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# Genetic Variants in *HSD17B3*, *SMAD3*, and *IPO11* Impact Circulating Lipids in Response to Fenofibrate in Individuals With Type 2 Diabetes

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Additional Supporting Information may be found in the online version of this article.

#### CONFLICT OF INTEREST

The authors have no conflicts of interest to disclose.

#### AUTHORSHIP CONTRIBUTION

D.M.R., S.S.P., J.R.J., G.A.G., H.N.G., H.L.M., J.B.B., M.J.W., and A.M.R. wrote the paper. D.M.R., A.P., A.G., G.A.G., A.D., J.C.M., H.L.M., J.B.B., M.J.W., and A.M.R. designed the research. D.M.R., S.S.P., J.R.J., T.M.H., H.S.S., H.G., A.D., M.J.W., and A.M.R. performed the research. D.M.R., S.W.M., S.S.P., A.P., A.S., H.S.S., M.L.M., and J.C.M. analyzed the data.

#### **Abstract**

Individuals with type 2 diabetes (T2D) and dyslipidemia are at an increased risk of cardiovascular disease. Fibrates are a class of drugs prescribed to treat dyslipidemia, but variation in response has been observed. To evaluate common and rare genetic variants that impact lipid responses to fenofibrate in statin-treated patients with T2D, we examined lipid changes in response to fenofibrate therapy using a genomewide association study (GWAS). Associations were followed-up using gene expression studies in mice. Common variants in *SMAD3* and *IPO11* were marginally associated with lipid changes in black subjects ( $P < 5 \times 10^{-6}$ ). Rare variant and gene expression changes were assessed using a false discovery rate approach. *AKR7A3* and *HSD17B13* were associated with lipid changes in white subjects (q < 0.2). Mice fed fenofibrate displayed reductions in *Hsd17b13* gene expression (q < 0.1). Associations of variants in *SMAD3*, *IPO11*, and *HSD17B13*, with gene expression changes in mice indicate that transforming growth factorbeta (TGF-β) and NRF2 signaling pathways may influence fenofibrate effects on dyslipidemia in patients with T2D.

Dyslipidemia is a significant risk factor for cardiovascular disease (CVD), which is the leading cause of death worldwide. In the United States, it is estimated that 33.5% of adults have high low-density lipoprotein (LDL), and only 48.1% of those individuals are currently being treated. Individuals with type 2 diabetes (T2D) commonly express a dyslipidemia, characterized by high triglycerides, low high-density lipoprotein (HDL), and an increase in cholesterol poor, small LDL, and are 2–4 times more likely to develop heart disease than nondiabetic individuals.

Fibrates, a class of medications used to treat individuals with dyslipidemia by activating the peroxisome proliferator-activated receptor-alpha (PPARa), increases HDL and lowers triglycerides and LDL. Meta-analyses of several large clinical trials indicated that treatment with fibrates decrease the number of nonfatal myocardial infarctions, although they did not decrease all-cause mortality.<sup>3,4</sup> Statins are the first-line treatment to lower LDL to prevent CVD.<sup>5</sup> Fibrates are generally not recommended to reduce CVD because of a lack of demonstrated benefit, although they are recommended for the management of hypertriglyceridemia.<sup>6</sup> Specifically, fenofibrate is recommended in the context of statin therapy because of lower risk of interference with statin metabolism and myopathy.<sup>5,6</sup>

One goal of the Action to Control Cardiovascular Risk in Diabetes (ACCORD) clinical trial was to compare the benefits and risks of treatment strategies for intensively managing dyslipidemia with a combined statin and fenofibrate therapy vs. treatment with statin alone, whereas simultaneously targeting normal glycemia and blood pressure vs. standard targets in individuals with T2D at high risk for CVD.<sup>7,8</sup> The ACCORD trial followed 10,251 participants for up to 8 years at 77 clinical centers in the United States and Canada. Overall, no statistically significant benefits were observed for patients on the combined CVD endpoint of time to first heart attack, stroke, or CVD mortality. In addition, there was an increase in mortality in participants receiving intensive glycemia control. <sup>9–12</sup> Despite the lack of overall positive findings, interindividual variation in response to the different treatments in ACCORD was observed. Such variation to fibrate lipid response has been

observed in a number of studies <sup>13–15</sup> and suggests that genetic markers of drug response may be important biomarkers for more targeted and personalized treatment strategies.

Previous studies have also investigated the role of genetic variation in fibrate lipid response with the majority of studies focused on candidate gene approaches to identify common or rare variants associated with differential responses. <sup>16–19</sup> Here, we performed genomewide and exome-wide genotyping on all consenting individuals in the ACCORD study prescribed fenofibrate (n = 1,264). We previously reported a genomewide association study (GWAS) of fenofibrate drug response from a meta-analysis of subjects of European ancestry in ACCORD and the Genetics of Lipid Lowering Drugs and Diet Network (GOLDN) study. <sup>14</sup> Here, we expand the analysis of ACCORD participants to include other ethnicities, using combined data from a genomewide single nucleotide polymorphism (SNP) array, and an exome chip array with >1.2 million combined genotyped SNPs and rare variant analysis for SNPs with minor allele frequencies (MAFs) <3% for changes in LDL, HDL, triglycerides (TGs), and total cholesterol (TC). Our results indicate interesting and potentially impactful associations, and we use mouse studies to test the hypotheses generated by the genemapping analysis. To our knowledge, this is the first GWAS of fenofibrate lipid response in multiple ethnicities, and the first exome-wide interrogation of fibrate drug response.

Although the results of the association mapping experiment can point to interesting biology, functional follow-up is a crucial step to support association analyses. In the current study, we considered the GWAS to be a hypothesis generating exercise to prioritize genes for further functional interrogation. We subsequently evaluated the genes identified through association analysis in two mouse gene expression studies, and demonstrate that many of the genes discovered in the association analysis play a significant role in fibrate drug response.

#### **RESULTS**

A total of 1,264, 781, and 138 subjects were included in the common and rare variant analyses for all races combined, white, and black cohorts, respectively. Variation in response was observed for all phenotypes: HDL, LDL, TC, and TG (Figure 1). Distributions of response variation for white and black cohorts individually can be found in Supplementary Figures S1 and S2. The mean change in HDL was 3.16 mg/dL (95% confidence interval [CI] = 2.78-3.53) for all races combined, 3.11 mg/dL (95% CI = 2.62-3.60) for white subjects only, and 2.80 mg/dL (95% CI = 1.73-3.86) for black subjects only. The mean change in LDL was -10.64 mg/dL (95% CI = -12.48 to -8.79) for all races combined, -9.31 mg/dL (95% CI = -11.68 to -6.95) for white subjects only, and -10.83 mg/dL (95% CI = -16.73 to -4.94) for black subjects only. The mean change in TG was -45.23 mg/dL (95% CI = -50.27 to -40.28) for all races combined, -52.04 mg/dL (95% CI = -58.31 to -45.78) for white subjects only, and -34.43 mg/dL (95% CI = -46.96 to -21.91) for black subjects only. The mean change in TC was -16.10 mg/dL (95% CI = -18.27 to -13.92) for all races combined, -16.14 mg/dL (95% CI = -18.93 to -13.35) for white subjects only, and -14.51 mg/dL (95% CI = -21.13 to -7.88) for black subjects only.

#### Common variant analysis

A total of 852,426 genotyped and 7,277,412 imputed variants had MAFs >3% and were included in the common variant analysis. When all races were combined or white subjects were analyzed, no SNPs met the threshold for genomewide significance  $(P < 5 \times 10^{-8})$ . When all races were combined, 8 SNPs associated with TG (genes: BEST3, LOC105371270, and RPGRIP1L; Supplementary Figure S3), 34 SNPs associated with TC (genes: FGF14, PRRX1, MRPL12, ZNF775, and FBXL7; Supplementary Figure S4), 1 SNP associated with HDL (no known genes; Supplementary Figure S5), and 2 SNP associated with LDL (genes: FGF14 and MRPL12; Supplementary Figure S6) reached the threshold for suggestive significance ( $P < 1 \times 10^{-6}$ ). For white subjects only, 11 SNPs associated with TG (genes: LOC105371270 and RPGRIP1L; Supplementary Figure S7), 11 SNPs associated with TC (genes: MAU2 and PBX4; Supplementary Figure S8), 0 SNPs associated with HDL (Supplementary Figure S9), and 8 SNP associated with LDL (genes: PBX4, SNX7, and MAU2; Figure 2) reached the threshold for suggestive significance  $(P < 1 \times 10^{-6})$ . When black subjects were analyzed separately, 6 SNPs were significantly associated ( $P < 5 \times 10^{-8}$ ) with TG (genes: LRFN2, LINC00333, and BCL9), and 55 SNPs reached suggestive significance ( $P < 1 \times 10^{-6}$ ) with TG (genes: GLIS3, CCDC149, LINGO2, SNHG17, LOC105370782, TTLL8, RHOBTB1, and LOC101927866; Supplementary Figure S10). Seven SNPs were significantly associated ( $P < 5 \times 10^{-8}$ ) with TC (genes: *CLN8* and *BICC1*), and 108 SNPs reached suggestive significance ( $P < 1 \times 10^{-6}$ ) with TC (genes: ST6GALNAC3, LOC105372744, SCGN, LOC102724378, NRXN1, LCT, LOC102724680, RBM19, MCM6, DARS, TRIOBP, DARS-AS1, PEX5L, LOC102724680, and NLGN1; Supplementary Figure S11). One SNP was significantly associated ( $P < 5 \times 10^{-8}$ ) with HDL (gene: MSH3), and 8 SNPs reached suggestive significance ( $P < 1 \times 10^{-6}$ ) with HDL (genes: TGFBR3, LOC105373670, STX8, and CELSR1; Supplementary Figure S12). Last, 5 SNPs associated with LDL (genes: BICC1, FOXP1, and PEX5L; Supplementary Figure S13) reached the threshold for suggestive significance ( $P < 1 \times 10^{-6}$ ). Lead SNPs associated with HDL, LDL, TC, and TG ( $P < 1 \times 10^{-6}$ ) are presented in Tables 1 and 2 and Supplementary Tables S14 and S15. None of the associations reported above were associated with placebo treatment.

#### Rare variant analysis

A total of 17,081 genes were tested for association with TG, TC, HDL, or LDL in all races combined, white subjects only and black subjects only with rare variants (MAF  $\, 0.03$ ). When all races were combined, DCUN1D4 and DUSP3 were significantly associated (q < 0.2) with TG. Additionally, when only white subjects were included, HARS2 was significantly associated with TG and HDL, HSD17B13 was significantly associated with TG and HDL, and TC, and HSCH3 was significantly associated with TG (q < 0.2). Last, POGZ was significantly associated with TG in black subjects only (q < 0.2; Table 3). None of the genes reported above were associated with subjects treated with placebo (q = 1; Table 3).

#### **Functional validation**

SNPs in genes in the common variant analysis with  $P < 1 \times 10^{-5}$  or q < 0.2 in the rare variant analysis were compared to gene expression results in wild-type C57BL/6J mice fed vehicle control or fenofibrate for replication<sup>20</sup> (REP1). Fifty-seven genes overlapped between the two studies, and 10 were significant in REP1 (q < 0.3; Mcm6, Smad3, Dcun1d4, Hecw2, Mipep, Ipo11, R3hdm1, Foxp1, Stx8, and Mapk10, Table 4). These genes and 3 additional genes that met our threshold for inclusion in the replication study but were not available in the previously published REP1 study (Hsd17b13, Pbx4, and Cyp4f39) were subsequently tested in REP2, a follow-up gene expression study in mice to confirm the changes in response to fenofibrate vs. vehicle control in liver, adipose, and skeletal muscle. Cvp4f39 was tested in REP2 because it is the murine homologue of CYP4F22 in humans. which was marginally significant for change in HDL in ACCORD ( $P < 1 \times 10^{-5}$ ). All genes, except *Mipep* and *Cyp4f39*, were significantly changed in liver tissue in REP2 (q < 0.3), however, the direction of the effect was not always consistent with REP1 (Table 4). Genes Smad3, Ipo11, and Foxp1 were significantly decreased in both REP1 and REP2 and were considered to have successfully replicated the GWAS findings. Hsd17b13 and Pbx4 were significantly decreased in liver tissue in REP2 (q < 0.3; Table 4). REP1 was published previously and did not include Hsd17b13 or Pbx4, so these genes were not available for replication in REP1. However, both of these genes were tested in REP2. There were no significant results for gene expression tested in adipose or skeletal muscle (Supplementary Table S16).

#### DISCUSSION

Dyslipidemia continues to be a widespread disorder with significant health impacts worldwide. Although recent studies, including ACCORD, have raised questions concerning the role of additional lipid-lowering therapy in the context of statin to reduce cardiovascular events, 9,21 dyslipidemia remains a significant risk factor for CVD and fibrates are commonly prescribed. 22 In addition, it is important to understand the variation in response to fenofibrate in people with T2D who are at an especially high risk of developing an adverse cardiovascular event (e.g., stroke and myocardial infarction). We previously published a meta-analysis combining the results of the fenofibrate lipid response in the GOLDN cohort with white subjects in ACCORD, and found significant associations with SNPs in *PBX4* and change in LDL in response to fenofibrate treatment. 14 Here, we expand the previous study to include all races in ACCORD and black subjects only. In addition, we conduct a rare variant analysis for changes in HDL, LDL, TC, and TG and follow-up both common and rare variant GWAS findings in two studies of mice exposed to fenofibrate. Importantly, these functional validation studies highlight novel common and rare variants that contribute to variation in fenofibrate lipid response in individuals with T2D.

Combining all subjects that met our inclusion criteria in ACCORD resulted in 1,264 subjects available for analysis. Cytochrome P450 family 4 subfamily F member 22 (CYP4F22), was marginally associated with changes in HDL ( $P=2.50\times10^{-6}$ ,  $\beta=-0.023$ ). CYP4F22 is part of the 12(R)-lipoxygenase pathway, and has been shown to produce potent PPAR $\alpha$  agonists,  $^{23,24}$  which makes SNPs in *CYP4F22* biologically plausible for causing variation in HDL,

because PPARa is the therapeutic target of fenofibrate. Although the biological role of *CYP4F22* is a compelling candidate for fibrate drug response, *Cyp4f39*, the murine homologue of *CYP4F22*, did not replicate in REP2, suggesting that the GWAS finding may be a false-positive, the replication may have failed due to species differences or gene expression may not be the appropriate test for *CYP4F22* response to fenofibrate exposure.

In black subjects only, lead SNP rs142923802, located in importin 11 (IPO11) was also marginally associated with change in LDL ( $P = 1.52 \times 10^{-6}$ ,  $\beta = 0.095$ ). Gene expression of Ipo11 was significantly decreased in both REP1 (q = 0.24) and in the liver in REP2 (q = 0.24) 0.15). IPO11 codes the nuclear import receptor, importin 11, and in conjunction with ubiquitin-conjugating enzyme, UBE2E3, restricts KEAP1, which is a major suppressor of Nrf2.<sup>25</sup> Notably, Nrf2 in mice has been shown to interact with lipogenic genes and to regulate hepatic lipid homeostasis.<sup>26</sup> Moreover, Nrf2-null mice displayed reduced liver weight, decreased fatty acid content of hepatic triacylglycerol, and increases in serum HDL, and very low-density lipoprotein triglyceride. Finally, PPARy and other genes were found to be direct targets of Nrf2 activation, demonstrating that Nrf2, regulated by KEAP1 and IPO11 in humans, modulate lipid homeostasis. Rare variants in Aldo-keto reductase 7A3, AKR7A3, were significantly associated with LDL in white subjects only (q = 0.08). The AKR family of enzymes catalyze a wide range of endogenous and exogenous chemicals, including glucose, steroid hormones, and lipids. Akr7a3 is transcriptionally regulated by Nrf2 in mice, which, in addition to IPO11 results discussed above, further supports the implication of Nrf2 signaling in regulating fenofibrate drug response.<sup>27,28</sup> Previous studies have demonstrated that Nrf2 signaling is activated by fenofibrate through *Keap1* in mice, and may be responsible for the protective effect of fenofibrate for oxidative stress.<sup>29</sup> Here, we present evidence that SNPs located in genes in the Nrf2 signaling pathway may play an important role in regulating the change in LDL upon fenofibrate treatment.

In black subjects, rs12912310, located in the gene, mothers against decapentaplegic-3 (SMAD3), was marginally associated with LDL ( $P = 5.75 \times 10^{-6}$ ) and TC ( $P = 1.88 \times 10^{-6}$ ). Smad3 expression was significantly decreased in response to fenofibrate in both REP1 (q = 0.09) and REP2 (q = 0.19). SMAD3 is a member of the SMAD family of genes and is an intracellular signal transducer and transcriptional modulator activated by transforming growth factor-beta (TGF-β), and binds to the promoter region of many genes regulated by TGF-β and activates them by forming a SMAD3/SMAD4 complex.<sup>30–32</sup> In a study by Tan et al. 31 SMAD3 knockout mice had lower plasma free fatty acid and glycerol, and reduced adiposity. The same study demonstrated that SMAD3 knockout mice had altered regulation of PPARγ and PPARβ. Furthermore, PPARα, the therapeutic target of fenofibrate, has been shown to inhibit TGF-β, which regulates SMAD2, SMAD3, and SMAD4 transcription factors.<sup>33</sup> Pathways involving PPARa, TGF-\(\beta\), and SMAD transcription factors are clearly convoluted and more research is needed to elucidate these relationships, and these results suggest that SMAD3 may play a role in fenofibrate lipid response. Furthermore, in black subjects, SNP rs1653969 located in FOXP1, was associated with a poorer LDL response to fenofibrate ( $P = 9.18 \times 10^{-7}$ ). FOXP1 is a member of the forkhead box class of genes, which is a large family of transcription factors. Little is known about the role of FOXP1, but other FOX transcription factors (e.g., FOXO3a) have been shown to be impacted by fenofibrate treatment.<sup>34</sup> Importantly, expression of *Foxp1* was significantly decreased in both REP1 and

REP2 analysis, and additional research is needed to further elucidate the role of *FOXP1* in fenofibrate lipid response.

When the cohort was limited to white subjects only, there was a significant association between LDL and the lead SNP, rs140229040, which is located in the PBX homeobox 4 (PBX4) gene ( $P=3.66\times10^{-7}$ ). SNPs in this gene are part of a large region in linkage disequilibrium, and this region has been previously identified as being associated with LDL cholesterol.  $^{35-37}$  We reported this finding previously with a meta-analysis using the GOLDN cohort.  $^{12}$  This gene was not available for follow-up in REP1 but was significantly decreased in liver tissue of mice exposed to fenofibrate in REP2 (q=0.12). Interestingly, functional validation in the study by Holmen *et al.*  $^{38}$  identified TM6SF2, which is in high linkage disequilibrium with PBX4, as being the gene functionally responsible for regulating LDL.

We also tested rare variants for associations with LDL, HDL, TG, and TC. Six unique genes (POGZ, HSD17B13, HARS2, DCUN1D4, DUSP3, and MARCH3) were significantly associated with TG. Gene expression changes for DCUN1D4 was significantly altered in both REP1 and REP2, but with opposing directions (q < 0.3). Very little is known about the function of *DCUN1D4*, with studies mostly conducted in *C. elegans* and *S. cerevisiae*.<sup>39</sup> In addition to TG, HSD17B13 was also associated with change in HDL in white subjects only (q < 0.2). Importantly, rare genetic variants in hydroxysteroid 17-beta dehydrogenase 3 (HSD17B13) were significantly associated with TG and HDL in white subjects (q < 0.05) and mice fed fenofibrate displayed a significant reduction in Hsd17b13 gene expression when administered fenofibrate vs. vehicle control in REP2 ( $q = 5.93 \times 10^{-4}$ ; Supplementary Table S6). *HSD17B13*, an isoform of 17 beta-hydroxysteroid dehydrogenase (17βHSD), is highly expressed in the testis, and is also expressed in the liver. 40 However, other isoforms of 17βHSD are expressed in many tissues. Unlike many of the other isoforms of 17βHSD, only recently has the role of 17BHSD13 become clear. Human fatty liver samples have shown that 17βHSD13 is upregulated in lipid droplet fractions. <sup>41</sup> Furthermore, 17βHSD13 was significantly upregulated in the livers of both diabetic mice and mice fed high-fat diets, suggesting that 17βHSD13 may play an important role in the pathogenesis of fatty liver in both mice and in humans and may also be relevant in diabetes. In the same study, overexpression of *Hsd17b13* in C57BL/6 mouse livers increased lipogenesis and lipid accumulation and overexpression of 17βHSD13 increased lipid droplet formation in human cell lines. 41 Interestingly, in the mouse model, overexpression of *Hsd17b13* did not increase plasma TG or TC levels. 41 Although the results presented by Su et al. 41 demonstrate a clear role of 17BHSD13 in nonalcoholic fatty liver disease, the results presented here mark the first time that rare variant SNPs in 17βHSD13 have been shown to impact the lipid lowering effects of fenofibrate. 41 Additional research is needed to fully elucidate the relationship between 17BHSD13 and fenofibrate lipid response. It is possible that 17BHSD13 may become an important biomarker in precision medicine initiatives for more targeted treatment of fenofibrate.

These findings occurred in subjects with T2D treated with statins, which is more clinically representative than fenofibrate monotherapy, because fibrates are commonly prescribed with statin therapy. <sup>42</sup> Furthermore, these associations were not observed in subjects treated with placebo and statin, lending support for these associations with fenofibrate drug response.

Although several GWAS findings were replicated in two functional studies, those studies were conducted using a mouse model that may not be applicable to human subjects, and not all genes with GWAS associations here were available for gene expression follow-up. Additionally, gene expression may not be the most relevant mechanism, as numerous ways exist for SNPs to impact drug response. Future studies will require larger cohorts and further functional work in relevant tissues to elucidate the pathways in which fenofibrate and PPARa alter lipid concentrations.

We have identified novel common variants in black subjects located in several genes (e.g., *SMAD3* and *IPO11*) and rare variants (e.g., *HSD17B13*) that explain lipid variation in response to fenofibrate treatment in individuals with T2D treated with statins. These findings were further supported by changes in gene expression in mice and provide novel findings that explain variation in fenofibrate lipid response in individuals with T2D.

#### **MATERIALS AND METHODS**

#### Study participants

The ACCORD trial (clinicaltrials.gov-NCT00000620) was a double  $2 \times 2$  factorial design, consisting of 10,251 recruited subjects with T2D and either a history of CVD or at least two known risk factors for CVD, such as documented atherosclerosis, albuminuria, dyslipidemia, hypertension, smoking, or obesity. Subjects were randomized to either intensive or standard glycemia treatment strategies (targeting HbA1c <6.0 vs. HbA1c between 7.0 and 7.9). Over 80% of subjects in the ACCORD study consented to being genotyped. There were 5,518 subjects who were further randomized to intensive vs. standard lipid management (fenofibrate vs. placebo, with all subjects on simvastatin). Each ACCORD participant provided written informed consent using procedures reviewed and approved by each clinical site's local institutional review board and based on a template provided by the study group that was approved and subsequently centrally monitored by the Coordinating Center and the National Heart, Lung, and Blood Institute (IRB: FWA00003429). Entry criteria and additional information about the lipid subtrial and patient selection are described in the Supplementary Material online. As in the prior ACCORD and GOLDN meta-analyses, fenofibrate lipid response was calculated as:

$$phenotype = log_{10}\left(\frac{a}{b}\right)$$

where *a* is the pretreatment measurement of HDL, LDL, TC, or TG, and *b* is the ontreatment measurement of HDL, LDL, TC, or TG. After subsetting patients from the lipid subtrial based on consent, genotyping, drug response criteria, and quality control (see below) of DNAs extracted from these samples, the population for the current study included 1,264 subjects. These subjects included individuals that self-identified as white, black, Hispanic, Asian, and other.

#### Genotyping and quality control

Genomic DNA extraction and cell preparations are described in the Supplementary Material. Genomewide genotyping was performed in two independent laboratories on different platforms: 6,085 unique samples, composed of those ACCORD participants who consented to genetic studies conducted by any investigator, were genotyped at the University of Virginia on Illumina HumanOmniExpressExome-8 version 1.0 chips (set 1)<sup>43</sup>; 8,174 unique samples, including the above 6,085 samples plus 2,089 samples from ACCORD participants who consented to genetic studies only if conducted by ACCORD investigators were genotyped at the University of North Carolina on Affymetrix Axiom Biobank1 chips (set 2). Additional information regarding the merging of set 1 and set 2, imputation, and quality control can be found in the Supplementary Material.

#### **Covariate selection**

Here, we take a combined approach to variable selection to address potential confounding variables. A substantial proportion of the cohort was taking lipid-lowering medications at the time baseline lipid measurements were taken (e.g., 63% were on a statin prior to entering the trial). Statin, additional concomitant medications, and nondrug covariates (e.g., age, gender, body mass index, and smoking status) were incorporated into the model, as previously described in Graham & Rotroff *et al.*<sup>44</sup> and is described in the Supplementary Material. A full list of covariate names and descriptions can be found in Supplementary Table S1.

#### Common variant analysis

Association between a phenotype, selected, and forced covariates, and a single common variant (MAF >3%) was tested with an additive genetic model using linear regression in the PLINK software for genotyped variants. <sup>45</sup> Imputed variants were tested using a linear regression model in the statistical programming language, R, where  $g = p_1(Aa) + 2p_1(aa)$  is the dosage score computed from the posterior probabilities for genotypes Aa and aa. <sup>45,46</sup> For SNPs that were only genotyped in set 1 subjects and were imputed in set 2 subjects, association tests results were combined by meta-analysis using PLINK. <sup>45</sup> Tables and figures specify whether each SNP association was genotyped, imputed, or meta-analyzed. The results from the common variant tests were considered statistically significant based on a  $P < 5 \times 10^{-8}$  and  $P < 1 \times 10^{-6}$  was considered the threshold for suggestive significance. To maximize the likelihood of finding genes expression altered by fenofibrate exposure, a more liberal threshold of  $P < 1 \times 10^{-5}$  was used only for functional validation, as described below. Additional information regarding the common variant analysis can be found in the Supplementary Material.

#### Rare variant analysis

We implemented a suite of five rare variant tests that can be divided into two classes, burden and nonburden approaches, as previously described.<sup>47</sup> Burden tests collapse a set of rare variants from a gene into a single variable, which is then tested for association with a phenotype. However, simple burden tests do not account for the direction (positive or negative association) of a rare variant effect.<sup>48</sup> One nonburden rare variant test that allows for different directions and magnitudes of effects for each variant is the sequence kernel

association test (SKAT). <sup>48</sup> The balance between SKAT and burden tests was addressed using the optimal test, SKAT-O, which aims to optimize the combination of the two approaches. Gene annotations were performed using Ensemble (GRCh37.p13), which mapped the 232,678 rare variants (MAF 3%) genotyped in set 1 subjects to 17,081 total genes. Subsequently, the combined P value was corrected for multiple comparisons with an false discovery rate (FDR) approach using the R package, q value (version 1.36.0) and q < 0.2 was considered to be statistically significant. <sup>49</sup> Additional details regarding the rare variant analysis implemented here can be found in Marvel & Rotroff et a1. <sup>47</sup> and the Supplementary Material.

#### Placebo analysis

Study protocols for those receiving placebo in the lipid subtrial of ACCORD were the same as the fibrate arm of the trial, except that placebo was administered instead of fenofibrate. To confirm that the results were associated with fibrate and not placebo or statin, we conducted common and rare variant associations using the same analysis workflow, covariates, and models as described above for all races combined (n = 1,336), white (n = 908), and black subjects (n = 186). The results from the placebo analysis are included along with the fenofibrate results in Tables (1–3) and Supplementary Tables S14 and S15.

#### Mouse gene expression validation

We investigated gene expression changes in wild-type C57BL/6J mice administered fenofibrate compared with mice administered vehicle control, as described by Liu *et al.*<sup>20</sup> to provide additional validation for common and rare variant associations with fenofibrate lipid response identified (REP1). To maximize the likelihood of finding genes with expression changes due to fenofibrate exposure, we expanded the genes chosen for evaluation to include those with common variant associations  $P < 1 \times 10^{-5}$ , where the variants were annotated as being in genes according to the National Center for Biotechnology Information database using the *rsnps* package, <sup>50</sup> and genes with q < 0.2 in the rare variant tests. An additional follow-up replication study was conducted at the University of Kentucky (REP2) to try and further validate the findings in REP1 and include additional genes identified in the ACCORD analysis that were not available in the previously published data in REP1. Additional details regarding the mouse gene expression methods can be found in the Supplementary Material. Furthermore, the gene expression results of *Rab27b*, a gene identified in an interim analysis of only set 2 data, and was not significant after merging set 1 and set 2 data (q > 0.2) is presented in the Supplementary Material.

# **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

### **Acknowledgments**

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#### **Study Highlights**

#### WHAT IS THE CURRENT KNOWLEDGE ON THE TOPIC?

☑ Fibrates are a class of drugs commonly prescribed to lower serum lipid levels; however, individual variation in response to fenofibrates has been observed and drivers of this variation are not well understood.

#### WHAT QUESTION DID THIS STUDY ADDRESS?

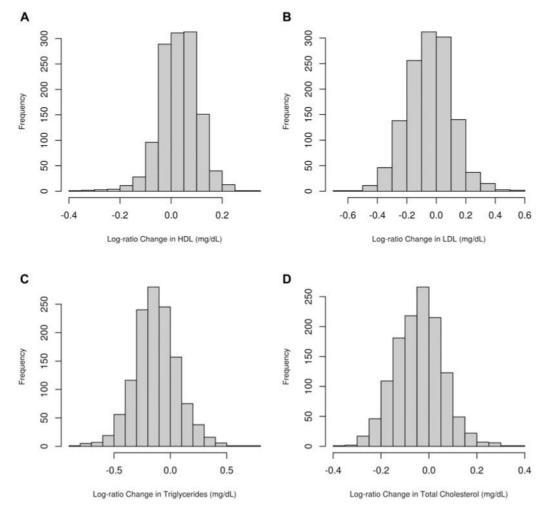
☑ Here, we evaluate the association of common and rare genetic variants with variation in response to fenofibrate treatment in individuals with T2D.

#### WHAT THIS STUDY ADDS TO OUR KNOWLEDGE

☑ We demonstrate novel associations of common genetic variants in *SMAD3* and *IPO11* genes in black subjects, and rare variants in *AKR7A3* and *HSD17B13* in white subjects were associated with variation in fibrate lipid response. We then support these findings using gene expression in a mouse model.

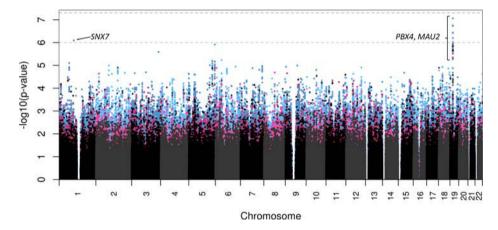
# HOW THIS MIGHT CHANGE CLINICAL PHARMACOLOGY OR TRANSLATIONAL SCIENCE

 $\square$  Our findings highlight genetic variants in TGF- $\beta$  and NRF2 signaling pathways that may influence fenofibrate effects on dyslipidemia in individuals with T2D. This insight could help to identify patients for more targeted treatment strategies or elucidate novel therapeutic targets.

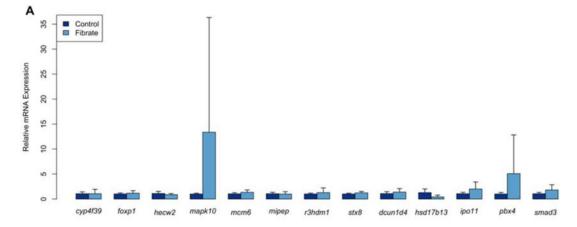


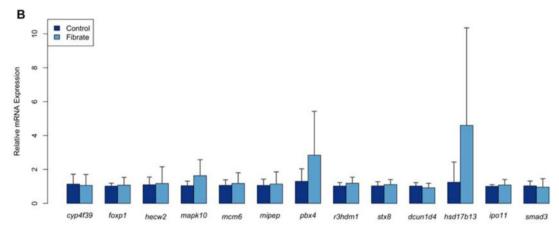
**Figure 1.** Distributions of fenofibrate response on lipid measurements in subjects of all combined races (*N*= 1264). (**a**) Log-ratio of the change in high-density lipoprotein (HDL; mg/dL). (**b**) Log-ratio of the change in low-density lipoprotein (LDL; mg/dL). (**c**) Log-ratio of the change in triglycerides (mg/dL). (**d**) Log-ratio of the change in total cholesterol (mg/dL).

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**Figure 2.**Manhattan plot of single-nucleotide polymorphism associations with change in low-density lipoprotein in white subjects only. [Color figure can be viewed at wileyonlinelibrary.com]





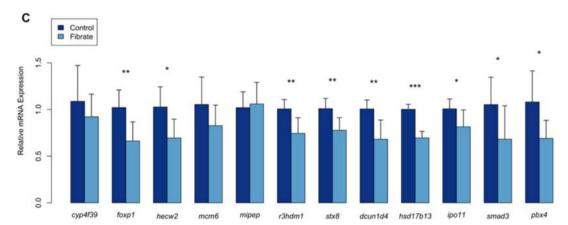


Figure 3. Gene expression in mice exposed to fenofibrate vs. vehicle control in (a) adipose tissue, (b) skeletal muscle, and (c) liver tissue. \*\*\*False discovery rate (FDR) P value < 0.01; \*\*FDR P value < 0.2. [Color figure can be viewed at wileyonlinelibrary.com]

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Table 1

Lead SNPs associated with LDL in common variant analysis  $(P < 1 \times 10^{-6})$ 

Race	SNP	Chromosome	Position Gene	Gene	Type	Type MAF	Beta	Beta Fibrate P value Placebo P value	Placebo P value
All races	All races rs73354145	17	17 81706392 MRPL12	MRPL12	IMPU	0.037	IMPU 0.037 0.032	$2.39\times10^{-7}$	0.699
All races	All races rs2607653	13	13 102066313 FGF14	FGF14	IMPU	0.031	IMPU 0.031 0.038	$4.28 \times 10^{-7}$	0.262
Black	rs72804453	10	10 58827231 BICCI	BICCI	IMPU	0.043	IMPU 0.043 0.111	$3.74 \times 10^{-7}$	0.950
Black	rs112284299	3	179850307 PEX5L	PEX5L	IMPU	0.036	IMPU 0.036 0.107	$7.02 \times 10^{-7}$	0.197
Black	rs1653969	3	71282212 FOXPI	FOXPI	IMPU	0.492	IMPU 0.492 0.037	$9.18 \times 10^{-7}$	0.232
White	rs150268548 <sup>a</sup>	19	19383673	19 19383673 PBX4, MAU2 IMPU 0.075 -0.028	IMPU	0.075	-0.028	$8.73 \times 10^{-8}$	0.567
White	rs9285630		<i>LXNS</i> 066LL986	2XNS	IMPU	0.173	IMPU 0.173 -0.022	$8.09 \times 10^{-7}$	0.419

MAF, minor allele frequency; SNP, single-nucleotide polymorphism.

rs 150268548 is not located in a gene, but SNPs in the same peak ( $P < 1 \times 10^{-6}$ ) are located in PBX4 and MAU2.

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Table 2

Lead SNPs associated with total cholesterol in common variant analysis ( $P < 1 \times 10^{-6}$ )

Macc	SINE	Chromosome	Position	Gene	Type	MAF	Beta	Fibrate $P$ value	Placebo P value
All races	rs6693796	1	170674136	PRRXI	IMPU	0.044	0.019	$6.23\times10^{-8}$	0.040
All races	rs2607653	13	102066313	FGF14	IMPU	0.031	0.023	$9.51 \times 10^{-8}$	0.150
All races	rs7810240	7	150387371	ZNF775	META	0.461	-0.015	$1.99\times10^{-7}$	0.711
All races	rs73354145	17	81706392	MRPL 12	IMPU	0.037	0.018	$2.66 \times 10^{-7}$	0.801
All races	rs80333777	5	15524360	FBXL7	IMPU	0.032	0.020	$4.76 \times 10^{-7}$	0.021
All races	rs9472719	9	46183648		IMPU	0.264	0.008	$8.98\times10^{-7}$	0.553
Black	rs72804453	10	58827231	BICCI	IMPU	0.043	0.078	$7.61 \times 10^{-11}$	0.648
Black	rs80147136	16	47050041		IMPU	0.033	0.071	$2.38 \times 10^{-8}$	0.344
Black	rs34030778	8	1771327	CLN8	GENO	0.047	0.124	$4.10 \times 10^{-8}$	0.374
Black	rs181126208	-	236495209		IMPU	0.051	0.066	$6.88 \times 10^{-8}$	0.016
Black	rs112284299	3	179850307	PEX5L	IMPU	0.036	0.065	$1.09\times10^{-7}$	0.544
Black	rs250567	16	23383077		META	0.107	0.072	$1.36\times10^{-7}$	0.347
Black	rs141864436	2	50971651	NRXNI	IMPU	0.032	0.062	$1.37 \times 10^{-7}$	0.294
Black	rs10034465	4	34193881	LOC105374394	META	0.357	0.053	$1.47 \times 10^{-7}$	0.711
Black	rs113816795	5	99159793		IMPU	0.032	0.072	$1.71\times10^{-7}$	0.487
Black	rs112209655	12	84947357	LOC102724680	IMPU	0.040	0.066	$1.89\times10^{-7}$	0.008
Black	rs117168171	15	101854598		IMPU	0.033	0.066	$2.43\times10^{-7}$	0.615
Black	rs2823310	21	15497528		IMPU	0.092	0.043	$2.72\times10^{-7}$	0.664
Black	rs143838781	12	113940538	RBM19	IMPU	0.035	0.061	$3.56\times10^{-7}$	0.571
Black	rs75298135	5	28184371		IMPU	0.030	0.065	$3.74\times10^{-7}$	0.899
Black	rs75639901	9	25667802	SCGN	IMPU	0.077	0.039	$5.08\times10^{-7}$	0.617
Black	rs115990514	3	19055897		IMPU	0.033	0.065	$5.43\times10^{-7}$	0.118
Black	rs138270994	13	22791996		IMPU	0.055	0.045	$6.23\times10^{-7}$	0.387
Black	rs76043556	15	30060225		IMPU	0.044	0.058	$6.66\times10^{-7}$	0.156
Black	rs58847779	22	37736643	TRIOBP	IMPU	0.077	0.039	6.77 × 10-7	0.503

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Race	SNP	Chromosome	Position Gene	Gene	Type	MAF	Beta	Fibrate P value	Fibrate P value Placebo P value
Black	rs62210650	21	19649853	LOC105372744	IMPU	0.034	0.064	$6.82\times10^{-7}$	0.200
Black	rs146807753	9	3904004		IMPU	0.030	090.0	$7.37 \times 10^{-7}$	0.380
Black	rs116616455	12	58041828		IMPU	0.065	0.047	$7.47 \times 10^{-7}$	1.000
Black	rs114007472	8	63563680		IMPU	0.036	0.071	$7.51\times10^{-7}$	0.840
Black	rs145010525	2	135975205	DARS	IMPU	0.033	0.058	$8.20\times10^{-7}$	0.968
Black	rs4988198	2	0.0076	0.0076 MCM6	IMPU	0.033	0.058	$8.74\times10^{-7}$	0.964
Black	rs6847878	4	81419697		IMPU	0.032	0.062	$9.57\times10^{-7}$	0.333
Black	rs2631781	1	76128100	ST6GALNAC3	IMPU	0.041	0.051	$9.66 \times 10^{-7}$	0.181
Black	rs115092681	3	3 174201322	NLGNI	IMPU	0.033	0.061	$9.82\times10^{-7}$	0.424
White	rs57504626	19	19609589	PBX4	IMPU	IMPU 0.092	-0.014	$6.22\times10^{-7}$	0.641

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MAF, minor allele frequency; SNP, single-nucleotide polymorphism.

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Table 3

Results from rare variant analysis (q < 0.2)

Phenotype	Race	Gene	Fibrate Lancaster P value	Fibrate $q$ value	Fibrate Lancaster $P$ value – Fibrate $q$ value – Placebo Lancaster $p$ value – Placebo $q$ value	Placebo q value
TG	Black	Z9Od	$1.00\times 10^{-6}$	0.017	0.113	1
HDL	White	HSD17B13	$2.15\times10^{-6}$	0.037	0.445	1
TG	White	HARS2	$3.09\times10^{-6}$	0.053	0.726	1
TG	White	HSD17B13	$4.42\times10^{-6}$	0.075	0.534	1
TDT	White	AKR7A3	$4.80\times10^{-6}$	0.082	0.271	1
HDL	White	HARS2	$7.09\times10^{-6}$	0.121	0.327	1
TG	All races	All races DCUNID4	$7.46\times10^{-6}$	0.127	0.322	1
TG	All races DUSP3	DUSP3	$9.20\times10^{-6}$	0.157	0.142	1
TG	White	MARCH3	$9.80\times10^{-6}$	0.167	0.040	1
TC	White	AKR7A3	$1.17 \times 10^{-5}$	0.199	0.241	1

HDL, high-density lipoprotein; LDL, low-density lipoprotein; TC, total cholesterol; TG, triglyceride.

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Table 4

Replication of ACCORD common and rare variant results in REP1 and REP2 replication sets

			REP1		REP2	P2	
Gene symbol Gene name	Gene name	Fold change	P value	FDR P value	FDR P value Liver fold change	Liver FDR P	- Replication concordance
Мстб	Minichromosome maintenance complex component 6	1.69	$5.35 \times 10^{-4}$	0.034	-0.351	0.298	⇄
Smad3	SMAD family member 3	-2.23	$2.88 \times 10^{-3}$	0.091	-0.625	0.192	⇒
Dcun1d4	Defective in cullin neddylation 1 domain containing 4	1.47	0.013	0.194	-0.563	0.065	⇄
Несw2	HECT, C2, and WW domain containing E3 ubiquitin protein ligase 2	2.31	0.014	0.194	-0.563	0.098	⇄
Mipep	Mitochondrial intermediate peptidase	1.72	0.015	0.194	0.055	0.791	<u>_</u>
Ipol1	IMP 11	-1.88	0.022	0.235	-0.305	0.147	⇒
R3hdm1	R3H domain containing 1	1.51	0.030	0.270	-0.436	0.065	⇄
Foxp1	Forkhead box P1	-1.41	0.035	0.276	-0.624	0.065	⇒
Stx8	Syntaxin 8	1.51	0.043	0.295	-0.374	0.065	⇄
Mapk10	Mitogen-activated protein kinase 10	-1.43	0.047	0.295	NA	NA	$\rightarrow$
Hsd17b13	Hydroxysteroid 17-β dehydrogenase 13	NA	NA	NA	-0.526	$5.93 \times 10^{-4}$	<b>→</b>
Pbx4	PBX homeobox 4	NA	NA	NA	-0.646	0.122	$\rightarrow$
Cyp4f39ª	Cytochrome P450, family 4, subfamily f, polypeptide 39	NA	NA	NA	-0.237	0.539	I

FDR, false discovery rate; IMP-11, importin 11; NA, not applicable.

 $<sup>^{2}</sup>$ Cyp4739 is the murine homologue for human CYP4F22,  $^{\uparrow}$  statistically significant increase (FDR Pvalue < 0.3);  $^{\downarrow}$  statistically significant decrease (FDR Pvalue < 0.3), fold change not statistically significant (FDR Pvalue 0).