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# An epigenome-wide association study of inflammatory response to fenofibrate in the Genetics of Lipid Lowering Drugs and **Diet Network**

Aim: Fenofibrate, a PPAR- $\alpha$  inhibitor used for treating dyslipidemia, has welldocumented anti-inflammatory effects that vary between individuals. While DNA sequence variation explains some of the observed variability in response, epigenetic patterns present another promising avenue of inquiry due to the biological links between the PPAR- $\alpha$  pathway, homocysteine and S-adenosylmethionine – a source of methyl groups for the DNA methylation reaction. Hypothesis: DNA methylation variation at baseline is associated with the inflammatory response to a short-term fenofibrate treatment. Methods: We have conducted the first epigenome-wide study of inflammatory response to daily treatment with 160 mg of micronized fenofibrate over a 3-week period in the Genetics of Lipid Lowering Drugs and Diet Network (GOLDN, n = 750). Epigenome-wide DNA methylation was quantified on CD4<sup>+</sup> T cells using the Illumina Infinium HumanMethylation450 array. Results: We identified multiple CpG sites significantly associated with the changes in plasma concentrations of inflammatory cytokines such as high sensitivity CRP (hsCRP, 7 CpG sites), IL-2 soluble receptor (IL-2sR, one CpG site), and IL-6 (4 CpG sites). Top CpG sites mapped to KIAA1324L (p = 2.63E-10), SMPD3 (p = 2.14E-08), SYNPO2 (p = 5.00E-08), ILF3 (p = 1.04E-07), PRR3, GNL1 (p = 6.80E-09), FAM50B (p = 3.19E-08), RPTOR (p = 9.79e-07) and several intergenic regions (p < 1.03E-07). We also derived two inflammatory patterns using principal component analysis and uncovered additional epigenetic hits for each pattern before and after fenofibrate treatment. Conclusion: Our study provides preliminary evidence of a relationship between DNA methylation and inflammatory response to fenofibrate treatment.

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Keywords: epigenome-wide study • fenofibrate • inflammation • methylation

Fenofibrate is a second generation fibric acid drug derived from the prototype clofibrate. In comparison to first generation drugs, it has improved efficacy and safety [1]. Fenofibrate is an agonist of PPAR- $\alpha$ , and is known to improve lipid profiles, mainly by reducing the levels of triglycerides (TG) and increasing high density lipoprotein cholesterol [2,3]. It has also been shown to reduce systemic inflammation [4-6]. For example, treatment with fenofibrate reduced proinflammatory markers like TNF- $\alpha$  and CRP and

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improved insulin sensitivity in patients with hypertriglyceridemia [7]. In another study, fenofibrate therapy reduced plasma levels of inflammatory cytokines such as the MCP-1, MIP-1 $\alpha$  and IL-1 $\beta$  in patients with hypertriglyceridemia and metabolic syndrome [8]. Effective fenofibrate therapy had a significant inhibitory effect on the release of monocytederived inflammatory cytokines IL-1β, IL-6 and MCP-1 in patients with type IIb dyslipidemia [9] and hyperlipidemia [10]. Both fenofibrate and simvastatin markedly reduced

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plasma levels of high-sensitivity CRP (hsCRP), IL-1 $\beta$ and sCD40L in patients with hyperlipidemia [11]. Fenofibrate was also found to be effective in decreasing lipids (total cholesterol, TGs, low density lipoproteins and apolipoprotein B), and cytokines like TNF- $\alpha$ and interferon (IFN)- $\gamma$  in plasma in patients with atherosclerosis and hyperlipoproteinemia IIb [12]. The anti-inflammatory effect of fenofibrate likely occurs via the very low density lipoprotein and low density lipoprotein mediated pathways, although the exact mechanisms remain to be elucidated in patients with hypertriglyceridemia and metabolic syndrome [8].

The response to fenofibrate treatment is highly variable among individuals. There are very few studies, however, that have investigated the role of genetic variation in the anti-inflammatory effects of fenofibrate treatment. Results from previous analyses of the Genetics of Lipid Lowering Drugs and Diet Network (GOLDN) have shown that common genetic polymorphisms are associated with variation in lipid response to fenofibrate [13-17]. Additionally, several novel biologically relevant loci are shown to be associated with systemic inflammation before and after fenofibrate treatment [18], but no significant predictors of change in individual cytokine concentrations were reported. In a candidate gene study, CRP variants were shown to be associated with response to fenofibrate treatment in participants with metabolic syndrome [19]. Even though the findings of genetic studies have been scant, it is plausible that epigenetic factors like DNA methylation may be a more fruitful area of inquiry due to homocysteine, an important component of the methionine biosynthetic pathway. Fenofibrate has been shown to elevate homocysteine in a PPAR-a dependent manner [20]. Specifically, fenofibrate activates PPAR-a, which in turn increases the expression of enzyme MAT that converts methionine into SAM [21]. SAM undergoes demethylation to form S-adenosyl homocysteine, which is then converted to homocysteine [22]. SAM, thus produced during conversion of methionine to homocysteine, serves as a source of methyl groups required for DNA methylation [23]. Despite the biological plausibility of an epigenetic effect, a previous analysis of GOLDN data [24] has reported that lipid changes due to fenofibrate treatment were not associated with DNA methylation patterns, but no studies to date have explored epigenomic determinants of changes in inflammatory biomarkers following a fenofibrate intervention. To address this gap in evidence, we have conducted the first epigenome-wide study of inflammatory response to fenofibrate treatment, set within a 3-week intervention in GOLDN study participants (n = 750).

# Methods

## Study design

The GOLDN study recruited families of European ancestry from the field centers of the NHLBI Family Heart Study in Minneapolis, MN and Salt Lake City, UT. It was initiated to assess how genetic contribution to environmental stimuli (diet and drug) influence blood levels of TGs and other atherogenic lipid species as well as inflammatory markers (registered at ClinicalTrials.gov, number NCT00083369). The GOLDN study investigated genetic determinants of lipid response to two interventions: challenge with a high-fat meal, and treatment with fenofibrate (160 mg) for 3 weeks. For the purposes of this study, we used data from the second intervention. Families with two siblings were recruited and were asked to abstain from lipid lowering agents (nutraceuticals and pharmaceuticals) for at least 4 weeks prior to their first visit. They were also asked to fast for 8 h prior to study visits, and abstain from alcohol 24 h prior to their study visit [18]. Validated questionnaires were used to collect demographic, lifestyle and dietary information. Each participant provided informed consent during the screening visit. The protocol was approved by the Institutional Review Boards of University of Minnesota, University of Utah, Tufts University/New England Medical Center, and the University of Alabama at Birmingham. More details about the GOLDN study have been published in earlier reports [17-18,25-27]. Baseline and postfenofibrate intervention data were available for 750 participants with DNA methylation measurements. We included all available participants; power was estimated *a priori* and found sufficient to detect effects >2%.

## Measurement of inflammatory biomarkers

For measurement of inflammatory biomarkers in serum, the blood samples were collected from the participants and centrifuged at  $2000 \times g$  for 15 min at 4°C within 20 min of collection. The samples were stored at -70°C until analysis. All the samples were analyzed at the same time to rule out variation within the assays. HsCRP was measured on the Hitachi 911 using a latex particle enhanced immunoturbidimetric assay (Kamiya Biomedical Company, WA, USA). IL-6, IL-2 soluble receptor (sR)- $\alpha$ , TNF- $\alpha$  and chemokine MCP-1 were all measured using quantitative sandwich enzyme immunoassay (ELISA kits, R&D systems, MN, USA) according to the protocol from the manufacturer [28].

#### Estimation of DNA methylation

For estimation of DNA methylation, DNA was extracted using DNeasy kits (Qiagen, USA) from CD4<sup>+</sup> T cells purified from buffy coats (from whole

blood) using antigen-specific beads (Thermofisher Scientific, MA, USA). Genome-wide DNA methylation was estimated using Illumina Infinium Human-Methylation450 Bead chip (Illumina Inc., CA, USA) as described in previous studies [29]. Briefly, 500 ng of DNA treated with sodium bisulfite (EZ DNA, Zymo Research, CA, USA) was used to perform the standard Illumina amplification, hybridization and imaging steps.  $\beta$  scores (the proportion of total signal from methylation-specific probe or color channel) and p-values (the probability that the total intensity for a given probe falls within the background signal intensity) were estimated using Illumina Genome Studio. The resulting  $\beta$  scores were normalized using the ComBat package for R software to account for observed batch effects [30]. Random subsets of 10,000 CpGs per run were run after normalization, in which each array of 12 samples were used as batch. Correction for differing probe chemistry was performed on Illumina Infinium HumanMethylation450 Bead chip, normalizing the probes separately from the Infinium I and II [26-27,29,31]. If the probe sequence in the CpGs mapped either to a location that did not match the annotation file or to >1 locus, they were eliminated. These markers were identified by realigning all probes (with unconverted Cs) to the human reference genome. Methylation data were generated from CpGs after performing quality control (QC) procedures. Principal components (PCs) were generated based on the  $\beta$ -scores of all autosomal CpGs that passed QC by using the prcomp function in R (v2.12.1) [32]. Epigenome-wide DNA methylation was quantified using identical protocols before and after the fenofibrate intervention.

#### Statistical analysis

Differences in inflammatory biomarker profiles preand postfenofibrate intervention were analyzed using paired two-sided t-tests. A total of 244 participants were excluded from the analysis if they were missing outcome or covariate data. Outcomes were defined using ratios of post- to prefenofibrate treatment plasma concentrations of each biomarker (hsCRP, IL-2sR-a, IL-6, MCP1, TNF- $\alpha$ ), as well as previously derived [28] inflammatory patterns pre- and postfenofibrate treatment. Log- or square root-transformations were carried out for non-normally distributed ratios. For the model with the strongest evidence of association, a sensitivity analysis was conducted with the outcome defined as the difference in post- and prefenofibrate treatment concentrations rather than a ratio, adjusting for baseline values. PC analysis (PROC FACTOR in SAS) was used to derive inflammatory patterns [33]. All five inflammatory biomarkers were measured before fenofibrate treatment, and entered into the model, to

produce two inflammatory patterns based on evaluation of eigenvalues and the Scree plot [28]. Interpretability was improved by rotating the patterns using the VARIMAX option [34]. For derivation of postfenofibrate inflammatory patterns, the procedure was repeated with the same markers measured in fasting serum collected at the end of the intervention.

To remove the confounding due to T-cell impurity in DNA methylation profiles, residuals of methylation were obtained by entering the four PCs derived from whole-genome methylation as fixed effects in linear mixed models [24]. In sensitivity analyses, additional adjustments were made for lifestyle factors that may modify DNA methylation, including smoking (current smoking yes or no), alcohol consumption (in grams per day) and BMI (kg/m<sup>2</sup>). Bonferroni correction was used to account for multiple comparisons, with the genome-wide significance level of 0.05/(number of CpGs or 450,000) =  $1.1 \times 10^{-7}$ . Manhattan plots were constructed to visualize the results. To evaluate deviations from the expected test statistic distributions, quantile-quantile (Q-Q) plots were constructed. All the datasets on which the conclusion of report relies are available on request.

#### Results

General characteristics of the study population are summarized in Table 1. At baseline, the mean age of participants was 48 ± 16 years; about half of the participants were female. All participants were of selfreported European ancestry. Paradoxically, serum concentrations of all inflammatory biomarkers except hsCRP slightly increased from baseline to postfenofibrate treatment (Table 1). The data meet the assumption of the tests. The top loci associated with the postto prefenofibrate treatment ratio for each inflammatory biomarker are described in Table 2. We identified seven CpGs significantly associated with hsCRP, one with IL-2sR and four with IL-6 (Table 2). The Manhattan plots summarizing the results of the epigenome-wide analyses for each outcome are shown in Figure 1. The quantile-quantile (Q-Q) plots were used to summarize the results of the epigenome-wide analyses for each outcome (data not shown). The following lambda values were estimated for each model, indicating modest deviations for all phenotypes except for CRP: 1.22 (hsCRP ratio), 1.08 (IL-2sR-α ratio), 1.01 (IL-6 ratio), 0.98 (MCP-1 ratio) and 1.03 (TNF-a ratio). There was no meaningful change in the results after sensitivity analysis after adjustment for alcohol, smoking and BMI (Supplementary Table 1). Consistent with previous reports by Kabagambe et al. and Aslibekyan et al. [18,28], two inflammatory patterns were identified each before and after fenofibrate treatment:

Table 1. Characteristics of the Genetics of Lipid Lowering Drugs and Diet Network study participants (n = 750).								
Variable	Baseline (n = 750)	After 3 weeks (n = 750)	p-value					
Age (years)	48.90 (15.97)	-						
Sex (% female)	49.7	-						
High sensitivity C-reactive protein (mg/dl)	0.24 (0.35)	0.26 (0.47)	0.20					
IL-2 soluble receptor- $\alpha$ (pg/ml)	1015.80 (359.37)	1163.30 (534.58)	<0.0001					
IL-6 (pg/ml)	2.07 (3.62)	2.23 (3.55)	0.009					
TNF-α (pg/ml)	3.51 (6.10)	3.79 (4.22)	0.002					
MCP-1 (pg/ml)	208.49 (68.31)	224.03 (76.92)	<0.0001					
Data are presented as mean $\pm$ SD or N (%).								

hsCRP-IL6 (Factor 1) and MCP1-TNF- $\alpha$  (Factor 2). The two top hits for Factor 1 prefenofibrate treatment were *BCL2L15* and *KCNQ1*, and *BCL2L15* and *GRIA4* emerged as top epigenetic correlates of Factor 2 postfenofibrate treatment. There were no significant hits for postfenofibrate treatment for Factor 1 and for prefenofibrate treatment Factor 2 (Supplementary Table 2). These hits were not consistent with those found for individual cytokines.

## Discussion

To our knowledge, this is the first study to investigate the epigenomic determinants of changes in inflammatory biomarkers following a fenofibrate intervention. Among individual inflammatory biomarkers' response to fenofibrate, the strongest association was found for CpG associated with the CRP-IL-2sR pattern, located in *KIAA1324L* (chromosome 7). Human *KIAA1324L*, or *EIG121L*, is markedly downregulated

by a constitutively active mutant of Ras [35]. At least seven of the top ten genes shown to interact with KIAA1324L were related to inflammation: DLC1, ERBB4, PDCD4, TSPAN3, RPS23, ESR1, TCEAL4 and PDE5A [36]. DLC1 is a tumor suppressor gene, absence of which results in inflammation in gastric cancer [37]. ERBB4 has been shown to function both as an oncogene as well as a tumor suppressor gene. Over-expression of ERBB2 has been shown to enhance cellular transformation in human colon cancer [38]. Loss of ERBB4 led to exacerbation of acute or chronic inflammation in mouse models of liver injury [39]. PDCD4 is a neoplastic transformation inhibitor and thus acts as a tumor suppressor but inhibiting tumor promoter-induced neoplastic transformation that is usually driven by inflammation [40]. RPS23 belongs to the family of ribosomal proteins, and is found to be optimal in bowel inflammation and cancer [41]. ESR1 is one form of the estrogen receptor that is involved

Table 2. Top loci associated with inflammatory response to ratio of pre- and postfenofibrate treatment in Genetics of Lipid Lowering Drugs and Diet Network study participants.

CpG site	CHR	Genes	BP	BETA	SE	p-value	n	Phenotype
cg22616933	7	KIAA1324L	86547833	-55.88	8.72	2.63E-10	749	ratio_crp
cg13215593	2	-	558823	-23.32	4.01	9.45E-09	738	ratio_crp
cg05591728	16	SMPD3	68477022	-47.30	8.35	2.14E-08	749	ratio_crp
cg09245319	2	_	227049703	-73.22	13.21	4.22E-08	749	ratio_crp
cg14717666	4	SYNPO2	119862992	32.46	5.89	5.00E-08	748	ratio_crp
cg08623156	12	-	113577046	-41.66	7.75	1.03E-07	749	ratio_crp
cg18630811	19	ILF3	10791805	-83.20	15.48	1.04E-07	748	ratio_crp
cg18221028	6	PRR3; GNL1	30523418	11.91	2.03	6.80E-09	748	ratio_il2
cg27445347	6	FAM50B	3849801	-6.64	1.19	3.19E-08	749	ratio_il6
cg06343673	17	RPTOR	78778232	-1.34	0. 27	9.79E-07	749	ratio_il6
cg13098428	17	RPTOR	78775814	-1.36	0.28	2.03E-06	749	ratio_il6
cg16896879	17	RPTOR	78778094	-6.58	1.45	6.71E-06	749	ratio_il6



# Epigenetic predictors of inflammatory response to fenofibrate Research Article

Figure 1. Manhattan plots of the epigenome-wide association study in Genetics of Lipid Lowering Drugs and Diet Network participants (see previous page). Manhattan plots of genome-wide results of testing for association between CpGs and Inflammatory response to ratio of pre- and postfenofibrate treatment (A–E) inflammatory patterns. The X-axes display the chromosome on which the CpG is located, the Y-axes display –log10 (p-value). (A) High-sensitivity CRP; (B) IL-2 soluble receptor- $\alpha$ ; (C) IL-6; (D) MCP-1; (E) TNF- $\alpha$ .

in inflammation and cancer [42,43]. *TCEAL4* is a transcription elongation factor that is downregulated in thyroid cancer [44]. *PDE5A* is an enzyme from the phosphodiesterase class, and has been recently discovered to downregulate inflammatory cytokines partially through the activation of Akt signaling pathway [45].

Other strong associations were found for IL-2sR, specifically at cg18221028 near PRR3, GNL1 and for IL-6, namely at cg27445347 near FAM50B (all on chromosome 6). Pseudo response regulator 3 (PRR3) transcript levels vary in a circadian pattern with peak expression at dusk under long and short day conditions [46]. Of the ten top genes interacting with PRR3, five (GCN20, ABCF1, TRIM27, BLMH and LIG3) were associated with inflammation [36]. GNL1, a putative nucleolar GTPase, belongs to the MMR1-HSR1 family of large GTPases that are emerging as crucial coordinators of signaling cascades in different cellular compartments [47]. Additional associations that were approaching statistical significance were found for CpGs (cg06343673, cg13098428 and cg16896879) associated with IL-6, near RPTOR (chromosome 17). RPTOR is involved in the control of the mTORC1 activity which regulates cell growth and survival, and autophagy in response to nutrient and hormonal signals; functions as a scaffold for recruiting mTORC1 substrates. mTORC1 is activated in response to growth factors or amino acids. Growth factor-stimulated mTORC1 activation involves AKT1-mediated phosphorylation of TSC1-TSC2, which leads to the activation of the RHEB GTPase that potently activates the protein kinase activity of mTORC1 [48,49]. Several studies have demonstrated an important role for RPTOR in regulation of inflammation in various diseased conditions. Micro RNA (miR)-155 has been shown to target RPTOR in lung epithelial cells from patients with cystic fibrosis [50]. The disruption of mTORC1 signaling in macrophages had a protective effect against inflammation and insulin resistance [51]. In another study, treatment with rapamycin or hepatocyte-specific ablation of Raptor resulted in increased levels of IL-6 production, activation of signal transducer and activator of STAT3, and increase in development of hepatocellular carcinoma [52]. mTOR signal pathway activation resulted in activation of TLR-4 during THP-1 macrophage foam cells formation [53].

To date, few pharmacogenomic studies have evaluated the role of methylation in the inflammatory response. An 8-week daily supplementation with

200 mg oligomeric flavonoids from grape seeds did not cause major changes of DNA methylation state but influenced the expression of genes associated with cardiovascular disease pathways [54]. SAM is a methyl donor in DNA methylation, and has been shown to lower lipopolysaccharide-induced expression of the proinflammatory cytokine TNF- $\alpha$  and increase the expression of the anti-inflammatory cytokine IL-10 in macrophages. SAM was found to modulate the expression of inflammatory genes in association with changes in specific gene promoter DNA methylation [55]. Treatment with folic acid (FA)/B12 was found to be associated with more rapid progression of coronary artery disease (CAD). ADMA and TML are both produced by post-translational SAM-dependent methylation of precursor amino acid via proteolytic release. In patients with established CAD, baseline ADMA and TML was associated with angiographic progression of CAD, but treatment with FA/B12 (± B6) did not alter the levels of neither ADMA nor TML [56].

Epigenetic regulators are shown to be involved in histone acetylating and deacetylating activities that contribute to the pathogenesis of atherosclerosis and restenosis. Since these alterations in chromatin structure are reversible, these epigenetic modifications can be subjected to pharmacological intervention for the management of cardiovascular diseases [57]. Plaques preferentially develop in arterial regions of disturbed blood flow (d-flow), thus altering endothelial gene expression and function. D-flow was found to regulate genome-wide DNA methylation patterns in a DNA methyltransferase-dependent manner. This was followed by alteration of endothelial gene expression and induction of atherosclerosis [58]. Finally, a previous analysis of GOLDN data reported that lipid changes due to fenofibrate treatment are not associated with changes in DNA methylation patterns [24], although it did not investigate baseline methylation as a potential predictor. Overall, our study provides a unique perspective on the modulation of inflammatory biomarkers by fenofibrate and its association with epigenomic determinants.

There are several limitations of our study. First, the current study was only conducted in one cohort, and false positive results remain a concern. Replication of gene-drug response associations are costly and are logistically difficult to conduct, but can markedly improve the quality of published studies by minimizing false-positive findings. However, approaches like functional validation, combined analysis of several populations and simulations could provide an allencompassing and scrupulous path for validating the findings from studies on genetic association [59]. Future studies should consider these alternative approaches to follow-up of our preliminary findings. Second, in the current epigenome-wide study, we were limited to interrogating DNA methylation in genomic regions included on the Illumina 450K array. It is possible that methylation patterns beyond those quantified by the array may also influence response to fenofibrate. Third, we only quantified methylation on CD4<sup>+</sup> T cells (the most abundant lymphocyte in whole blood) to limit confounding by cell type. Thus, future studies may consider other relevant cell types, for example, monocytes, to test the generalizability of our findings.

Fenofibrate is a lipid lowering drug, and has been reported to reduce inflammation. Our group had

previously identified several biologically relevant

loci that were associated with inflammation. In this

study, we investigated the epigenomic determinants of

changes in inflammatory biomarkers after fenofibrate intervention. We found that several CpG sites were associated with change in plasma concentrations of inflammatory cytokines, namely hsCRP, IL-2sR and IL-6. We also found additional hits for each inflammatory pattern before and after fenofibrate treatment. The findings from our study provide basis for relationship between DNA methylation and fenofibrate treatment.

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#### Supplementary data

To view the supplementary data that accompany this paper please visit the journal website at: www.futuremedicine.com/ doi/full/10.2217/pgs-2017-0037

# Summary points

Conclusion

- We conducted the first study of epigenomic determinants of changes in inflammatory biomarkers following a fenofibrate intervention.
- A total of seven CpG sites were found to be significantly associated with hsCRP, one with IL-2sR, and four with IL-6.
- The strongest association was found for the CpG site associated with the CRP-IL-2sR pattern, located in *KIAA1324L* (chromosome 7).
- Seven of the top ten genes shown to interact with *KIAA1324L* were related to inflammation.

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