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# **Gene Sequencing Identifies Perturbation in Nitric Oxide Signaling as a Non-lipid Molecular Subtype of Coronary Artery Disease**

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### **Abstract**

**Background:** A key goal of precision medicine is to disaggregate common, complex diseases into discrete molecular subtypes. Rare coding variants in the low-density lipoprotein receptor gene  $(LDLR)$  are identified in 1–2% of coronary artery disease (CAD) patients, defining a molecular subtype with risk driven by hypercholesterolemia.

**Methods:** To search for additional subtypes, we compared the frequency of rare, predicted loss-of-function and damaging missense variants aggregated within a given gene in 41,081 CAD cases versus 217,115 controls.

**Results:** Rare variants in LDLR were most strongly associated with CAD, present in 1% of cases and associated with 4.4-fold increased CAD risk. A second subtype was characterized by variants in endothelial nitric oxide synthase gene (NOS3), a key enzyme regulating vascular tone, endothelial function, and platelet aggregation. A rare predicted loss-of-function or damaging missense variants in NOS3 was present in 0.6% of cases and associated with 2.42-fold increased risk of CAD (95%CI 1.80 to 3.26; p=  $5.5 \times 10^{-9}$ ). These variants were associated with higher systolic blood pressure (+ 3.25 mm Hg; 95%CI 1.86 to 4.65; p=  $5.0 \times 10^{-6}$ ) and increased risk of hypertension (adjusted odds ratio 1.31;  $95\%$ CI 1.14 to 1.51;  $p = 0.0002$ ) but not circulating cholesterol concentrations, suggesting that – beyond lipid pathways – nitric oxide synthesis is a key nonlipid driver of CAD risk.

**Conclusions:** Beyond LDLR, we identified an additional nonlipid molecular subtype of CAD characterized by rare variants in the NOS3 gene.

### **Keywords**

rare variant association study; NOS3; coronary artery disease; precision medicine

# **Introduction**

Careful study of patients with a specific molecular defect can provide generalizable insights into disease biology and – in some cases – enable targeted therapies, as recently demonstrated for genetically defined subtypes of severe obesity and congestive heart failure<sup>1,2</sup>.

For coronary artery disease, loss-of-function variants in the gene encoding the low-density lipoprotein receptor (*LDLR*) are the prototypical molecular subtype<sup>3</sup>. This condition – known as familial hypercholesterolemia – is characterized by impaired hepatic clearance of LDL cholesterol from the circulation. Although patients with rare LDLR variants account for only 1–2% of patients with coronary artery disease<sup>4–8</sup>, recognition of this subtype

is nonetheless important. Of particular value is identifying individuals prior to disease onset, given recent evidence that early initiation of statin therapy in patients with familial hypercholesterolemia can largely offset the natural history of accelerated atherosclerosis<sup>9</sup>.

Rare variant association studies – recently enabled by large-scale gene sequencing efforts – provide an opportunity to identify new subtypes for a given disease. Because any individual rare variant is not observed with adequate frequency to test for an association with a given trait, variants are grouped into sets with aggregate frequencies compared between cases and controls<sup>10,11</sup>. One principled strategy aggregates putative loss-of-function variants in each gene ('pLoF'), with the potential additional inclusion of very rare missense variants predicted to be damaging by computational algorithms ('pLoF+missense') $^{4,12-14}$ , as described in Online Methods.

For coronary artery disease, rare variants in at least ten genes have been shown to impact coronary artery disease risk, all related to lipid pathways<sup>15</sup>. We set out to test the hypothesis that rare variant association analyses might allow for the identification of damaging variants in nonlipid genes – feature additional novel molecular subtypes – that impact the risk of coronary artery disease. To this end, we aggregated gene sequencing data from 41,081 cases and 217,115 controls from four independent datasets.

# **Methods**

To minimize the possibility of unintentionally sharing information that can be used to reidentify private information, the human genetic data used in this study are available at the database of Genotypes and Phenotypes (dbGaP) and can be accessed through the accession number listed for each study in the Data Supplement. The UK Biobank data with the full summary statistics generated in this study can be applied through the UK Biobank Access Management System. This research was approved by the Mass General Brigham institutional review board (protocol 2013P001840) and was performed under UK Biobank application #7089. For all the study samples used in this study, written informed consent was received from participants prior to inclusion in the study. Full description of methods is provided in the Data Supplement.

# **Results**

To test the hypothesis that rare genetic variants in a given gene might enable identification of molecular subtypes of coronary artery disease, we studied gene sequencing data from 41,081 cases and 217,115 controls from four independent datasets. Across the four cohorts analyzed, the mean age at the time of coronary artery disease onset was 53 years and 51.9% were male (Table 1 and Supplemental Table I–V). The Myocardial Infarction Genetics ExSeq (MIGen ExSeq) study and WGSeq (MIGen WGSeq) included a range of ancestries – 40% European, 2% East Asian, 49% South Asian, and 7% African – while the majority of participants in the UK Biobank 13K and 200K studies<sup>16–18</sup> were of European ancestry (Table 1 and Supplemental Figure I).

# **ASSOCIATION OF LDLR VARIANTS AND RISK OF CORONARY ARTERY DISEASE**

As expected, variants in  $LDLR$  – known to cause the familial hypercholesterolemia subtype – were most strongly associated with coronary artery disease using either of the two variant aggregation strategies (Figure 1 and Figure 2). Aggregated across all four datasets using the 'pLoF+missense' strategy, a rare variant in LDLR was noted in 0.91% of cases versus 0.34% of controls, corresponding to an adjusted odds ratio of 4.39 (95%CI 3.44 to 5.60; p =  $1.7 \times$ 10<sup>-32</sup>). As in previous studies<sup>7,8</sup>, this association was somewhat stronger among carriers of inactivating variants (LOFTEE predicated high confidence variants, adjusted odds ratio 6.58, 95%CI 3.76 to 11.50, p-value =  $4.1 \times 10^{-11}$ ) as compared to those previously annotated as pathogenic in the ClinVar database (adjusted odds ratio 3.80, p-value =  $5.2 \times 10{-}20$ , p-value for heterogeneity  $= 0.09$ , or missense variants predicted to be damaging by five prediction algorithms (adjusted odds ratio 2.65, p-value =  $1.0 \times 10^{-21}$ , p-value for heterogeneity = 0.003 when compared the the LOFTEE variants).

Consistent with hypercholesterolemia as the driving physiology, estimated untreated LDL cholesterol concentrations in UK Biobank 200K participants were significantly higher in carriers of LDLR variants identified using the 'pLoF+missense' strategy versus noncarriers – mean 182 versus 145 mg/dl respectively (adjusted difference +37 mg/dl; 95%CI 34.71 to 39.79; p=  $2.91 \times 10^{-181}$ ). Importantly, our estimate of a 4.4-fold increased risk for coronary artery disease may have been attenuated by differential treatment of carriers with risk-reducing therapies in clinical practice. Taking the UK Biobank datasets as an example, for those people without diagnosed coronary artery disease, 40% (247 of 618) of LDLR variant carriers reported treatment with lipid-lowering medications as compared to 17% (30,023 of 175,993) of non-carriers.

## **NOS3 VARIANTS, HYPERTENSION, AND RISK OF CORONARY ARTERY DISEASE**

Rare variants in the gene encoding endothelial nitric oxide synthase 3 (NOS3) were identified as a second driver of coronary artery disease risk (Figure 1 and Figure 3). Using the 'pLoF+missense' strategy, a NOS3 variant was present in 0.59% of cases versus 0.41% of controls, corresponding to an adjusted odds ratio of 2.42 (95%CI 1.80 to 3.26;  $p = 5.5 \times 10^{-9}$ ). This association was consistently driven by variants identified using the 'pLoF' strategy (adjusted odds ratio 2.30, 95%CI 1.54 to 3.42, p-value =  $4.1 \times 10^{-5}$ ), as well as by the additional missense variants predicted to be damaging by five prediction algorithms added using the 'pLoF+missense' strategy (adjusted odds ratio 1.51, 95%CI 1.24 to 1.84, p-value =  $4.9 \times 10^{-5}$ ). Consistent with a known role of this pathway in the regulation of vascular tone, higher systolic blood pressure (+ 3.25 mm Hg; 95%CI 1.86 to 4.65; p=  $5.0 \times 10^{-6}$ ) and increased risk of hypertension (adjusted odds ratio 1.31; 95%CI 1.14 to 1.51;  $p = 0.0002$ ) were noted among 850 carriers of a *NOS3* variant in the UK Biobank 200K dataset as compared to 173,697 non-carriers with blood pressure trait data available, but without a significant association with LDL cholesterol, HDL cholesterol, total cholesterol or triglycerides (Supplemental Table VI, Figure 3B, and Supplemental Table VII). A similar result of sensitivity analysis (adjusted odds ratio 2.41, 95%CI 1.78 to 3.25, p-value =  $9.5 \times 10^{-9}$ ) for the NOS3 gene by partitioning the sample by European and non-European ancestry reassured the robustness of the association results discovered in this study (Supplemental Figure II).

Nitric oxide produced by NOS3 acts as a signaling molecule to activate soluble guanylyl cyclase via a heterodimeric receptor encoded by the  $GUCY1A3$  and  $GUCY1B3$  genes<sup>19</sup>. In an exploratory analysis across all four datasets using the 'pLoF+missense' strategy, we observe nominally significant associations for these two additional genes with risk of coronary artery disease, adjusted odds ratios  $1.75$  (95%CI 1.16 to 2.64; p = 0.007) and 2.31 (95%CI 1.29 to 4.12;  $p = 0.005$ ) respectively, Supplemental Figure III. As noted for NOS3, carriers of variants in either GUCY1A3 or GUCY1B3 also had increased risk of hypertension, adjusted odds ratios of 1.39 (95%CI 1.14 to 1.69; p = 0.001) and 1.53 (95%CI 1.15 to 2.03;  $p = 0.004$ ) respectively. A post hoc pathway analysis that aggregated variants in any of three genes – NOS3, GUCY1A3, and GUCY1B3 – using the 'pLoF+missense' strategy noted a variant in 1.05% of cases versus 0.80% of controls, corresponding to an adjusted odds ratio of 2.19 for CAD disease risk; 95% CI 1.76 to 2.74;  $p = 4.5 \times 10^{-12}$ , Supplemental Table VII.

# **Discussion**

By comparing the frequency of rare DNA variants within the coding sequence of a given gene in 41,081 coronary artery disease cases versus 217,115 controls, we identify one more subtype distinct from LDL cholesterol pathways. 0.6% of patients with coronary artery disease inherit an abnormality in nitric oxide production – associated with increased risk of hypertension.

Our identification of rare LDLR variants as the most strongly associated with coronary artery disease – present in 1% of affected individuals – confirms prior results and provides a useful positive control for the overall analytic framework. Previous studies have similarly noted an LDLR variant prevalence of 1–2% among patients afflicted by coronary artery disease, corresponding to a three- to five-fold increased risk $4-8$ . Importantly, individuals have increased risk of coronary artery disease even when compared to those with similarly elevated LDL cholesterol levels – likely reflecting increased lifelong exposure – but remain underdiagnosed and undertreated within current practice  $8,20$ .

The second molecular subtype relates to perturbation of the nitric oxide pathway, present in 0.6% of coronary artery disease cases and associated with 2.42-fold increased risk of coronary artery disease. This is consistent with impairment of endothelial function and nitric oxide production as the earliest derangement in coronary atherosclerosis $2^{1,22}$ . Two additional lines of genetic support for the involvement of this pathway include prior association of a rare, loss-of-function variant in GUCY1A3 with coronary artery disease in a large family, and common variant association studies that linked noncoding regulatory variants near NOS3 and  $GUCY1A3$  with increases in risk of coronary disease<sup>23–25</sup>. Beyond an impact on vascular tone, previous studies have additionally linked deficiency of plateletderived nitric oxide with arterial thrombosis $26,27$ . Whether individuals who inherit a defect in nitric oxide signaling might derive selective benefit in treatment or prevention of coronary artery disease from pharmacologic upregulation of the pathway – already possible using several existing classes of medication – remains uncertain<sup>28,29</sup>.

Despite our careful analysis of over 40,000 coronary artery disease cases, our analysis likely remained underpowered. To that end, we agree with recent recommendations that analysis of at least 250,000 afflicted individuals will be required to adequately test the hypothesis of a gene-disease relationship for the majority of genes<sup>30</sup>. Importantly, these sample sizes have become increasingly tractable in recent years with the advent of sequencing of large and ancestrally-diverse populations<sup>12,31–33</sup>. We anticipate that these future analyses will confirm that a subset of the most strongly associated – but subthreshold – genes are drivers of risk for coronary artery disease. As an example, carriers of variants in the ZNF687 gene tended to have increased risk of coronary artery disease using both the 'pLoF' and 'pLoF+missense' strategies, ranking 2nd and 14th among the studied genes respectively (Figure 1A and Supplemental Table VIII). Interesting, rare variants in this gene have previously been linked with Paget disease of bone, with preliminary evidence of accelerated cardiovascular disease in several familial and sporadic cases  $34,35$ . The fourth most strongly associated gene using the 'pLoF+missense' strategy (LPIN2) plays a role in lipid metabolism, and the loss of function of this gene leads to lipodystrophy and increased susceptibility to atherosclerosis in a mouse model<sup>36,37</sup>. The eleventh gene (*PANX1*) has been reported to have a role in cardiac response to ischemia and regulation of regulate blood pressure<sup>38</sup> (Supplemental Table VIII).

We note that, we used the weight of 0.75 for variants identified by the SpliceAI algorithm suggested by the developers of this tool<sup>39</sup>. However, the results for the NOS3 variants associated with coronary artery disease were largely unaffected by this choice of weighting, with odds ratios ranging from 2.26 to 2.55 for weight ranging from 0.5 to 1 using the 'pLoF+missense' strategy. In each case the strength of statistical association was below the Bonferroni-corrected p-value of  $1.25 \times 10^{-6}$ , Supplemental Table IX.

This study also has several limitations which may guide our future improvements. First, although we were able to gather a large number of CAD cases and controls, the power for studying rare variant association is still not sufficient, with our results consistent with other recent large-scale sequencing studies<sup>12,40</sup>. Second, computational predictions of a given variant's impact on protein function remain imperfect as compared to functional assays, which may have resulted in reduced statistical power $41,42$ . Third, additional work is needed to build a rare variant analysis framework that additionally considers impact on related traits, such as circulation lipids or blood pressure to improve statistical power $43,44$ .

In conclusion, we analyze gene sequencing data from 258,196 individuals and identify two molecular subtypes of coronary artery disease based on rare DNA variants in the LDLR and NOS3 genes that confer significantly increased risk.

# **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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# **Nonstandard Abbreviations and Acronyms**



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#### **Figure 1.**

Association of predicted loss-of-function variants and risk of coronary artery disease. Rare DNA variants predicted to lead to loss-of-function, disrupt mRNA splicing, or annotated as pathogenic or likely pathogenic within the ClinVar database were aggregated within each gene ('pLoF' strategy). Panel **A**) is a quantile-quantile plot of observed versus expected p-value distributions observed using this strategy. A second variant annotation strategy ('pLoF+missense') additionally included ultra-rare missense variants predicted to be damaging by each of five computational prediction algorithms within each gene. Panel **B**) is a quantile-quantile plot of observed versus expected p-value distributions of this mask. The horizontal line represents the Bonferroni-corrected p-value threshold of  $1.25 \times 10^{-6}$ , assuming 20,000 genes tested and two rare variant grouping masks used.  $\lambda$  refers to the genomic inflation factor, with values significantly higher than 1 suggestive of inadequate control for population stratification.

LDLR – low-density lipoprotein receptor; NOS3 – endothelial nitric oxide synthase (NOS3).



**Figure 2. Association of rare variants in the** *LDLR* **gene and risk of coronary artery disease.** Forest plots including carrier count across cases and controls within four studies for the gene encoding the low-density lipoprotein receptor (LDLR). Panel **A**) are the results for the counts of variants predicted to lead to loss-of-function, disrupt mRNA splicing, or annotated as pathogenic or likely pathogenic within the ClinVar database. Panel **B**) is the results from a second variant annotation strategy that additionally included ultra-rare missense variants predicted to be damaging by each of five computational prediction algorithms. The meta-analysis was performed by a fixed-effects meta-analysis model based on the effect size estimated from a Firth logistic regression analysis in each of the four studies. The bar in both plots presents 95% confidence interval.



## **Figure 3. Association of rare variants in the** *NOS3* **gene and risk of coronary artery disease and hypertension.**

Panel **A**) is a forest plot including carrier counts across cases and controls within four studies for the gene encoding endothelial nitric oxide synthase (NOS3). Variants included those predicted to lead to loss-of-function, disrupt mRNA splicing, or annotated as pathogenic or likely pathogenic within the ClinVar database, and ultra-rare missense variants predicted to be damaging by each of five computational prediction algorithms ('pLoF+missense). The meta-analysis was performed by a fixed-effects meta-analysis model based on the effect size estimated from a Firth logistic regression analysis in each of the four studies. The bar in the plot presents 95% confidence interval. Panel **B**) is the proportion of individuals from the UK Biobank 200K dataset who had been diagnosed with hypertension in carriers versus noncarriers of *NOS3* rare variants. The error bar in the bar plot represents the standard error.

## **Table 1.**

Coronary artery disease cases versus control datasets



SD, standard deviation.