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## Monogenic and Polygenic Contributions to Atrial Fibrillation Risk: Results from a National Biobank

Seung Hoan Choi<sup>1,†</sup>, Sean J. Jurgens<sup>1,†</sup>, Lu-Chen Weng<sup>1,2</sup>, James P. Pirruccello<sup>1</sup>, Carolina Roselli<sup>1</sup>, Mark Chaffin<sup>1</sup>, Christina Lee<sup>1</sup>, Amelia W. Hall<sup>1,2</sup>, Amit V. Khera<sup>1</sup>, Kathryn L. Lunetta<sup>3,4</sup>, Steven A. Lubitz<sup>1,2</sup>, Patrick T. Ellinor<sup>1,2</sup>

<sup>1</sup>Cardiovascular Disease Initiative, The Broad Institute of MIT and Harvard, Cambridge, MA, USA;

<sup>2</sup>Cardiovascular Research Center, Massachusetts General Hospital, Boston, MA, USA;

<sup>3</sup>NHLBI and Boston University's Framingham Heart Study, Framingham, MA, USA;

<sup>4</sup>Department of Biostatistics, Boston University School of Public Health, Boston, MA, USA.

### Abstract

**Rationale:** Genome-wide association studies have identified over 100 genetic loci for atrial fibrillation (AF); recent work described an association between loss-of-function (LOF) variants in *TTN* and early-onset AF.

**Objective:** We sought to determine the contribution of rare and common genetic variation to AF risk in the general population.

**Methods:** The UK Biobank is a population-based study of 500,000 individuals including a subset with genome-wide genotyping and exome sequencing. In this case-control study, we included AF cases and controls of genetically determined white-European ancestry; analyses were performed using a logistic mixed-effects model adjusting for age, sex, the first 4 principal components of ancestry, empirical relationships and case-control imbalance. An exome wide, gene-based burden analysis was performed to examine the relationship between AF and rare, high-confidence LOF variants in genes with  $\geq 10$  LOF carriers. A polygenic risk score (PRS) for AF was estimated using the LDpred algorithm. We then compared the contribution of AF PRS and LOF variants to AF risk.

**Results:** The study included 1,546 AF cases and 41,593 controls. In an analysis of 9,099 genes with sufficient LOF variant carriers, a significant association between AF and rare LOF variants was observed in a single gene, *TTN* (OR 2.71,  $P=2.50 \times 10^{-8}$ ). The association with AF was more significant (OR 6.15,  $P=3.26 \times 10^{-14}$ ) when restricting to LOF variants located in exons highly expressed in cardiac tissue (*TTN*<sub>LOF</sub>). Overall, 0.44% of individuals carried *TTN*<sub>LOF</sub> variants, of whom 14% had AF. Among individuals in the highest 0.44% of the AF PRS, only 9.3% had AF. In contrast, an AF PRS explained 4.7% of the variance in AF susceptibility, while *TTN*<sub>LOF</sub> variants only accounted for 0.2%.

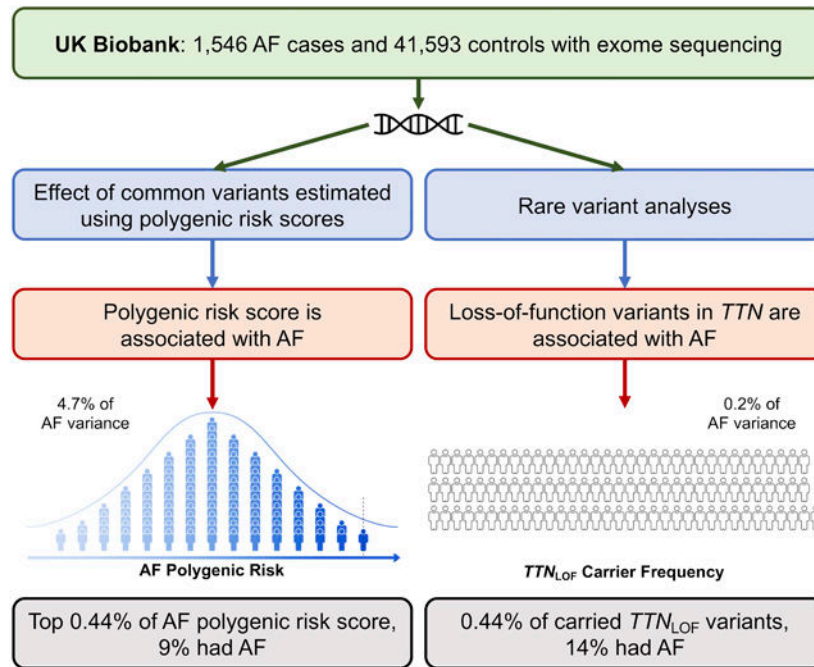
**Address correspondence to:** Dr. Patrick T. Ellinor, Cardiovascular Disease Initiative, The Broad Institute of MIT and Harvard, 75 Ames Street, Cambridge, MA 02124, ellinor@mgh.harvard.edu.

<sup>†</sup>S.H.C and S.J.J. contributed equally to this work.

S.A.L. and P.T.E. jointly supervised this work.

**Conclusion:** Both monogenic and polygenic factors contribute to AF risk in the general population. While monogenic  $TTN_{LOF}$  variants confer a substantial AF penetrance, polygenic risk explains a larger proportion of genetic susceptibility to AF.

### Graphical Abstract



Over the last decade, great progress has been made in defining the genetic basis of AF. Common variants have been identified at more than 100 genetic loci, and rare mutations have implicated many genes in AF. However, the relative contribution of rare and common genetic variants to AF risk remains unclear. The population-based UK Biobank provides a unique opportunity to assess the genetic contributions to AF risk. In an exome wide analysis, we found that LOF mutations in  $TTN$  were strongly associated with AF risk and were highly penetrant. A polygenic risk score of common variants explains a great proportion of AF risk than mutations in  $TTN$ . Among  $TTN$  mutation carriers, it would be interesting in future work to determine if a subtle cardiomyopathy is present by cardiac imaging or to examine the progression to heart failure or other AF co-morbidities.

### Keywords

Atrial fibrillation; genetics;  $TTN$ ; polygenic risk score; gene mutation; exome; association study

### Subject Terms:

Atrial Fibrillation

## INTRODUCTION

Atrial fibrillation (AF) is a prevalent cardiac arrhythmia and is associated with an increased risk of stroke, heart failure, dementia, and death<sup>1–3</sup>. AF currently affects over 3 million Americans and 30 million individuals worldwide<sup>4</sup>. While cardiometabolic factors play an important role<sup>5</sup>, a considerable heritable component is thought to contribute to the pathogenesis of AF<sup>6, 7</sup>. For example, one-fourth of individuals with AF have a first-degree relative affected by the condition<sup>8</sup>.

Accordingly, genome-wide association studies (GWAS) have successfully established a multitude of genetic loci with common variants predisposing to AF<sup>9–12</sup> and subsequent polygenic risk scores (PRS) have identified individuals in the general population who are at high risk of developing the disease<sup>13–15</sup>. The SNP-heritability for AF has been estimated to be as high as 22%<sup>2</sup>, and previously reported common variants from GWAS<sup>3</sup> explained 5.3% of AF variability<sup>2</sup>. In contrast, family-based analyses have identified many ‘monogenic’ variants, located mainly in ion-channels<sup>16</sup>, yet replication for many of these genes is lacking<sup>11, 17</sup>. We previously demonstrated in a large case-control study that rare loss-of-function variants in the structural sarcomeric gene *TTN* are associated with a strongly increased risk of early-onset AF<sup>18</sup>. Despite this observation, the major monogenic contributors to AF risk in the general population remain unclear. Moreover, the relationship between polygenic and monogenic variation to AF susceptibility remains unexplored.

To address these knowledge gaps, we leveraged data from a national biorepository, the UK Biobank. We used a subset of over 40,000 individuals with genome-wide genotyping and whole-exome sequencing (WES)<sup>19, 20</sup> to comprehensively assess the respective contributions of common and rare genetic variation to AF risk.

## METHODS

### Data availability.

Whole exome-sequencing and phenotype data used in this study are available through UK Biobank ([www.ukbiobank.ac.uk](http://www.ukbiobank.ac.uk)). Summary level results have been made publicly available at the Cardiovascular Disease Initiative Knowledge Portal and can be accessed at [www.broadcvgdi.org](http://www.broadcvgdi.org) upon publication.

### Study population and phenotypes.

The UK Biobank is a large population-based prospective cohort study from the United Kingdom with deep phenotypic and genetic data on approximately 500,000 individuals aged 40–69<sup>19</sup>. Phenotypes, including the primary outcome AF, were defined using reports from medical history interviews, ICD-9 and –10 codes, operation codes and death registry records (Online Table I). The UK Biobank resource was approved by the UK Biobank Research Ethics Committee and all participants provided written informed consent to participate. Use of UK Biobank data was performed under application number 17488 and was approved by the local Massachusetts General Hospital institutional review board.

### Genotyping, quality control, and variant annotation.

Whole exome sequencing has previously been performed on 50,000 participants from the UK Biobank<sup>20</sup>. The revised version of the IDT xGen Exome Research Panel v1.0 was used to capture exomes with over 20X coverage at 94.6% of sites<sup>20</sup>. In the present study, samples were restricted to those of white-European ancestry who also had high-quality genotyping array data available<sup>21, 22</sup> (Online Data Supplement). Additional filters were applied to study samples and exome sequence variants: sample call rate (<90%), genotype call rate (<90%) and Hardy-Weinberg equilibrium test (P-value <  $1 \times 10^{-15}$ ). Of the 50,000 individuals in the UK Biobank with WES, 40 were removed during initial quality-control, after which we excluded 51 samples who did not have genotyping chip data and 170 samples that failed our additional quality control procedures (Online Data Supplement). Among the remaining 49,739 participants, 43,139 white-European individuals were identified.

The protein consequences of variants were explored using the LOFTEE plug-in implemented in the Variant Effect Predictor<sup>23</sup> (<https://github.com/konradjk/loftee>, Online Data Supplement). The most severe predicted consequences for canonical gene transcripts were ascertained for each variant and used for the primary analysis. All variants in significantly associated genes were re-annotated using LOFTEE to identify additional high-confidence loss-of-function (LOF) variants in other transcripts.

### Single variant association analyses.

An exome-wide single variant association analysis for AF was performed using AF cases and controls of white-European ancestry. Variants with minor allele frequency (MAF)  $\geq 1\%$  were tested for association with AF assuming an additive genetic model. To correct for the relatedness among participants and the imbalanced case-control ratio, we used a logistic mixed-effects model implemented in SAIGE (<https://github.com/weizhouUMICH/SAIGE>)<sup>24</sup>. Age, sex, and the first 4 principal components of ancestry were used as fixed effects. The genetic relatedness matrix was estimated using independent high-quality variants from the genotyping array (N = 93,491, Online Data Supplement). The exome-wide significance threshold was set to  $\alpha = 3.1 \times 10^{-7}$  (0.05/162,514, Bonferroni correction).

### Polygenic risk score estimation.

We closely followed a previously published approach to derive and validate an AF PRS<sup>13</sup> as shown in Online Figure I. In short, effect estimates for common variants from a large AF GWAS meta-analysis<sup>11</sup> were adjusted to account for linkage-disequilibrium using LDpred (<https://github.com/bvilhjal/ldpred>)<sup>25</sup>. Multiple PRSs were constructed using high quality imputed variants (Online Data Supplement) based on 7 different values of  $\rho$  (the assumed fraction of variants with nonzero effects) and were applied to the UK Biobank. In this study, we used the LDpred-adjusted effect estimates for each value of  $\rho$  and identified the best performing PRS in a validation cohort of unrelated white-European individuals distinct from the exome sequencing cohort (N = 322,161, Online Data Supplement). The performance of PRS was assessed by the area under the receiver operating characteristic curve (AUC). AUC and confidence intervals were calculated using R-package 'pROC' version 1.12.1<sup>26</sup>. The best performing PRS was subsequently applied to the imputed genotypes from the exome-sequencing cohort. Effect-estimates and respective confidence intervals by profile likelihood

were calculated using Firth's bias-reduced logistic regression, implemented in R-package 'logistf' version 1.23 (<https://rdrr.io/cran/EHR/man/Logistf.html>)<sup>27, 28</sup>.

### Rare variant burden analyses.

Rare variants (MAF  $\leq 1\%$ ) that were predicted to be LOF were associated with AF in the exome sequencing cohort using a gene-based burden analysis. LOF variants were collapsed into a single variable (carrier vs. non-carrier) by sample, for each gene. Genes with  $\geq 10$  LOF variant carriers were analyzed using SAIGE as described, for the single variant analysis above. The exome-wide significance threshold was determined to be  $5.04 \times 10^{-6}$  by using a Bonferroni correction of  $0.05 / 9,909$  genes. Odds ratios (OR) and confidence intervals were estimated using Firth's regression in an unrelated (relatedness estimated to be 3rd degree or closer was removed) subset of the cohort (N = 41,335). Additionally, sensitivity analyses were performed adjusting for the AF PRS.

Upon identifying a significant association between AF and LOF variants in *TTN* (Results), we analyzed LOF variants located in exons that are highly expressed (percentage splicing index  $\geq 90\%$ ) in left ventricular tissue<sup>29</sup>, denoted as *TTN*<sub>LOF</sub> variants. From then on, all individuals with a diagnosis of heart failure concurrent or prior to diagnosis of AF were removed for AF analyses, as heart failure is strongly associated with both *TTN*<sub>LOF</sub> variants and atrial arrhythmias<sup>30, 31</sup>. We further compared the prevalence of *TTN*<sub>LOF</sub> variants among individuals with AF, heart failure, and nonischemic cardiomyopathy and calculated the penetrance of *TTN*<sub>LOF</sub> variants for those diseases in the unrelated population.

### Association analyses between *TTN*<sub>LOF</sub> and multiple traits.

To identify novel phenotypic associations with *TTN*<sub>LOF</sub> variants and to confirm known associations<sup>30, 31</sup>, we then performed association analyses using a curated set of disease phenotypes and continuous cardiometabolic traits. Association tests were performed for LOF variants in *TTN*, using a list of curated disease phenotypes and continuous cardiometabolic traits (N = 58, Online Table I). Disease phenotypes with  $< 50$  cases or a prevalence of LOF variant carriers  $\leq 0.5\%$  were excluded to avoid spurious associations. Association tests on remaining diseases (N = 31) were carried out using the same logistic mixed-effects models implemented in the rare variant analyses. Age, sex, and first 4 principal components of ancestry were implemented as fixed effects. Effect estimates and confidence intervals were estimated using Firth's logistic regression in the unrelated subset. In addition, quantitative traits of BMI, blood pressure, and electrocardiogram measurements (Online Table II) were inverse normalized using the "*—invNormalize*" flag implemented in SAIGE and then associated with LOF variants in *TTN* using a linear mixed-effects model adjusting for the same covariates. For PR interval, P wave duration, and QRS complex, we additionally adjusted for the RR-interval. A P-value of  $6.41 \times 10^{-4}$  ( $0.05 / (39 \times 2)$  traits; Bonferroni correction) was considered significant. For significantly associated diseases, a sensitivity analysis was performed where individuals with AF prior to the diagnosis were removed.

### Monogenic and polygenic risk.

Within the entire unrelated population (N = 41,212), AF prevalence conferred by high polygenic risk was calculated by comparing increasingly extreme tails of the PRS distribution. Odds ratios conferred by high polygenic risk were estimated by comparing these tails to the remainder of the population, using Firth's logistic regression adjusting for age, sex, and the first 4 principal components of ancestry. We further identified what increment of PRS in standard deviations (SD) was predicted to be equivalent to the risk conferred by *TTN*<sub>LOF</sub> variants. This was based on the assumed linear relationship between the PRS and the log of odds for AF in logistic regression. We then assessed the effect of PRS on AF penetrance among *TTN*<sub>LOF</sub> variant carriers. This was done by testing the association between PRS and AF within carriers only, using Firth's logistic regression adjusted for age, sex, and the first 4 principal components of ancestry. Finally, the variance in AF susceptibility explained by both *TTN*<sub>LOF</sub> variants and AF PRS were calculated. This was done by calculating the improvement in R<sup>2</sup> on the liability scale, upon adding either predictor to Firth's regression models which included age, sex and the first 4 principal components of ancestry as covariates. The prevalence of AF (3.3%) was determined in the exome sequencing samples.

## RESULTS

### Baseline characteristics.

After sample level quality controls, 1,546 AF patients were identified with a mean age at AF onset of 62.6 years and 33.7% of AF cases were female (Table 1). The remaining 41,593 participants were considered controls. A total of 8.7 million distinct genetic variants were available from the exome sequencing data.

### Polygenic risk scores are strongly associated with AF risk.

Among 7 candidate PRSs, we found that the PRS derived with  $\rho = 0.003$  was the best predictor of AF in the validation cohort (AUC 0.613; 95% CI 0.608–0.618) (Online Table III). In the exome sequencing cohort, the PRS performed slightly better (AUC 0.636, 95% CI 0.622–0.650) than in the validation cohort. The OR for AF per SD increment of PRS was 1.63 (95% CI 1.55–1.71, P-value  $<1 \times 10^{-15}$ ). Individuals in the top decile of the PRS were at 2.53-fold increased odds of AF compared to the remainder of the population (95% CI 2.21–2.89, P-value  $<1 \times 10^{-15}$ , Online Table IV).

### Mutations in *TTN* are associated with AF in the general population.

Associations between AF and 162,514 variants with MAF  $\geq 1\%$  were assessed using a logistic mixed-effects model accounting for age, sex, population structure, and sample relatedness. There were no single exonic variants that reached exome-wide significance in the present analysis.

Next, we sought to determine if there were any genes with a burden of LOF mutations that were associated with AF. Among 18,350 protein-coding canonical gene transcripts, 9,099 had  $\geq 10$  LOF variant carriers and were tested for the association with AF. We found that LOF variants in *TTN* (N = 259 variants) were significantly associated with AF (OR 2.71,

95% CI 1.97–3.66, P-value =  $2.50 \times 10^{-8}$ , N = 554 carriers, Online Table V). When we performed a sensitivity analysis adjusting for AF PRS (Figure 1A, Online Figure II), the significant association between LOF variants in *TTN* and AF remained similar (OR 2.70, 95% CI 1.95–3.66, P-value =  $3.12 \times 10^{-8}$ , Online Table V). The prevalence of LOF variants in *TTN* among AF cases was 3.2% (N = 49 carriers) vs 1.2% (N = 505 carriers) among controls.

We did not observe a significant association between AF and rare variation in 37 genes previously reported as candidate genes for monogenic forms of AF (Online Table VI, Online Figure III).<sup>7</sup> Similarly, we tested for an association between LOF variation and the genes at recently described GWAS loci for AF<sup>10</sup>. At the 94 AF GWAS loci, there were 421 of 1,181 genes that had a sufficient number of loss of function variants to test for an association with AF. Of these 421 genes, only *TTN* was significantly associated with AF (Online Table VII). Furthermore, LOF variants in *TTN* were more common than LOF variants in other genes implicated in monogenic forms of cardiovascular disease, such as *LDLR*, *MYBPC3*, *SCN5A*, and *KCNQ1* (Online Table VIII).

### **LOF variants in cardiac exons of *TTN* are strongly associated with AF.**

We then performed a series of post-hoc analyses focused on the association between *TTN* and AF. First, we identified 20 additional LOF variants in non-canonical sequences, which in aggregate with canonical transcript variants were still significantly associated with AF (OR 2.66, 95% CI 1.94–3.56, P-value =  $2.80 \times 10^{-8}$ , N = 591 carriers, Online Tables IX–X). Second, we restricted our analysis to LOF variants in exons highly expressed in cardiac tissue<sup>29</sup> (*TTN*<sub>LOF</sub>), which left 198 carriers with 178 distinct LOF variants. Using these variants, the association with AF substantially strengthened (OR 6.15, 95% CI 4.07–9.06, P-value =  $3.26 \times 10^{-14}$ , N = 198 carriers, Online Table X) whereas LOF variants in other exons were not associated with AF (OR 1.26, 95% CI 0.74–2.00, P-value = 0.58, N = 395, Online Table X). Third, there is a well-described relationship between LOF variants in *TTN* and dilated cardiomyopathy<sup>30, 31</sup>. Because of this, we excluded AF cases with heart failure concurrent or prior to AF diagnosis. Even after removal of 132 of such cases, the association between *TTN*<sub>LOF</sub> variants and AF persisted at exome-wide significance (OR 5.35, 95% CI 3.39–8.13, P-value =  $1.12 \times 10^{-10}$ , Figure 1B, Online Table XI). The prevalence of *TTN*<sub>LOF</sub> variants among these AF cases was 1.9% (N = 27 carriers) vs 0.4% (N = 164 carriers) among controls.

### ***TTN*<sub>LOF</sub> variants are more penetrant for AF than for heart failure.**

Next, we investigated the frequency and phenotypic presentation of *TTN*<sub>LOF</sub> variants with respect to both AF and heart failure phenotypes in unrelated participants. Of the phenotypes, *TTN*<sub>LOF</sub> variants were most common among individuals with nonischemic cardiomyopathy (5.4% of cases; N = 7 carriers, Figure 2A). In contrast, *TTN*<sub>LOF</sub> variants were more penetrant for AF than for heart failure: 14.4% (N = 26 carriers) of carriers had AF while only 7.4% (N = 14 carriers) had heart failure (Figure 2B).

### Multiple trait analysis confirms known associations between *TTN*<sub>LOF</sub> and cardiovascular traits.

We then performed association tests for *TTN*<sub>LOF</sub> variants using a curated set of 31 disease phenotypes and continuous cardiometabolic traits. We found that nonischemic cardiomyopathy, heart failure, supraventricular arrhythmia, mitral valve disease, and the RR interval were significantly associated with *TTN*<sub>LOF</sub> variants ( $P < 6.41 \times 10^{-4}$ , Online Figure IV, Online Table XII). After removal of participants who had AF prior to the diagnosis of disease, *TTN*<sub>LOF</sub> variants remained significantly associated with nonischemic cardiomyopathy (OR 21.61, 95% CI 8.56–46.02,  $P = 7.9 \times 10^{-7}$ , Online Figure V).

### *TTN*<sub>LOF</sub> variants are substantially penetrant for AF while PRS explains more genetic susceptibility.

We then sought to determine the relative contribution of both PRS and *TTN*<sub>LOF</sub> variants to the overall risk of AF. We began by comparing the AF prevalence conferred by high PRS to the prevalence conferred by *TTN*<sub>LOF</sub> variants. In our study population, 0.44% of individuals carried *TTN*<sub>LOF</sub> variants, of whom 14% had AF (Figure 3). In contrast, among individuals in the highest 0.44% of the AF PRS, only 9.3% had AF (Figures 3–4, Online Table IV). Only individuals in the highest 0.10% of the PRS had an AF prevalence comparable to the prevalence observed among *TTN*<sub>LOF</sub> variant carriers (Figure 3, Online Table IV). *TTN*<sub>LOF</sub> variants were predicted to confer a risk equivalent to a 3.39 SD increment of PRS. Only 0.10% of the cohort had a polygenic score of 3.39 SD from the mean or higher (Online Figure VI). In contrast, *TTN*<sub>LOF</sub> variants explained only 0.2% of the variance in AF susceptibility in the study population, and inclusion of LOF variants from additional 13 testable AF genes explained only 0.4% of the variance in AF risk. The AF PRS, on the other hand, explained 4.7% of the variance in AF susceptibility (Online Table XIII).

### PRS associates with AF penetrance among *TTN*<sub>LOF</sub> carriers.

Finally, we investigated whether AF polygenic risk affects the penetrance of *TTN*<sub>LOF</sub> variants. The overall prevalence of AF among *TTN*<sub>LOF</sub> variants was 14.4% compared to 3.2% among non-carriers (Figures 3–4; Online Figure VI). Within the 181 carriers of *TTN*<sub>LOF</sub> variants, the PRS significantly associated with AF (OR per SD 1.79, 95% CI 1.17–2.85,  $P$ -value = 0.007). The observed prevalence of AF among *TTN*<sub>LOF</sub> variant carriers in the highest tertile of polygenic risk was 21.5% compared to 6.7% in the lowest tertile (Figure 5).

## DISCUSSION

The availability of both genotyping array and exome sequencing data in over 43,000 individuals from the UK Biobank provided a unique opportunity to explore the contributions of common and rare genetic variation to AF. In the current work, we had four primary observations. First, we found that *TTN* is the most frequently implicated gene for AF in the general population in terms of LOF variation. Second, LOF variants in the cardiac exons<sup>29</sup> of *TTN* are strongly associated with AF, regardless of a prior history of heart failure. Third, despite the substantial AF penetrance conferred by *TTN* mutations, the polygenic risk for AF explains a larger proportion of genetic susceptibility in the general population. Finally,



the polygenic risk of AF markedly alters the disease penetrance among *TTN* mutation carriers.

In an exome wide analysis of the population-based UK Biobank, we identified mutations in a single gene, *TTN*, that were significantly related to AF. The *TTN* gene encodes a very large sarcomeric protein, titin, that is crucial for sarcomere assembly, cardiac muscle contraction, and elasticity<sup>32</sup>. Truncating variants in *TTN* are a well-known cause of dilated cardiomyopathy<sup>30</sup> and have also been identified in other cardiac and skeletal muscle myopathies. Recently, we and others found a significant association between *TTN* truncating variants in selected individuals with familial AF<sup>33</sup> and early-onset AF<sup>18</sup>. Given that AF is a risk factor for heart failure<sup>34</sup>, and heart failure is also a risk factor for AF<sup>35</sup>, it will be interesting to explore the temporal relationship between each of these diseases among *TTN*<sub>LOF</sub> mutation carriers. In the current work, we establish a significant association between *TTN*<sub>LOF</sub> variants and AF even after removal of any individuals with heart failure prior to the onset of AF (OR 5.35, 95% CI 3.39–8.13, P-value =  $1.12 \times 10^{-10}$ ). Notably, we also find that *TTN*<sub>LOF</sub> variants are more penetrant for AF than for heart failure in the UK Biobank; while the relative risk of heart failure conferred by *TTN*<sub>LOF</sub> variants is higher than the relative risk of AF, the absolute risk of AF is higher among carriers. In future years as exome sequencing data and MRI imaging data become available on more UK Biobank participants, further delineation of the long-term outcomes in *TTN*<sub>LOF</sub> mutation carriers will be possible.

*TTN* is the largest gene in the human genome. As such, more LOF variants are expected to exist in the population for *TTN* compared to most other genes. Indeed, *TTN*<sub>LOF</sub> variants are 5–10 times more common than mutations in other smaller, well-known cardiovascular disease susceptibility genes. For example, LOF mutations in *LDLR* underlying familial hyperlipidemia occur in only 0.028% individuals in the current dataset. Similarly, LOF mutations in *MYBPC3* (hypertrophic cardiomyopathy), *KCNQ1* (long-QT syndrome), and *SCN5A* (Brugada syndrome; conduction disorders) are observed in only 0.044%, 0.046%, and 0.065% of individuals, respectively. In contrast, *TTN*<sub>LOF</sub> mutations are relatively common, as we find that 0.44% of individuals harbor a *TTN*<sub>LOF</sub> variant.

Our findings also highlight the robust contribution of polygenic risk to AF susceptibility and the complimentary nature of polygenic risk and rare variation. AF polygenic risk explains a considerably larger proportion of AF susceptibility in the general population (4.7% of variance) compared to *TTN*<sub>LOF</sub> mutations. Though polygenic risk accounts for a greater proportion of AF risk, by nature it has a lower average degree of penetrance. In fact, only 0.10% of the population has a polygenic score conferring an equivalent AF prevalence to that observed among *TTN*<sub>LOF</sub> variant carriers. We also find that AF polygenic risk results in a striking difference in the prevalence of AF among *TTN*<sub>LOF</sub> variant carriers (OR per SD 1.79). For example, *TTN*<sub>LOF</sub> variant carriers in the lowest tertile of AF PRS have an AF prevalence of only 6.7% compared to 21.5% in the highest tertile. Thus, polygenic risk results in an additive risk that further increases the likelihood of AF in *TTN*<sub>LOF</sub> mutation carriers.

With the observation that *TTN* mutations are associated with AF in families, early-onset cases, and now in a population-based biobank, a number of potential further lines of investigation can be considered. In the future, it will be interesting to determine whether the identification of a *TTN*<sub>LOF</sub> mutation in an individual with AF could alter clinical management. For example, one could consider cardiac magnetic resonance imaging to identify subtle structural abnormalities or screening of at-risk relatives. It will also be interesting to determine if *TTN*<sub>LOF</sub> variant carriers with AF may benefit from treatment with neurohormonal therapy or may respond differently to standard AF treatments such as antiarrhythmic medications or catheter ablation.

To date, mutations in more than 35 genes including ion channels, gap junction proteins, and transcription factors have been identified in individuals and families with AF; however, we were not able to replicate an association between LOF variants in these genes and AF in our analyses. We also performed gene-based testing accounting for functional classes, but did not observe any significant associations between these genes and AF risk (Online Table XIV). However, since many of these genes had few LOF variants, the power to establish an association between these genes and AF was limited. Furthermore, our analyses did not consider other forms of genetic variation. It is possible that nonsynonymous variation in some of these previously reported genes may contribute to AF risk. For example, the gain-of-function nonsynonymous variants previously described in *KCNQ1*<sup>36, 37</sup> would not have been identified in our current approach. Similarly, there have been over 100 GWAS loci reported for AF, yet we did not identify an association between LOF variants in any gene at a GWAS locus other than *TTN*. Since GWAS loci are typically associated with non-coding variants with small effects, it is possible that LOF variants in nearby genes are only rarely associated with AF. Finally, despite inclusion of over 1,500 AF cases, our power remains modest and future studies with significantly larger sample sizes will be informative. For example, a recent analysis of exome sequencing data for diabetes with over 20,000 cases identified multiple genes implicated in the disease<sup>38</sup>.

Our study has several other potential limitations. First, we focused on a relatively homogeneous middle aged, white-European population. As such, our findings may not be applicable to other age strata, races or ethnicities. Second, disease status in the UK Biobank relies on self-reports, ICD codes, operation codes, and death registry codes. As a consequence, some misclassification is possible. However, we recently used the same phenotypic definitions in GWAS for AF and heart failure and replicated well-described genetic loci<sup>6, 10, 39</sup>. In addition, well-known associations between *TTN*<sub>LOF</sub> and nonischemic cardiomyopathy were replicated in a PheWAS in the present study. Misclassification of these diseases may therefore be limited. Third, there is the potential for ascertainment bias among participants in the UK Biobank, making it unlikely that the study perfectly reflects the overall UK population. The participants in the UK Biobank are known to be healthier than the overall British population, and individuals with an overt cardiomyopathy due to a *TTN*<sub>LOF</sub> mutation may be less likely to participate in this longitudinal study. It is reassuring, however, that we found a similar frequency of *TTN*<sub>LOF</sub> variants in the UK Biobank (0.44%) compared to prior reports of 0.5% among controls<sup>33</sup> and the general population<sup>40</sup>.

In conclusion, both polygenic and monogenic factors contribute to AF risk in the general population. While monogenic  $TTN_{LOF}$  variants confer a substantial AF penetrance, polygenic risk explains a larger proportion of genetic susceptibility to AF.

## Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

## SOURCES OF FUNDING

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### DISCLOSURES

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## Nonstandard Abbreviations and Acronyms:

<b>AF</b>	Atrial fibrillation
<b>GWAS</b>	Genome-wide association studies
<b>PRS</b>	Polygenic risk scores
<b>WES</b>	Whole-exome sequencing
<b>MAF</b>	Minor allele frequency
<b>AUC</b>	Area under the receiver-operating-characteristics curve
<b>LOF</b>	High-confidence loss-of-function
<b><math>TTN_{LOF}</math></b>	Loss-of-function variants located in $TTN$ exons highly expressed in cardiac tissue
<b>OR</b>	Odds ratio
<b>SD</b>	Standard deviation

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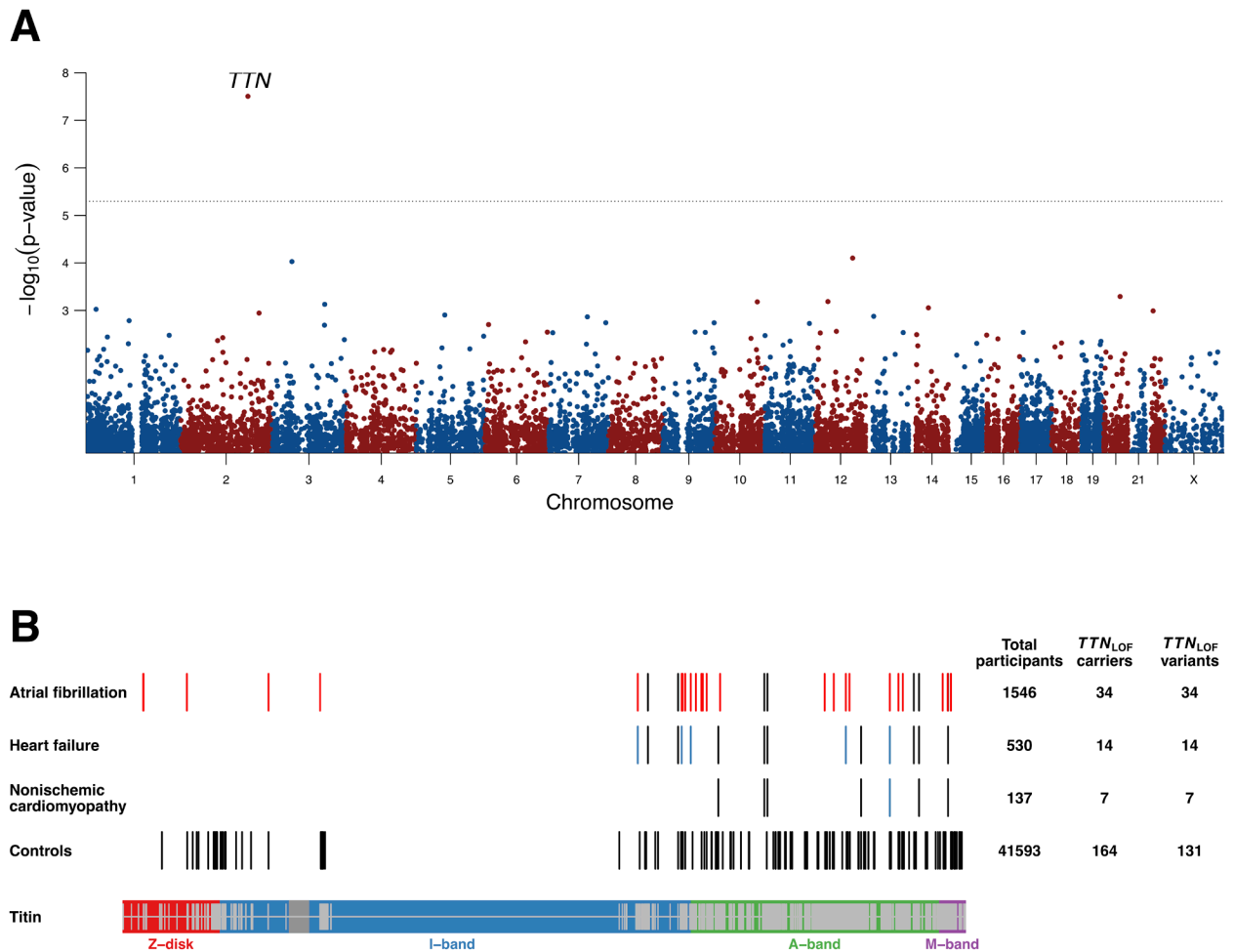
## NOVELTY AND SIGNIFICANCE

### What Is Known?

- Over 100 distinct genetic loci have been identified for atrial fibrillation (AF).
- Rare loss-of-function mutations in *TTN* have been associated with early-onset AF.
- The contribution of rare and common genetic variation to AF risk in the general population is not clear.

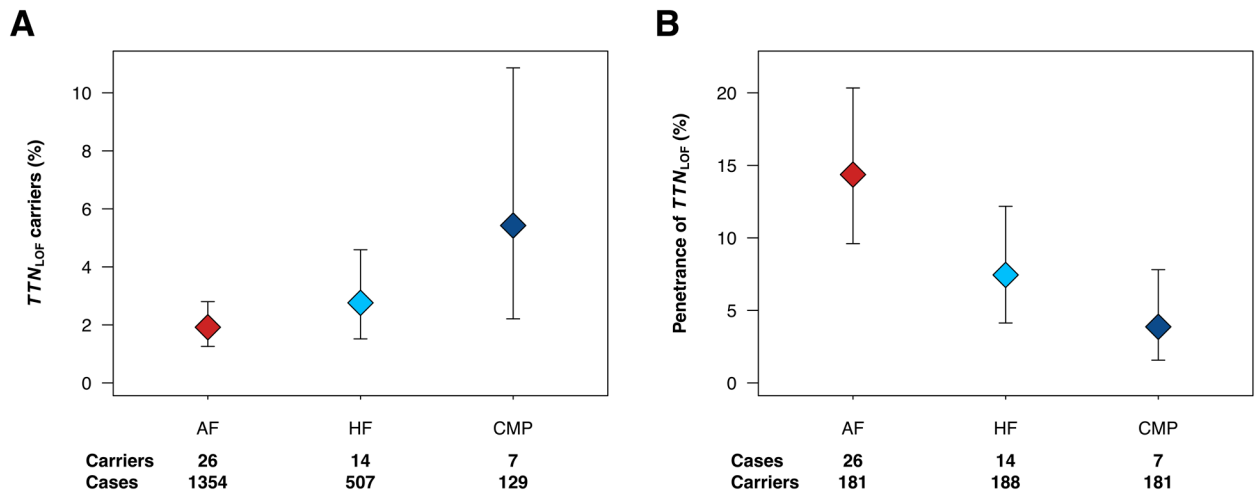
### What New Information Does this Article Contribute?

- Loss-of-function (LOF) mutations in *TTN* are significantly associated with AF in a large population-based study.
- *TTN* mutations associated with AF are rare but have a high penetrance of approximately 14%.
- A much larger proportion AF risk in the population is explained by the additive effect of many common variants than by loss-of-function mutations in *TTN*.



**Figure 1. High-confidence loss-of-function variants in *TTN* among atrial fibrillation cases and controls in UK Biobank.**

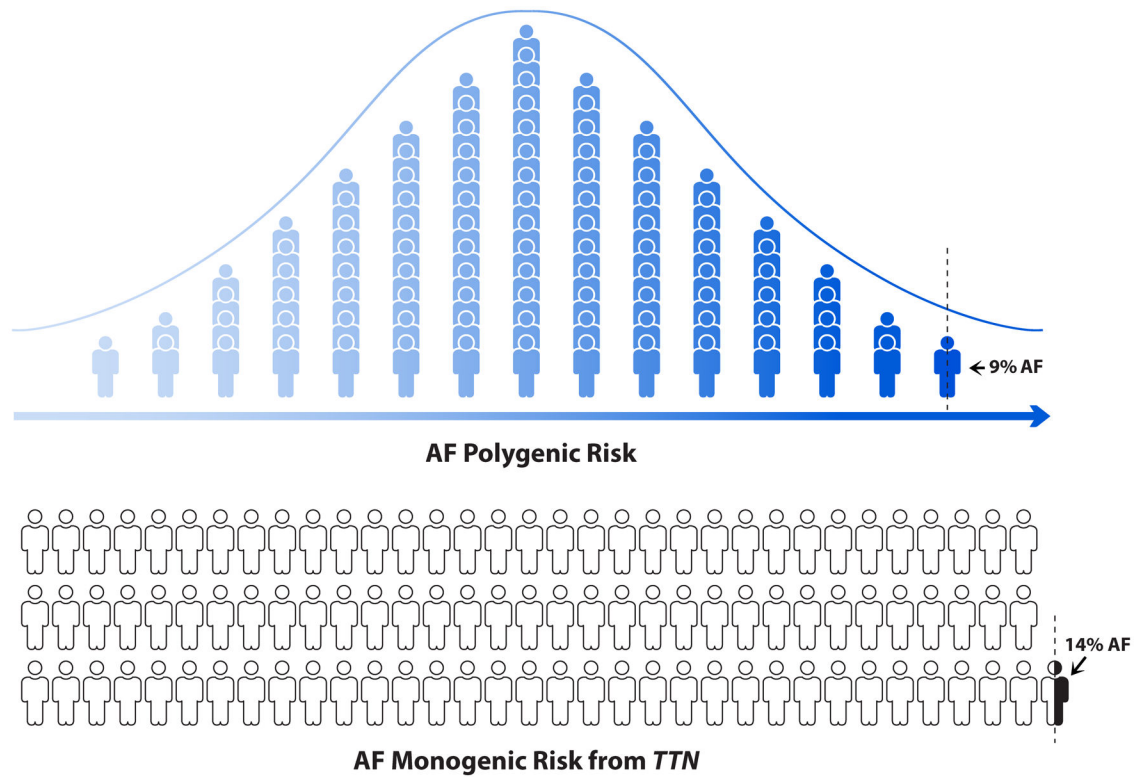
Figure 1A is a Manhattan plot of the gene-based burden analysis for predicted high-confidence loss-of-function (LOF) variants and atrial fibrillation. Grey dotted line represents the exome-wide significance level. Results are based on LOF variants in canonical transcripts only, and are adjusted for sex, age, polygenic risk score and the first four principal components of ancestry. LOF variants in *TTN* are associated with AF. Figure 1(B) shows the locations of LOF variants in titin (protein encoded by *TTN*) found in heart failure, non-ischemic cardiomyopathy and atrial fibrillation patients, as well as in controls. Shown variants are restricted to those found in exons highly expressed in cardiac tissue. Red bars (N = 27) in atrial fibrillation cases are LOF variants found among patients who did not have heart failure prior to atrial fibrillation. Blue bars from the second and third rows represent LOF variants identified from patients who had atrial fibrillation prior to heart failure or non-ischemic cardiomyopathy. The bottom of the Figure 1B illustrates different bands of *TTN*. The *TTN* exons highly expressed in heart tissue are shown on the inside of the band in grey.



**Figure 2. Prevalence and penetrance of  $TTN_{LOF}$  variants with respect to atrial fibrillation and heart failure.**

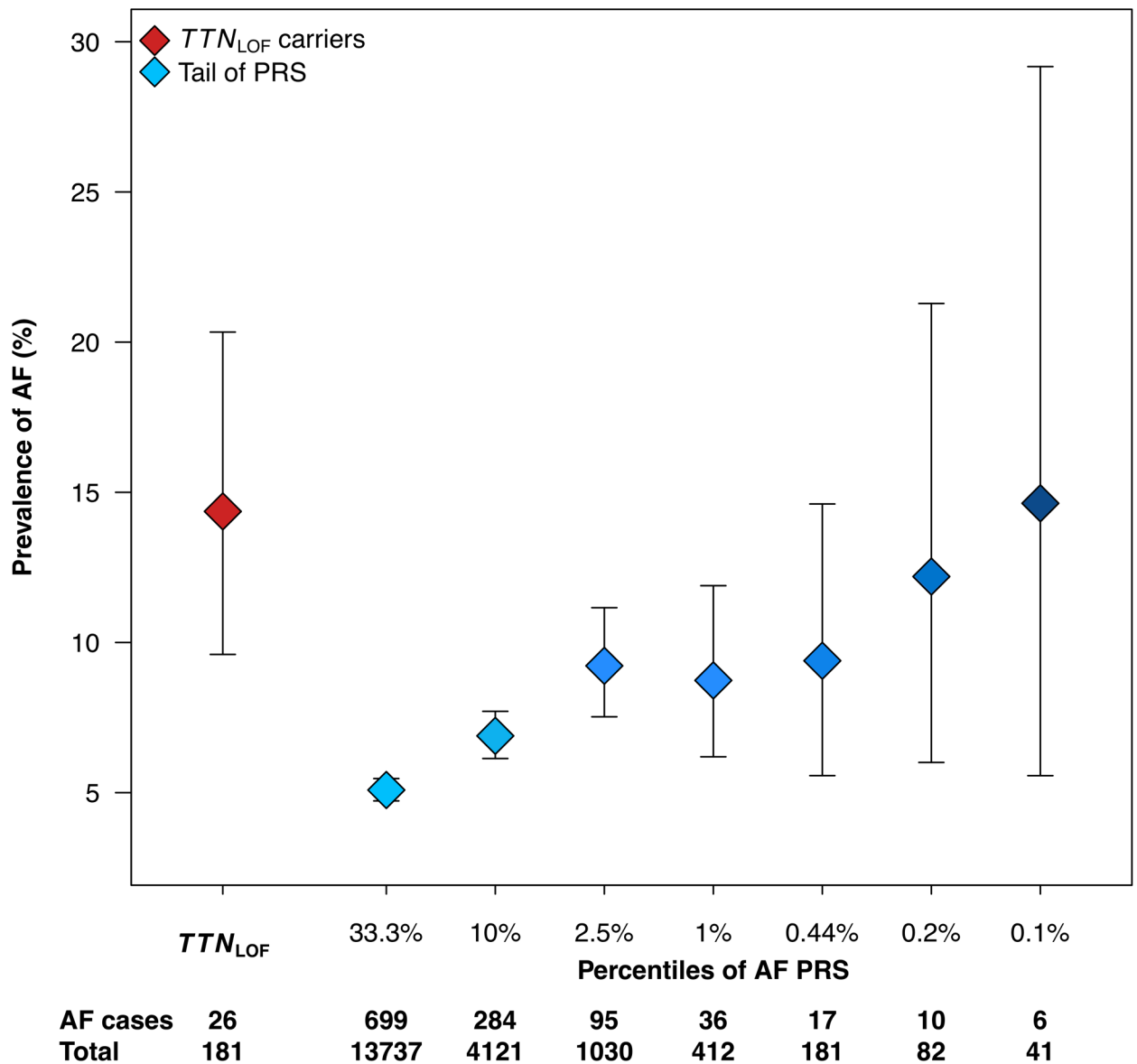
Figure 2A exhibits the proportion of carriers with high confidence loss-of-function variants in cardiac  $TTN$  ( $TTN_{LOF}$ ) and 95% confidence intervals among unrelated atrial fibrillation (AF), heart failure (HF), and nonischemic cardiomyopathy (CMP) cases. Figure 2B shows the penetrance of  $TTN_{LOF}$  variants for AF, HF, and CMP. Of the three diseases,  $TTN_{LOF}$  variants are most frequent among individuals with non-ischemic cardiomyopathy. All values are calculated from an unrelated subset of the exome sequencing cohort ( $N = 41,212$ ). AF cases with HF prior to AF are excluded.





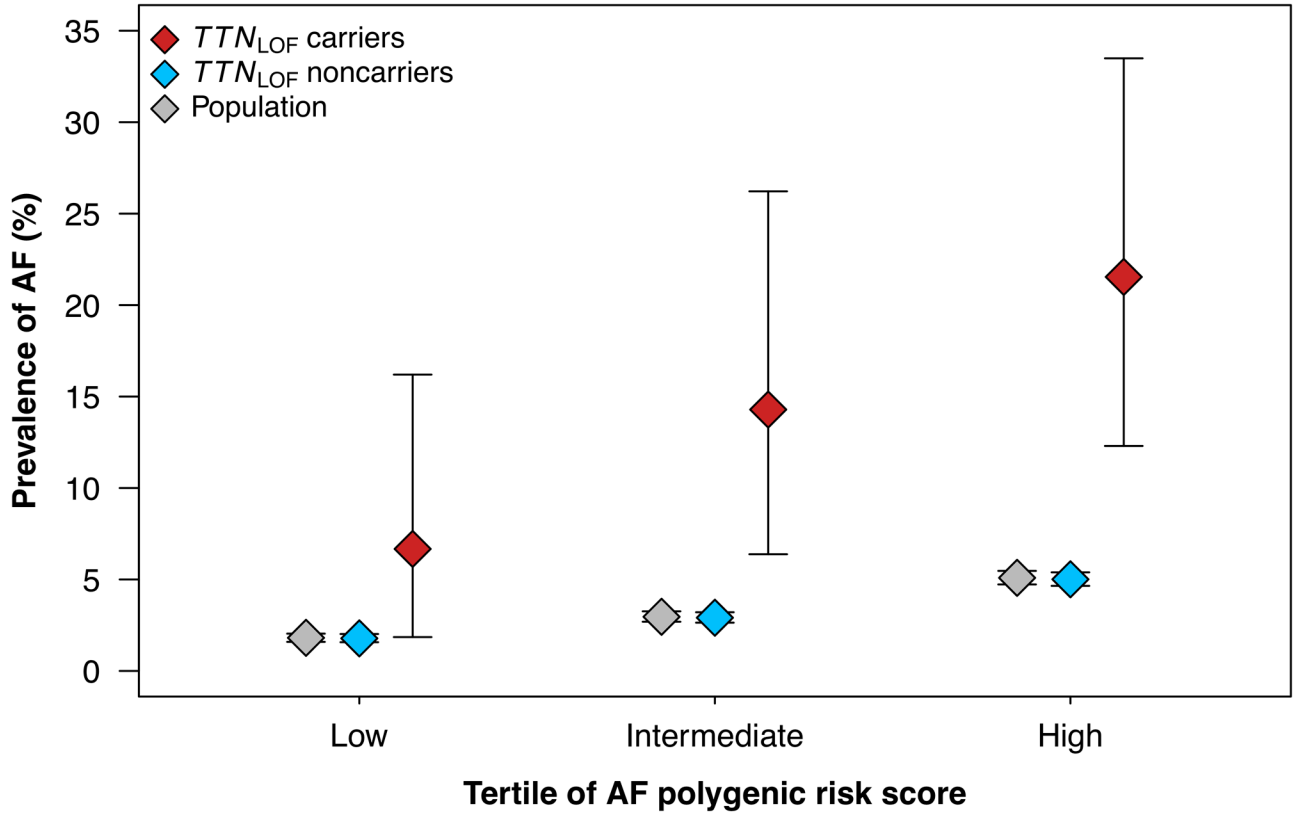
**Figure 3. Prevalence of atrial fibrillation conferred by loss-of-function variants in cardiac *TTN* compared to polygenic risk in the UK Biobank.**

The first figure illustrates the distribution of AF polygenic risk score in the UK Biobank. Each human icon represents 1% of the population and a dotted vertical line exhibits highest 0.44% of AF polygenic risk group. Among this 0.44% group, 9.3% individual had atrial fibrillation. The bottom figure illustrates the carriers with high confidence loss-of-function variants in cardiac *TTN* ( $TTN_{LOF}$ ). As shown in the last human icon, 0.44% participants of the UK Biobank carried  $TTN_{LOF}$  variants and among those, 14.3% had atrial fibrillation.



**Figure 4. Prevalence of atrial fibrillation conferred by loss-of-function variants in cardiac  $TTN$  compared to polygenic risk in the UK Biobank.**

Figure 4 shows the prevalence of atrial fibrillation (AF) conferred by loss-of-function variants in cardiac  $TTN$  ( $TTN_{LOF}$ ) and the prevalence conferred by high AF polygenic risk scores (PRS) in an unrelated subset of the exome sequencing cohort where cases of AF with heart failure prior to AF are excluded ( $N = 41,212$ ). Increasingly extreme tails of the PRS distribution are shown in blue.  $TTN_{LOF}$  variant carriers are shown in red. Approximately 0.44% of the population carried  $TTN_{LOF}$  variants, of which 14% had AF. Meanwhile, only 9.3% of individuals in the top 0.44% of AF PRS had AF.



**Figure 5. Prevalence of atrial fibrillation stratified by monogenic and polygenic risk in the UK Biobank.**

Figure 5 shows the prevalence of atrial fibrillation (AF), stratified by polygenic and monogenic risk in the unrelated subset of the exome sequencing cohort (N = 41,212). In the population, AF prevalence increased with increasing AF polygenic risk score (PRS) and was considerably higher in carriers of loss-of-function variants in cardiac *TTN* (*TTN*<sub>LOF</sub>) which are shown in red. Among *TTN*<sub>LOF</sub> carriers, AF PRS associated with AF penetrance: Carriers in the lowest tertile of PRS had an AF prevalence of 6.7% compared to 21.5% in the highest tertile.

**Table 1.**

Characteristics of controls, atrial fibrillation cases, and atrial fibrillation cases with LOF carriers

	Controls	AF* cases	AF cases carrying $TTN_{LOF}^{\dagger}$ variants
<b>Participants, N<sup>§</sup></b>	41,593	1,546	34
<b>Female, N (%)</b>	22,825 (54.88)	521 (33.7)	14 (41.18)
<b>Age at baseline, Mean (SD)<sup>//</sup></b>	57.2 (7.9)	62.7 (6)	62.3 (6)
<b>Age at onset, Mean (SD)</b>	-	62.6 (7.3)	62.6 (7.6)
<b>Hypertension, N (%)</b>	13,198 (31.73)	987 (63.84)	17 (50)
<b>Heart Failure, N (%)</b>	293 (0.7)	237 (15.4)	12 (35.29)
<b>Myocardial Infarction, N (%)</b>	1,096 (2.64)	198 (12.81)	4 (11.76)
<b>Diabetes, N (%)</b>	2,630 (6.32)	229 (14.81)	11 (32.35)

\* AF: atrial fibrillation,

<sup>†</sup>  $TTN_{LOF}$ : predicted to be high-confidence loss-of-function variant in  $TTN$  exons highly expressed in cardiac tissues,<sup>§</sup> N: the number of samples,<sup>//</sup> SD: standard deviation.