	0.07	-0.05	-0.19
	P-value		< 0.001	0.095	0.047	0.002
Lobular inflammation	Adj. β			0.45	0.07	0.37
	P-value			< 0.001	0.049	< 0.001
Ballooning degeneration	Adj. β				0.10	0.61
	P-value				0.001	< 0.001
Portal inflammation	Adj. β					0.93
	P-value					< 0.001
			rs	738409 GG genotype (n=248)		
Steatosis	Adj. β		0.22	0.06	-0.16	-0.21
	P-value		< 0.001	0.385	< 0.001	0.031
Lobular inflammation	Adj. β			0.50	0.10	0.33
	P-value			< 0.001	0.030	0.002
Ballooning degeneration	Adj. β				0.18	0.76
	P-value				< 0.001	< 0.001
Portal inflammation	Adj. β					0.94
	P-value					< 0.001

\* Multivariable linear regression models adjusting for age, gender, BMI (kg/m<sup>2</sup>), T2DM, non-heavy alcohol intake, PNPLA3 rs738409, HSD17B13 rs72613567, TM6SF2 rs58542926, MBOAT7 rs641738.

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#### Table 5.

Covariate-adjusted \* correlations between all histological lesions. Results based on multivariable linear regression. Sensitivity analysis by each rs738409 genotype. Other racial/ethnic groups (n=404).

		rs738409 CC genotype (n=113)				
		Steatosis	Lobular inflammation	Ballooning degeneration	Portal inflammation	Fibrosis
Steatosis	Adj. β		0.22	0.02	-0.05	0.06
	P-value		0.022	0.849	0.497	0.645
Lobular inflammation	Adj. β			0.54	0.10	0.49
	P-value			< 0.001	0.190	< 0.001
Ballooning degeneration	Adj. β				0.18	0.67
	P-value				0.010	< 0.001
Portal inflammation	Adj. β					0.54
	P-value					0.002
			rs7	738409 CG genotype (n=152)		
Steatosis	Adj. β		0.06	-0.08	-0.03	-0.09
	P-value		0.441	0.369	0.613	0.417
Lobular inflammation	Adj. β			0.47	0.16	0.54
	P-value			< 0.001	0.020	< 0.001
Ballooning degeneration	Adj. β				0.03	0.70
	P-value				0.584	< 0.001
Portal inflammation	Adj. β					0.69
	P-value					< 0.001
			rs7	738409 GG genotype (n=139)		
Steatosis	Adj. β		0.16	-0.11	-0.14	-0.24
	P-value		0.041	0.267	0.033	0.050
Lobular inflammation	Adj. β			0.31	0.09	0.31
	P-value			0.002	0.239	0.024
Ballooning degeneration	Adj. β				0.23	0.78
	P-value				< 0.001	< 0.001
Portal inflammation	Adj. β					0.75
	P-value					< 0.001

\* Multivariable linear regression models adjusting for age, gender, BMI (kg/m<sup>2</sup>), T2DM, non-heavy alcohol intake, *PNPLA3* rs738409, *HSD17B13* rs72613567, *TM6SF2* rs58542926, *MBOAT7* rs641738, race/ethnicity.

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