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Identification of Functional Variant Enhancers Associated With Atrial Fibrillation

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RATIONALE: Genome-wide association studies have identified a large number of common variants (single-nucleotide polymorphisms) associated with atrial fibrillation (AF). These variants are located mainly in noncoding regions of the genome and likely include variants that modulate the function of transcriptional regulatory elements (REs) such as enhancers. However, the actual REs modulated by variants and the target genes of such REs remain to be identified. Thus, the biological mechanisms by which genetic variation promotes AF has thus far remained largely unexplored.

OBJECTIVE: To identify REs in genome-wide association study loci that are influenced by AF-associated variants.

METHODS AND RESULTS: We screened 2.45 Mbp of human genomic DNA containing 12 strongly AF-associated loci for RE activity using self-transcribing active regulatory region sequencing and a recently generated monoclonal line of conditionally immortalized rat atrial myocytes. We identified 444 potential REs, 55 of which contain AF-associated variants ($P < 10^{-8}$). Subsequently, using an adaptation of the self-transcribing active regulatory region sequencing approach, we identified 24 variant REs with allele-specific regulatory activity. By mining available chromatin conformation data, the possible target genes of these REs were mapped. To define the physiological function and target genes of such REs, we deleted the orthologue of an RE containing noncoding variants in the *Hcn4* (potassium/sodium hyperpolarization-activated cyclic nucleotide-gated channel 4) locus of the mouse genome. Mice heterozygous for the RE deletion showed bradycardia, sinus node dysfunction, and selective loss of *Hcn4* expression.

CONCLUSIONS: We have identified REs at multiple genetic loci for AF and found that loss of an RE at the *HCN4* locus results in sinus node dysfunction and reduced gene expression. Our approach can be broadly applied to facilitate the identification of human disease-relevant REs and target genes at cardiovascular genome-wide association studies loci.

GRAPHICAL ABSTRACT: A graphical abstract is available for this article.

Key Words: atrial fibrillation ■ chromatin ■ gene expression ■ genetics ■ genome-wide association study ■ regulation ■ STARR-seq ■ variants

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Atrial fibrillation (AF) is the most common cardiac arrhythmia, with a prevalence increasing with age. It is a major risk factor for embolic stroke and is associated with morbidity and mortality.¹ Although factors such as sex, aging, and comorbidities contribute to AF risk, family studies have shown there is a heritable component to AF.^{2–4} With the advance of genome-wide association studies (GWAS), the search for the genetic components of AF has accelerated. Many single-nucleotide polymorphisms (SNPs) were found to be associated

with AF in over 100 different loci, where each of the lead SNPs at a locus is often in strong linkage disequilibrium with hundreds of other common variants with virtually indistinguishable statistical associations.^{5–12} The vast majority of these AF-associated SNPs are found in intergenic/intronic regions rather than protein-coding regions, which when coupled with complex linkage disequilibrium structure makes identifying causal variant(s) challenging. This topic is a priority of the field, as identifying causal variant(s) at GWAS loci is the first step in

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Novelty and Significance

What Is Known?

- Genome-wide association studies have identified over 100 mostly noncoding regions of the genome that contain genetic variants (single-nucleotide polymorphisms) and variants in linkage disequilibrium associated with atrial fibrillation (AF).
- Among the many variants, many are likely just in the vicinity of AF-associated genetic elements, but others may directly affect AF susceptibility by, for instance, altering the activity of transcriptional regulatory elements and potentially the expression of effector genes, thus leading to increased AF risk.
- The challenge of genome-wide association study interpretation lies in the identification of the causative variants, the directionality of altered target gene expression, and the effect on biological mechanisms that impact on the trait of interest such as AF.

What New Information Does This Article Contribute?

- We systematically screened 12 loci strongly associated with AF for atrial regulatory element activity using a combination of self-transcribing active regulatory region sequencing and a conditionally immortalized rat atrial cardiomyocyte line.
- We identified over 400 potential human regulatory elements and validated one such element in a murine *in vivo* model using genome editing, showing that its

deletion causes decreased *Hcn4* expression and bradycardia.

- This specific approach may be broadly applicable to interpretation of genome-wide association study data by aiding in the dissection of biological mechanisms underlying disease predisposition, stratification of patients based on genotype, and potentially leading to the development of personalized diagnostics or therapies.

AF is the most common cardiac arrhythmia and is associated with significant morbidity and mortality. Genome-wide association studies have identified over 100 mostly noncoding regions in the genome containing common variants associated with AF. Although poorly understood mechanistically, such variants could influence the function of critical gene regulatory elements, thus linking them to AF risk. Using an inducible atrial cardiomyocyte cell line, we performed a high-throughput functional assay on 12 highly associated variant regions, totaling over 2 million base pairs. We identified over 400 potential human regulatory elements in the AF-associated regions and identified 24 variants that cause altered activity of such elements. The homologue of a noncoding variant region close to *Hcn4* was deleted from the mouse genome by genome editing to assess its function *in vivo*. These results provide a first step in the functional dissection of the AF-associated regions and could help pave the way to further stratify patients based on genotype.

Nonstandard Abbreviations and Acronyms

AF	atrial fibrillation
BAC	bacterial artificial chromosome
CRISPR/Cas9	clustered regularly interspaced short palindromic repeats/clustered regularly interspaced short palindromic repeat-associated 9 deletion
DEL	deletion
ESRRB	estrogen-related receptor-beta
GWAS	genome-wide association study
iAM	inducible atrial cardiomyocyte
IRF	interferon regulatory factor
L2FC	log ₂ fold change
MEF2	myocyte enhancer factor 2
RE	regulatory element
sgRNA	guide RNA
SNP	single-nucleotide polymorphism
STARR-seq	self-transcribing active regulatory region sequencing
TF	transcription factor

determining the molecular mechanism(s) by which these variants increase the risk of AF.

It has been found that disease-associated variants are often located in regions that are enriched for epigenetic signatures such as DNA accessibility and protein-binding sites, which predict the presence of *cis*-regulatory elements (REs).^{13–15} This suggests that alterations in target gene expression are due to disease-associated variants that modify the function of REs, by, for example, disruption or creation of TF (transcription factor)-binding sites.^{15,16} This likely causes small but important differences in the amount of RNA transcribed and protein produced, thereby predisposing to AF development.¹⁷ Because AF is a complex disease, it is thought that multiple variants from different loci may act in an additive way to environmental risk factors to cause disease. Expression quantitative trait locus studies linking AF-associated variants to changed expression in heart tissue support this notion, as effect sizes on gene expression are often small.¹⁸

To determine which AF-associated SNPs cause an effect, an unbiased approach to identify variants that alter regulatory DNA sequences involved in the regulation of atrial gene expression is needed. To this end, we screened 12 loci strongly associated with AF spanning 2.45 Mbp

of human genomic sequence using the high-throughput method self-transcribing active regulatory region sequencing (STARR-seq)¹⁹ in a recently generated line of fully differentiation-competent rat atrial myocytes designated inducible atrial cardiomyocyte (iAM)-1.²⁰ Of the genetic regions showing RE activity in this assay, we selected those regions that overlap both the locations of AF-associated variants and other epigenetic signatures suggestive of regulatory activity for further analysis. Subsequently, we used an adaptation of the STARR-seq approach to determine which of the selected AF-associated variants confer allele-specific differential enhancer activity. Moreover, we suggest potential target genes of these allele-specific REs by incorporation of promoter capture Hi-C data.²¹ Furthermore, we deleted the mouse orthologue of a variant region with REs containing a variant that shows allele-specific activity in the *HCN4* locus, revealing its regulatory activity, as well as its target gene specificity in vivo. Our approach should prove useful for wider application to GWAS follow-up studies, aiding in the identification of regions with regulatory activity, as well as disease-associated functional variants.

METHODS

The data that support the findings of this study are available from the corresponding author upon reasonable request. Detailed Methods are provided in the [Data Supplement](#). For research materials listed in the Methods and Materials, please see the Major Resources Table in the [Data Supplement](#).

Human Material

DNA was obtained from AF cases previously enrolled in the Massachusetts General Hospital AF Study.¹⁸ All participants were of European ancestry, and the study is reviewed annually by the Institutional Review Board of the Massachusetts General Hospital.

Generation of Transgenic Mice Using CRISPR

Guide RNA (sgRNA) constructs were designed using the online tool ZiFiT Targeter.²² For sgRNA sequences, see Table I in the [Data Supplement](#). Cas9 and sgRNA constructs were transcribed in vitro with the MEGAscript T7 (Thermo Fisher Scientific; AM1354) and mMESSAGE mMACHINE T7 Transcription (Thermo Fisher Scientific; AM1344M). sgRNAs (10 ng/ μ L per sgRNA) and Cas9 mRNA (25 ng/ μ L) were injected into the cytoplasm of 1-cell FVB/NRj zygotes to generate founder mouse lines. Lines were maintained on an FVB/NRj background (Janvier). Animal care and experiments were performed in accordance with the national and institutional guidelines. In all experiments, both male and female animals were used.

RESULTS

STARR-seq Identifies Atrial Myocyte-Specific Regulatory Potential in AF-Associated Regions

To identify biologically relevant regulatory potential through high-throughput assays such as STARR-seq,

the use of cell types that represent the tissue of interest and that can be efficiently transfected is critical. Therefore, we chose to use conditionally immortalized rat atrial myocytes (iAM-1 cells).²⁰ iAM-1 cells proliferate with a doubling time of 38 hours in the presence of doxycycline and spontaneously reacquire a phenotype closely resembling that of primary rat atrial myocytes when cultured in the absence of doxycycline. We hence anticipated that regulatory sequences normally active in the atria would be activated in these cells in the absence of doxycycline. We first determined that at day 9 of differentiation, iAM-1 cells are well differentiated and do not further mature (see extended Results in the [Data Supplement](#); Figure I in the [Data Supplement](#)). Furthermore, reporter gene expression driven by human *NPPA* and *GJA1* promoter increased between days 0 and 9 of differentiation and stabilized (*NPPA*) or decreased (*GJA1*) afterward (Figure II in the [Data Supplement](#)). After optimization, a transfection efficiency of $\approx 50\%$ of the iAM-1 cells was reached (Figure IIIA through IIID in the [Data Supplement](#)). Importantly, transfected cells differentiated equally well into functional (ie, excitable and contractile) cardiomyocytes as their nontransfected counterparts as judged from the results of bright-field microscopy and optical voltage mapping of the iAM-1 cultures at 9 days of differentiation (Figure IIIE through IIIF in the [Data Supplement](#)). We concluded that promoters of human cardiac genes are activated in redifferentiated iAM-1 cells and that day 9 is an optimal time point for STARR-seq analysis.

We next used STARR-seq¹⁹ to determine the regulatory potential of a library of genomic fragments from regions containing AF GWAS SNPs (Figure 1A). We selected the 12 most significantly AF-associated GWAS loci (Table II in the [Data Supplement](#)) from a recent comprehensive AF GWAS.¹¹ This GWAS contained over 65 000 AF patients composed of European (84.2%), Japanese (12.5%), African American (2%), and Brazilian and Hispanic (1.3%) populations. Using a threshold of 5×10^{-8} and Bonferroni correction, 104 AF-associated loci were found, each containing a sentinel SNP, and a number of associated variants in linkage disequilibrium with the sentinel SNP. Fifteen human bacterial artificial chromosomes (BACs) were selected that cover the majority of the regions containing AF-associated sentinel and associated variants in linkage disequilibrium. In total, the BACs in this study span 2.45 Mbp, with an average size of 163 kbp. Together, they contain 1641 AF-associated variants at $P < 10^{-8}$ and 2465 AF-associated variants at $P < 10^{-4}$,¹¹ with an average of 113 variants per BAC (Table II in the [Data Supplement](#)). Because of the random fragmentation of the BACs, each genetic locus is represented in multiple fragments of different lengths in a continuous distribution over that locus, resulting in a higher resolution than is achieved by other techniques using discrete preselected regions.²³ A library

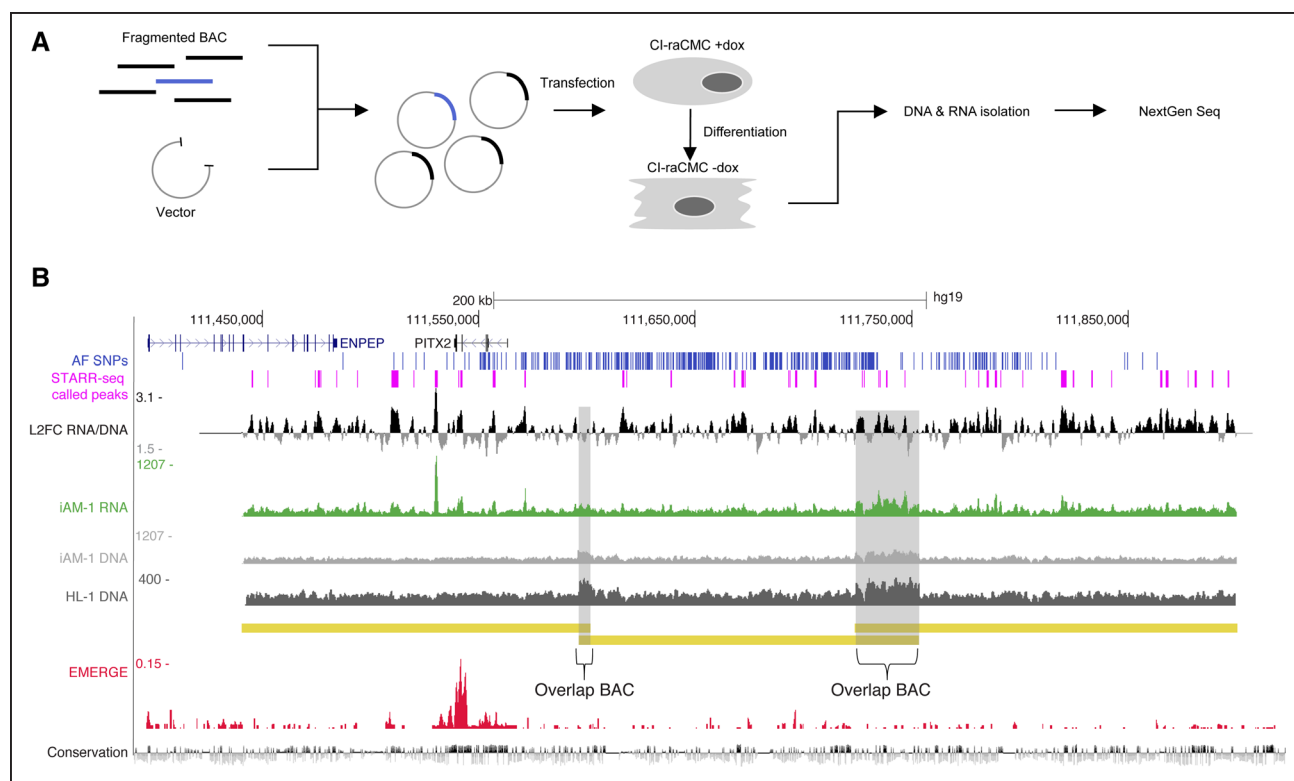


Figure 1. Self-transcribing active regulatory region sequencing (STARR-seq) approach and PITX2 locus output showing increased number of reads at overlapping bacterial artificial chromosomes (BACs).

A, Graphical representation of the STARR-seq approach. **B**, Example of *PITX2* (paired-like homeodomain 2) locus. Showing genome-wide association study single-nucleotide polymorphisms, called STARR-seq peaks, RNA sequencing (seq) and DNA-seq reads of inducible atrial cardiomyocyte (iAM)-1 cells, DNA-seq reads of cardiac cell line HL-1 cells (Methods in the [Data Supplement](#)), BAC locations, EMERGE output, and Genomic Evolutionary Rate Profiling score (GERP). Highlighted areas indicate BAC overlap, reflected by an increased presence of these regions in the DNA-seq data. dox indicates doxycycline; CI-raCMC indicates conditionally immortalized rat atrial myocytes; and L2FC, log₂ fold change.

was generated by inserting the fragments downstream of the SCP1 (super core promoter) promoter of plasmid (p)STARR-seq.¹⁹

The STARR-seq library was transfected before differentiation and after 9 days of redifferentiation; mRNA from 14 dishes and genomic DNA from 2 dishes were isolated and sequenced. Of the input genomic DNA, 99.71% was recovered in the isolated DNA, and 99.89% of the corresponding RNA was detected above a threshold of 10 tags. The mean number of tags per bin (10 bp) was 145.5 in DNA sequencing and 140.3 in RNA sequencing, with SDs of 48.9 and 125.1, respectively (Figure 2A and 2B).

The log₂ fold change (L2FC) of RNA reads over DNA reads was calculated for reads with >20 tags in the RNA sequencing data. Peak calling was performed with a threshold of 0.8 L2FC (corresponding to a 1.74-fold change in expression) with a 50-bp bin and a 20-tag cutoff, combining adjoining peaks within this 50-bp bin. In total, we obtained 197 regions encompassing 60 600 bp of candidate REs with transcription-enhancing capacity (Tables II and III in the [Data Supplement](#)). On average, each BAC possessed 13 RE regions with

an average total peak length of 4097 bp. Each of the loci spanning *KCNN3*, *SCN10A*, and *WNT8A* possessed only 2 regions displaying more than a 1.74-fold change in expression. With 37 regions showing a fold change >1.74, the *GJA1* locus had the highest number of hits. As the promoter in the human pSTARR-seq used to identify REs has been reported to display relatively high basal activity,²⁴ we hypothesized that this property could be used to detect REs with repressing activity. We analyzed regions displaying a higher number of reads in the DNA than in the RNA, finding 248 regions with an L2FC <−0.8 with a 50-bp bin, combining adjoining peaks within this 50-bp bin (Tables II and III in the [Data Supplement](#)). Together, these regions span 46 150 bp of candidate REs with repressing capacity, in line with observations of others.²⁵

As a proof of concept for our STARR-seq screen, we confirmed the activity for previously reported cardiac enhancers intronic of *SCN5A*²⁶ and *SCN10A*²⁷ (Figure 2C). Interestingly, around promoters, we observed a negative L2FC, indicating that a promoter sequence, when inserted downstream of the SCP1 promoter of the STARR-seq plasmid, interferes with transcription and

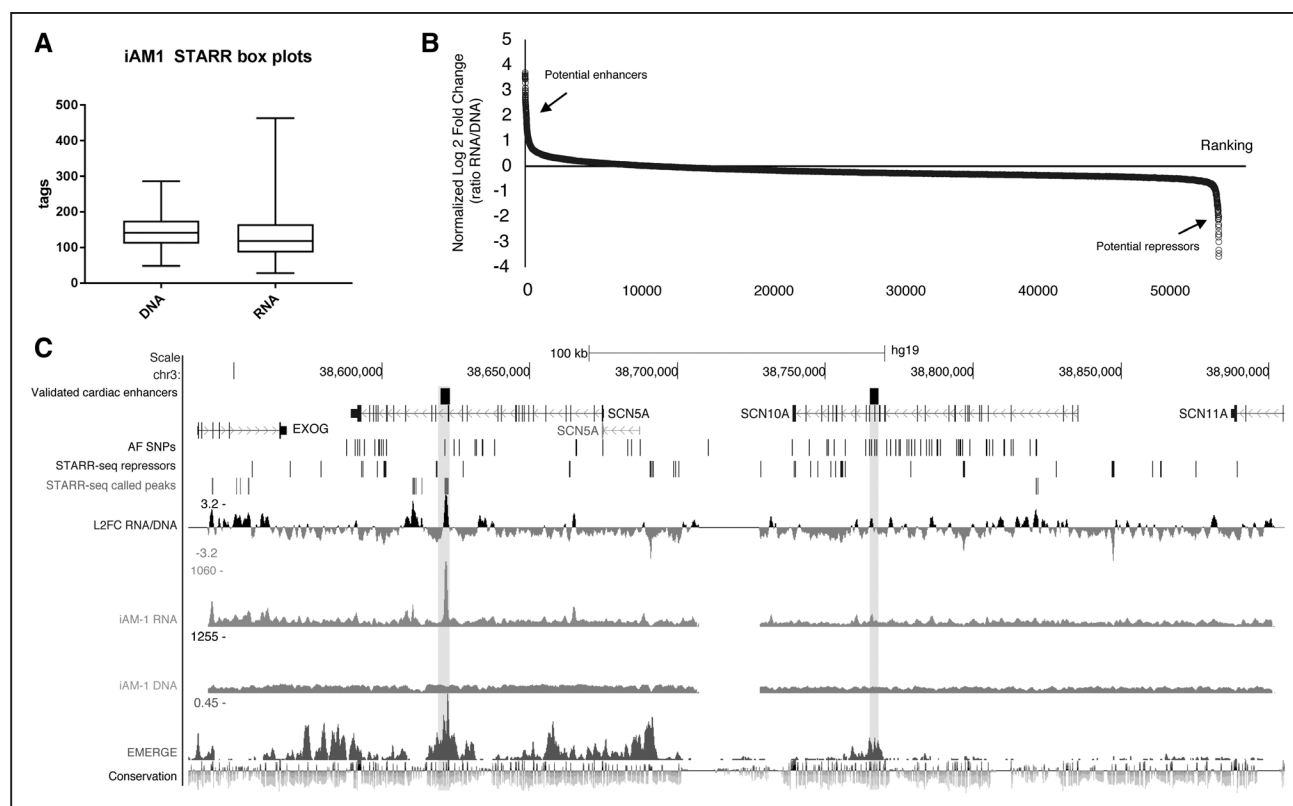


Figure 2. Self-transcribing active regulatory region sequencing (STARR-seq) output identifies regulatory elements.

A, Tag distribution of DNA-seq and RNA-seq in inducible atrial cardiomyocyte (iAM)-1 STARR-seq. **B**, Log₂ fold change (L2FC) of RNA over DNA reads showing that a fraction of regions is overrepresented in the RNA (L2FC>0.8, potential enhancers) and a fraction is enriched in the DNA (L2FC<-0.8, potential repressors). **C**, *SCN5A/10A* locus showing atrial fibrillation (AF)-associated variants, called STARR-seq peaks (L2FC>0.8), L2FC of RNA over DNA reads, iAM-1 RNA-seq, iAM-1 DNA-seq, EMERGE output, and conservation track. The 2 areas highlighted in gray correspond to validated cardiac enhancers, both of which show STARR-seq signals. Promoter regions are shown as zoom-in underneath the genome browser of the University of California, Santa Cruz (UCSC) track. EXOG indicates Exo/Endonuclease G; and SNP, single-nucleotide polymorphism.

does not have strong enhancer activity (Figure 2C).²⁴ Examples are the promoter of an isoform of *SCN5A* and the region upstream of *SCN10A* (Figure 2C).

To identify putative cardiac TF-binding sites in the identified enhancer elements based on their signature consensus binding sequences, a TF-binding motif analysis was performed on the STARR-seq-called peaks with L2FC >1.5 corresponding to >2.8-fold increase in RNA reads over DNA reads using HOMER (Hypergeometric Optimization of Motif Enrichment).²⁸ Enriched motifs included recognition sites for MEF2 (myocyte enhancer factor 2) family members, NKX2-5 (NK2 homeobox 5), ESRRB (estrogen-related receptor-beta), COUP-TFII (COUP transcription factor 2), KLF5 (Krüppel-like factor 5), and MEIS2 (Meis homeobox 2; Figure 3A and 3C) with established roles in cardiac (atrial) development and transcription.²⁹⁻³⁶ The enrichment of these recognition sites in the regions of enhanced transcription identified in this assay could reflect the enrichment of cardiac enhancers present in the library. Interestingly, recognition sites for IRFs (interferon regulatory factors) were highly represented in the top 10 enriched motifs

(Figure 3A and 3B). Using RNA sequencing, we found expression of IRFs in human left atrial tissue (Figure IVC in the [Data Supplement](#)),³⁷ as well as in the iAM-1 cells in the absence of transfected DNA (Figure IVA and IVB in the [Data Supplement](#)). This may lead to the excess activation of fragments containing IRF motifs. However, the occurrence of IRF motifs could also be caused by an innate immune response due to plasmid transfection. As a negative control, we ran a similar analysis on randomly chosen STARR-seq regions of similar length with an L2FC between -1.5 and 1.5, revealing no enrichment of any relevant motifs (Figure 3F). When we analyzed the enrichment on the STARR-seq-called peaks of L2FC<-1.5 corresponding to a 2.8-fold decrease of RNA over DNA reads, we similarly found significant enrichment of MEF2 and NKX2 family members and other cardiac TFs, confirming the presence of cardiac-specific REs, representing potential repressors of expression (Figure 3D and 3E). For example, NKX2.5-binding motifs were found in 25% of sites, with multiple testing corrected *Q* value of 0.0001 and *P*<10⁻⁵.

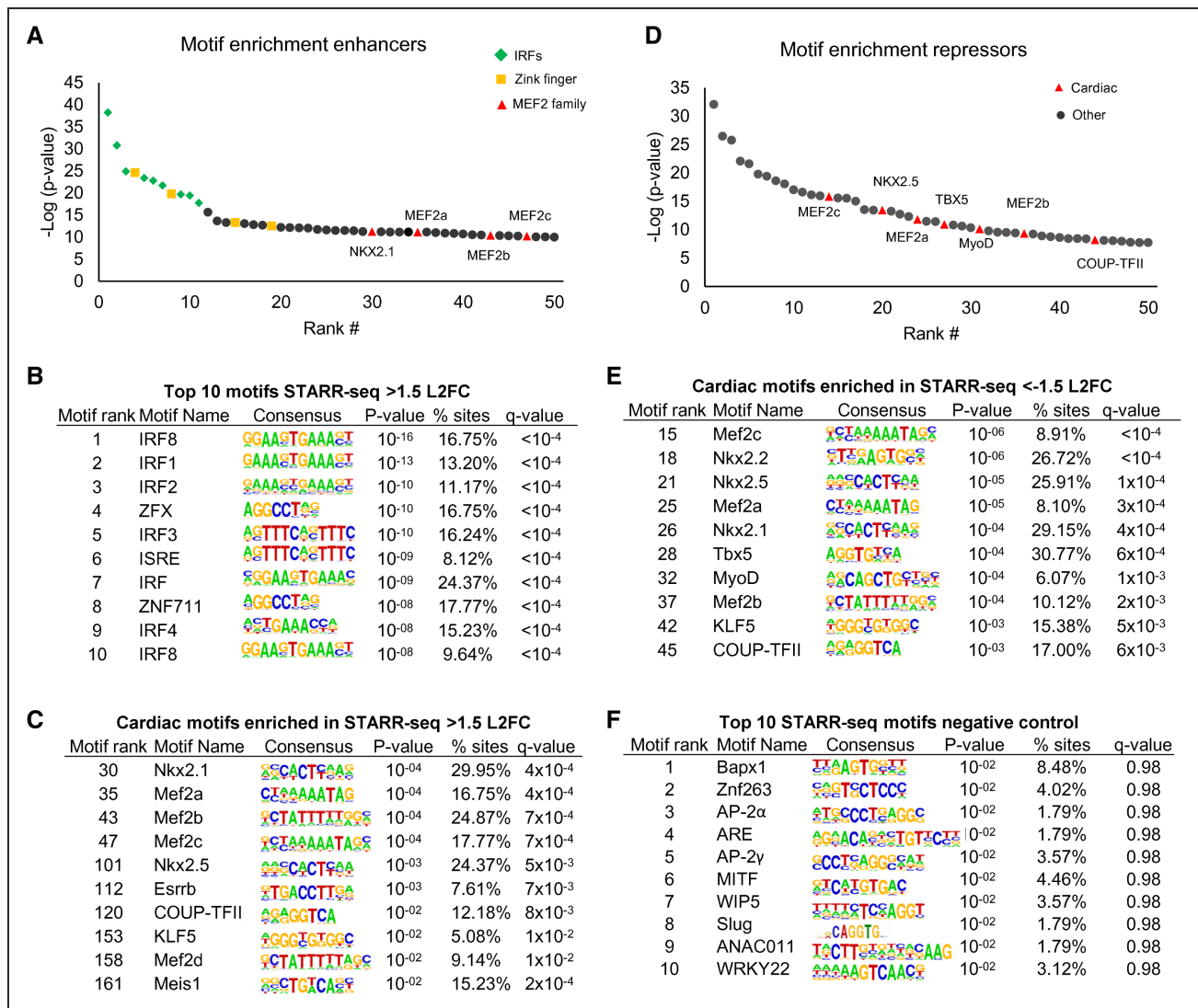


Figure 3. Transcription factor motif enrichment in self-transcribing active regulatory region sequencing (STARR-seq) identified elements.

A, Top 50 identified motifs in STARR-seq >1.5 log₂ fold change (L2FC). **B**, Top 10 motifs in STARR-seq regions with >1.5 L2FC showing a strong representation of IRF (interferon regulatory factors)-binding sites. **C**, All cardiac-specific motifs enriched in the STARR-seq regions with L2FC >1.5. **D**, Top 50 TF (transcription factor) motifs identified by HOMER (Hypergeometric Optimization of Motif Enrichment) in STARR-seq <-1.5 L2FC and $P < 0.05$. Motif rank is based on significance; %sites indicates percentage of STARR-seq <-1.5 L2FC containing this motif. **E**, All cardiac-specific motifs enriched in the STARR-seq regions with L2FC <-1.5. **F**, Top 10 motifs found in STARR-seq between -1.5 and 1.5 L2FC that we consider not to be potential regulatory elements. **A-F**, HOMER calculates Q values using the Benjamini-Hochberg false discovery rate procedure. Q values of <0.05 were considered significant. COUP-TFII indicates COUP transcription factor 2; MEF2, myocyte enhancer factor 2; MyoD, myoblast determination protein 1; NKX2-5, NK2 homeobox 5; and TBX5, t-box transcription factor 5.

Allele-Specific STARR-seq of AF-Associated Variants With Enhancer Potential

We next identified regulatory regions containing AF-associated SNPs. Such SNPs could allele specifically alter RE activity and could, therefore, add to the risk of AF in patients with this risk allele. To select identified atrial REs containing AF-associated variants, we intersected AF variants and the STARR-seq output. Because the STARR-seq tests transcriptional regulatory activity of episomal (ie, nonchromosomally integrated) DNA fragments outside their chromatin context, they may report

the activity of DNA fragments that are not active in vivo.²⁴ To address this issue and to better discriminate between false and real positive signals, we cross-referenced our data using EMERGE.³⁸ This is a bioinformatics tool that integrates cardiac-specific ATAC (assay for transposase-accessible chromatin) sequencing data, histone marks, and various TF chromatin immunoprecipitation sequencing data for tissue-specific enhancer prediction (Figure 4A). We selected 43 regions with overlapping STARR-seq signal, EMERGE signal, and AF-associated variants, containing a total of 78 variants with a threshold of $P < 10^{-4}$ (Table I in the Data Supplement). We chose

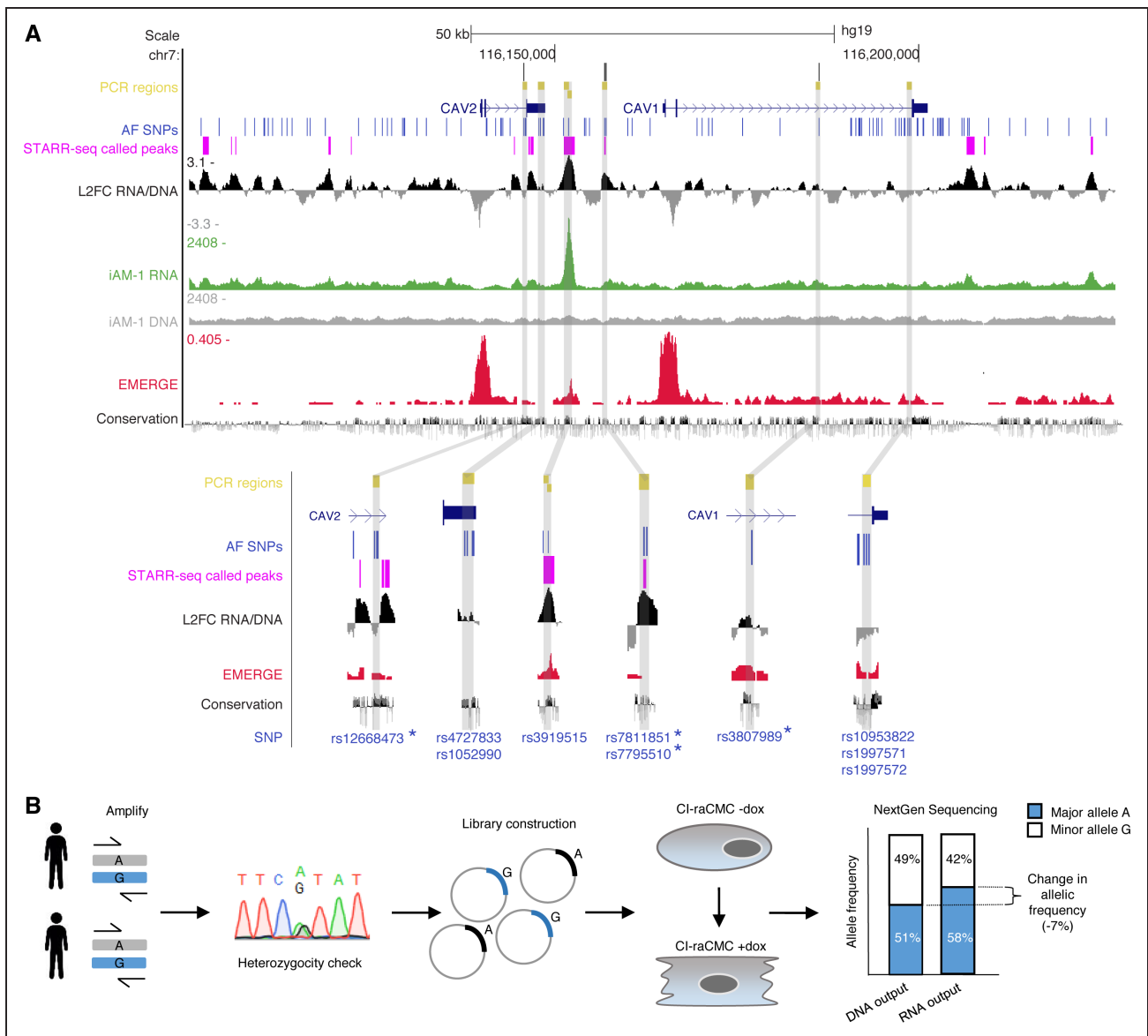


Figure 4. Variant self-transcribing active regulatory region sequencing (STARR-seq) shows significant allele-specific regulatory potential.

A, *CAV1/CAV2* locus showing atrial fibrillation (AF) variants, STARR-seq called peaks, log₂ fold change (L2FC) of RNA over DNA reads, inducible atrial cardiomyocyte (iAM)-1 RNA sequencing (seq), iAM-1 DNA-seq, EMERGE output, and conservation track. Highlighted areas are regions included in the variant STARR-seq. Zoom-in of the regions included in the variant STARR-seq, with variant name. Star indicates significant difference in STARR-seq reads between minor and major alleles. **B**, Method of the variant STARR-seq. Regions of 400 to 900 bp including the selected variants were amplified from several patients. Regions were checked for heterozygosity by Sanger sequencing. Next, a library was constructed and transfected into iAM-1 cells. After cardiomyogenic differentiation of these cells, DNA and RNA were extracted followed by DNA-seq and RNA-seq. Allele frequencies in DNA were compared with RNA. CI-raCMC indicates conditionally immortalized rat atrial myocytes; PCR, polymerase chain reaction; and SNP, single-nucleotide polymorphism.

this threshold based on observations that subthreshold variants (association $P < 10^{-4}$) can affect RE activity and may represent true risk variants.³⁹

Primers were designed for the selected regions, typically amplifying 450- to 900-bp fragments containing all assigned variants. To amplify the selected variant enhancers, a database containing whole genome sequencing data of AF patients was searched for samples heterozygous for the respective variants, and selected variants

were amplified using this input DNA library (Figure 4B). The presence of both alleles of the selected variants was verified using Sanger sequencing, and the fragments were combined in equimolar amounts. Subsequently, these fragments were inserted into pSTARR-seq_human, and the resulting reporter plasmid library was transfected into iAM-1 cells. After 9 days of differentiation, DNA and RNA were extracted from the cells and sequenced. Of the 78 selected variants, 72 were detected after DNA

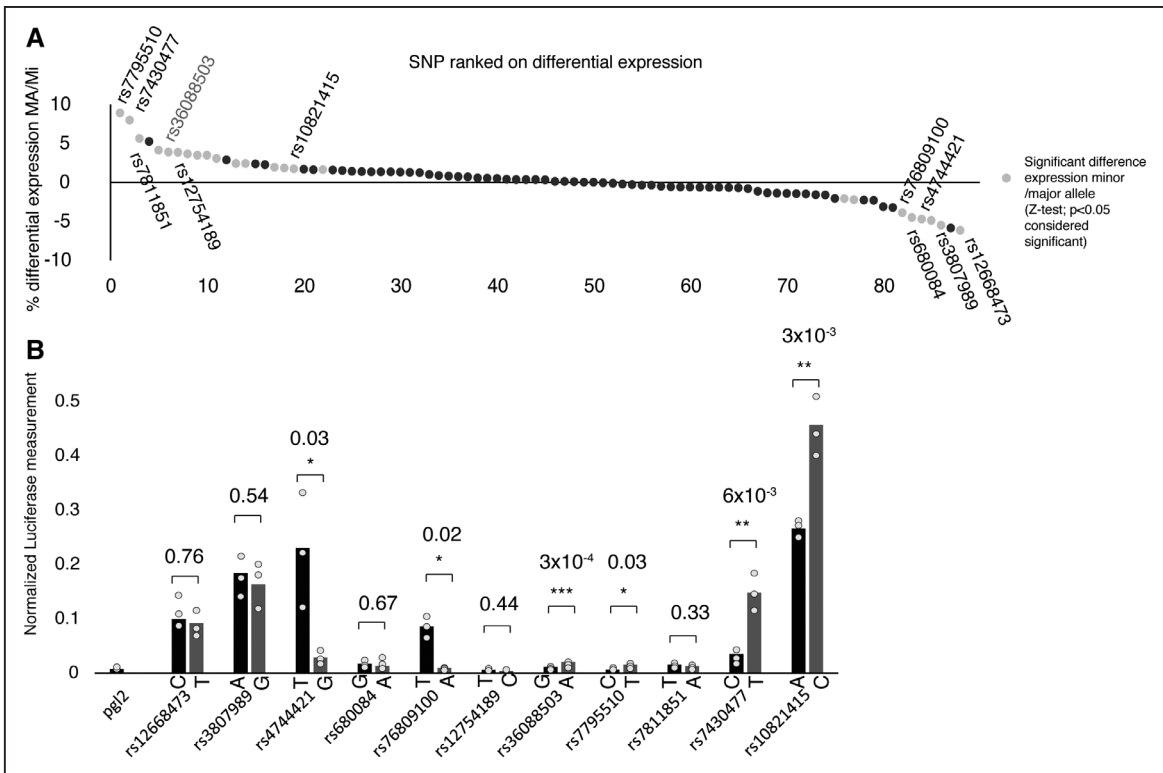


Figure 5. Variant self-transcribing active regulatory region sequencing (STARR-seq) and luciferase assay identify variants causing regulatory element differential activity.

A, Overview of all 88 variants showing differential expression (expressed in percentage) of the major allele (MA) over the minor allele (Mi) in the variant STARR-seq assay. The 24 significantly different variants are indicated by green dots. Significance was assessed by Z test; $P < 0.05$ was considered significant. **B**, Luciferase assay showing normalized measurements of the transcriptional activity conferred by the MA and Mi of atrial fibrillation (AF) variants. SNP indicates single-nucleotide polymorphism. * $P < 0.05$ was considered significant (as assessed by 2-tailed Student t test), ** $P < 0.01$, *** $P < 0.001$.

sequencing (92.3%; Table IV in the [Data Supplement](#)). We quantified the number of reads of both alleles of the variants in DNA and RNA sequencing using DESeq2 and a Z test to compare the proportion of each allele in the transfected (DNA input library) relative to its counterpart in the transcribed material (RNA output library). This analysis showed that 24 variants had significantly different allelic ratios between the input and output library, indicative of altered regulatory activity (33.3%; Table V in the [Data Supplement](#); Figure 5A and 5B). The significant differential activities ranged from 1.6% to 8.8% (Table V in the [Data Supplement](#)).

To further validate the allele-specific enhancer activity, we tested a number of these variant REs by luciferase assay in the iAM-1 cell line. Comparison of normalized major and minor allele luciferase values revealed that 5 of 10 variants showed a significant difference in activity (Figure 5B). One of these variants, rs7430477 T/C lies within a previously identified enhancer intronic of *SCN10A*.²⁷ The direction of the change is consistent with the allele-specific STARR-seq results for 3 of 5 of the significant variants in the luciferase assay: rs36088503, rs7430477, and rs10821415. The other variants (rs7795510 and

rs76809100) show a higher activity for the allele that showed a lower activity in the STARR-seq.

To look into the potential mechanism by which the variants affect DNA transcription, find individual motif occurrence was performed on a 20-bp sequence window around the 24 variants with allele-specific function.⁴⁰ This analysis showed 6 SNPs to alter potential TF-binding sites (Table VI in the [Data Supplement](#)). One of these TF-binding site-altering variants is rs6495063. The minor allele of this variant (T; allele frequency, 22%) changes the DNA sequence to a greatly improved predicted recognition site for the TF ESRRB, potentially leading to stronger binding of the DNA.

We next asked which genes are most likely regulated by these REs. To this end, we searched a promoter capture Hi-C data set performed in iPSC-derived cardiomyocytes.²¹ Promoter capture Hi-C,^{41,42} which is an adaptation of chromosome conformation capture technique Hi-C,⁴³ highly enriches for promoter sequence interactions. We interrogated our 24 functional AF variants for promoter interactions in this data set. A number of the variant-containing regions showed interaction with the promoter of one or several genes, giving an indication of the potential functional targets of the identified enhancers modified by these AF-associated

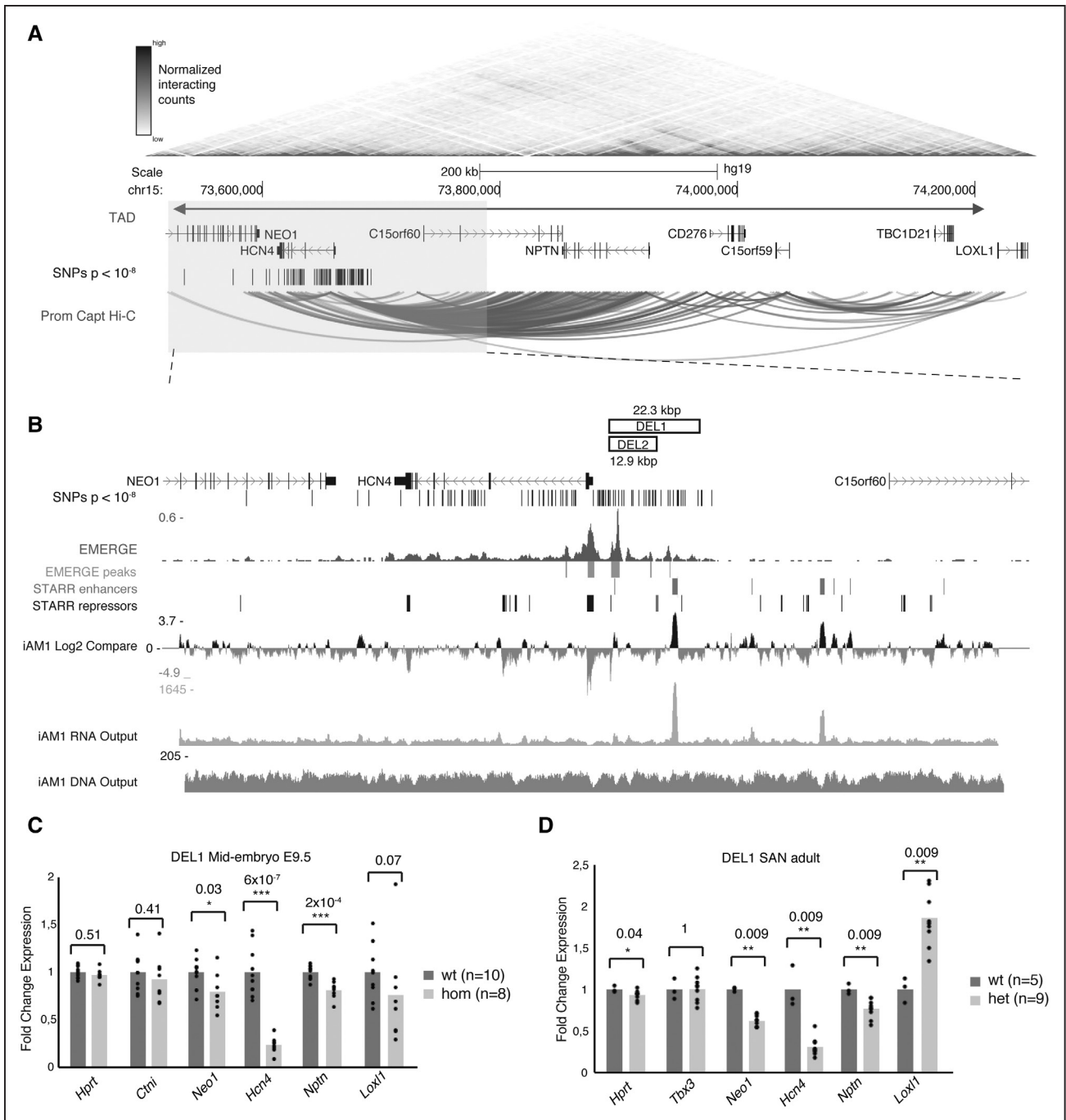


Figure 6. Identification of enhancer region in the *Hcn4* locus in mice.

A, *HCN4* locus (GRCh37/hg19 assembly) showing the genes in the *HCN4* topologically associating domain (TAD; shown by Hi-C data in the top track, Rao et al⁴³), atrial fibrillation (AF)-associated variants, and promoter capture Hi-C (PCHi-C) data (bottom track, Montefiori et al²¹). **B**, Zoom-in of the region surrounding *HCN4* indicating the 22.4-kbp deletion of both the proximal and distal regulatory element (RE; DEL [deletion]-1) and the 12.9-kbp deletion of the proximal RE only (DEL2). Shown are the EMERGE output (RE prediction), called EMERGE peaks, self-transcribing active regulatory region (STARR) enhancers and repressors, STARR log₂ fold change (L2FC) of RNA over DNA reads, STARR DNA sequencing (seq), and RNA-seq. **C**, RT-qPCR analysis of the effects of the AF-associated variants identified in the *HCN4* (potassium/sodium hyperpolarization-activated cyclic nucleotide-gated channel 4) locus on the transcription of potential target genes within the TAD of mouse *Hcn4* (significance assessed by Mann-Whitney *U* test). **D**, RT-qPCR demonstrating that deletion of *DEL1*^{+/-} alters the expression of all genes tested in the TAD of *Hcn4* in sinoatrial node (SAN) tissue of adult mice (significance assessed by Mann-Whitney *U* test). *NEO1* indicates Neogenin 1; and SNP, single-nucleotide polymorphism.

variants (Table VII in the [Data Supplement](#)). For example, in the *HCN4* locus, 2 variants (rs6495063 and rs6495062) showed allele-specific RE activity in the STARR-seq.

Moreover, they are in contact with the promoter of *NPTN*, as determined by promoter capture Hi-C (Figure 6A), indicating this is a possible target gene of these REs.

In Vivo Analysis of STARR-seq Identified RE

For in vivo analysis, we selected a variant region with a strong STARR-seq signal overlapping an AF-associated variant for which no expression quantitative trait locus data are available. Using STARR-seq, we identified 2 potential REs on chr15q24.1 with lead SNP rs7172038, upstream of *Hcn4* that contain AF-associated variants ($P < 10^{-8}$). To assess the function of these REs and their target genes in vivo, we made 2 deletions in the mouse genome using CRISPR/Cas9 (clustered regularly interspaced short palindromic repeats/clustered regularly interspaced short palindromic repeat-associated 9) technology (Figure 6B). We deleted both the proximal and distal RE together (DEL [deletion]-1; mm9 chr9:58,644,674-58,667,035) and the proximal RE alone (DEL2; mm9 chr9:58,654,166-58,667,035). Both deletions encompass the lead SNP rs7172038 and the proximal RE, while only the large deletion contains the distal RE identified with STARR-seq. Both the single and double RE deletion mutants were homozygous lethal around embryonic day 11.5. Functional RE-target promoter interactions most frequently occur within the same topologically associating domain.⁴⁴⁻⁴⁶ Therefore, to determine which genes could be affected by the deletions, we screened expression of all genes within the topologically associating domain. The future thoracic region of the embryo containing the heart including inflow tract, which selectively expresses *Hcn4* at this stage,⁴⁷ was tested at embryonic day 9.5 for expression of *Neo1*, *Hcn4*, *Nptn*, and *Lox1* in DEL1^{-/-} animals. We did not test *C15orf60* or *C15orf59* because these genes are not expressed in heart tissue (human or mouse).³⁷ Of these genes, only *Hcn4* was significantly downregulated (73%) in homozygotes (n=10) compared with wild-type littermates (n=8) as shown by Mann-Whitney *U* test (Figure 6C). As a control, the expression of the same genes was tested in the remaining tissue of the embryo, showing no significant differences as tested by Mann-Whitney *U* test ($P > 0.001$) in expression between DEL1^{-/-} and wild-type embryos (Figure VA in the [Data Supplement](#)).

The expression of the same genes was tested in microdissected sinoatrial node regions comparing adult DEL1^{+/-} (n=9) with wild-type (n=3) animals. In the DEL1^{+/-} sinoatrial node region, *Hcn4* was downregulated as shown by Mann-Whitney *U* test (Figure 6D). Furthermore, in DEL1^{+/-}, expression of *Neo1* was decreased and *Lox1* increased (Figure 6D). In contrast, in DEL2^{+/-}, expression of *Neo1* was slightly increased and of *Lox1* slightly decreased (Figure VB in the [Data Supplement](#)). Collectively, these data indicate that within the topologically associating domain, *Hcn4* is the major target gene regulated by the proximal REs and that the region uniquely deleted in DEL1 additionally influences the regulation of *Neo1* and *Lox1* (Figure 6).

Mice heterozygous for DEL1 presented with frequent sinus pauses (Figure 7A and 7B) similar to previous reports of conditional *Hcn4* knockouts,⁴⁸⁻⁵⁰ with increased heart rate variability (Figure 7C), as well as fragmented QRS (Figure 7D and 7E; Figure VIA and VIB), and rare ectopic atrial activations. Male (n=7) and female (n=6) mice were used, both showing normal data distribution and no significant differences between the sexes as determined by 2-tailed *t* test. Additionally, we observed a modest increase in PR interval duration, whereas other ECG parameters remained unchanged (Figure 7F). To assay sinoatrial and atrioventricular node function, we performed transesophageal burst pacing and found that heterozygous mice showed a significantly longer cSNRT (corrected sinus node recovery time) at 100 and 120 ms pacing frequencies (Figure 7G), whereas atrioventricular node function remained unaffected (Figure 7H). Moreover, 2 of 14 heterozygous mice presented with over 1 second cumulative AF upon rapid atrial pacing stimuli (Figure 7I; Figure VIC and VID). These data reveal the critical role of a STARR-seq-identified RE for mouse development, *Hcn4* expression, and electrophysiology.

DISCUSSION

GWAS have identified a large number of variants (SNPs) associated with AF in over 100 loci.¹¹ Identification of the functional variants among these AF-associated SNPs has lagged, because the identification of biologically relevant REs and the impact of a variant on their function and on target gene regulation has remained technically challenging. Here, using STARR-seq and a recently generated line of differentiation-competent myocytes, we identified >400 potential REs in 12 AF-associated loci. Subsequently, we identified 24 variant REs with allele-specific regulatory activity using an adapted STARR-seq approach.

High-throughput reporter assays have associated candidate REs with unique barcodes, such as in massively parallel reporter assays,⁵¹⁻⁵³ or with the candidate REs themselves, such as in STARR-seq assays.⁵⁴ STARR-seq enables the use of discrete regions of larger stretches of genomic material in contrast to massively parallel reporter assays in which oligodeoxyribonucleotides are synthesized, restricting the length of the fragments that can be analyzed.⁵⁵ A drawback of both techniques is the use of episomal plasmid DNA elements to investigate the functionality of REs. Sequences with putative elements may be activated when tested episomally, but this does not represent the normal in vivo situation where the REs are subjected to chromatin packaging.⁵⁶ It is likely that the occurrence of the observed *lrf* recognition sites in the enriched motifs of the STARR-seq is caused by the transfection of this episomal plasmid DNA, which causes the induction of the innate immune response in the iAM-1 cells, also

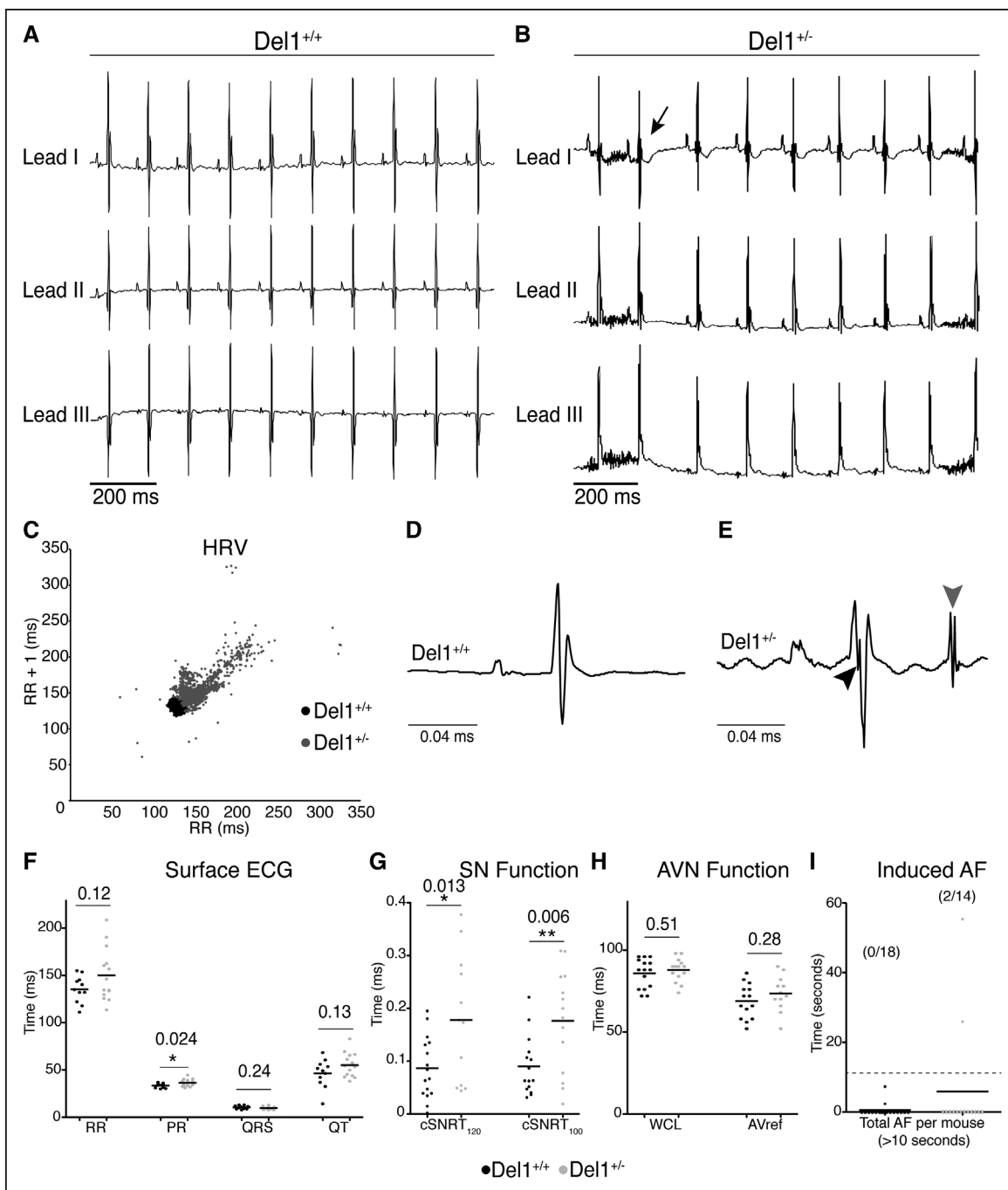


Figure 7. *Hcn4* regulatory element (RE) DEL (deletion)-1^{+/-} mice present with heart rhythm abnormalities.

A and **B**, Representative 3-lead surface ECG traces of **(A)** WT and **(B)** DEL1^{+/-} mice showing sinus pauses after respiration (arrow). **C**, Representative Pointcaré plot of WT (DEL^{+/+}) and DEL1^{+/-} individuals showing increased heart rate variability (HRV). **D**, Sample single ECG trace of a DEL1^{+/+} (**left**) and **(E)** DEL1^{+/-} (**right**) depicting a fragmented QRS (black arrowhead) and ectopic atrial activation (red arrowhead). **F**, Summary of surface ECG parameters. **G**, Plots of corrected sinus node recovery time (cSNRT) at 120 and 100 ms pacing as an indication of sinus node (SN) function. **H**, Plots of Wenckebach cycle length (WCL) and atrial-ventricular (AV) refractory times as an indication of atrioventricular node (AVN) function. **I**, Plot depicting cumulative time spent in atrial fibrillation (AF) after burst pacing per mouse. **F–H**, Exact *P* values are reported and calculated by 2-tailed Student *t* test. **P*<0.05 was considered significant, ***P*<0.01.

observed by others.^{57,58} To discriminate between bona fide functional REs and those that display activity only in reporter plasmids, we used EMERGE.³⁸ In this recently developed software package, existing (epi)genomic data sets are integrated and weighed, allowing us to

evaluate candidate REs in the proper tissue-specific epigenomic context. Using available chromatin conformation data of differentiated cardiomyocytes,²¹ the possible target genes of these REs were mapped. To identify its target genes and their physiological function,

we deleted the orthologue of an RE close to *HCN4* from the mouse genome, which led to selective loss of *Hcn4* expression in heterozygous mice, embryonic lethality of homozygous mutants, and arrhythmia in heterozygous mutant mice.

In our experience, the use of an appropriate cell line is crucial to find biologically meaningful results using STARR-seq. Others have used S2, ovarian somatic cells, and HeLa cells for STARR-seq assays,^{19,59} but we used iAM-1 cells for identifying AF-associated REs as these conditionally immortalized atrial myocytes closely resemble primary atrial myocytes in both structure and function following their cardiomyogenic differentiation. This makes them highly suitable for our purpose, that is, the identification of atrial cardiomyocyte-specific variant enhancers.²⁰ However, the use of this specialized cell line also limits the analysis to cardiomyocytes, excluding any potentially relevant variant RE activity found in other cell types in the heart such as fibroblasts and endothelial cells. Another consideration is the relative (im)maturity of the currently available in vitro atrial cardiomyocyte models.^{60,61} Neither pluripotent stem cell-derived atrial cardiomyocytes nor permanently immortalized atrial cardiomyocytes possess functional and structural characteristics similar to those of the primary cells from which they were derived. Extensive transcriptional, immunocytological, and electrophysiological analyses showed that the iAM-1 cell line used in this study outperforms all other cardiomyocyte lines including the often used HL-1 cell line in terms of cardiomyogenic differentiation ability.²⁰ Moreover, optical voltage mapping experiments of confluent iAM-1 monolayers revealed that the cells reach their maximum level of cardiomyogenic differentiation after 9 days (of culture in the absence of doxycycline). RT-qPCR analysis of the samples collected at differentiation day 0, 9, and 12 showed that all tested cardiomyocyte maturation markers increased significantly from day 0 to 9 of iAM-1 differentiation, but no significant additional increase was observed between days 9 and 12 of cardiomyogenic differentiation (Figure 1 in the [Data Supplement](#)).

Comparing RNA with DNA reads, we not only identified enhancers in the iAM-1 cell line using STARR-seq but also observed regions with transcription-lowering activity, potentially reflecting repressors. It is known that the STARR-seq vector as it was originally published¹⁹ contains an SCP1 promoter that has a high basal activity and an origin of replication that could act as a conflicting core promoter, and that could potentially lead to elevated background activity in STARR-seq assays.^{24,62,63} In this case, the basal activity combined with the tissue specificity appears to enable the identification of regions with decreased (repressive) transcriptional activity. The observed enrichment of cardiac TF-binding sites in these repressing regions strongly suggests that they represent

bona fide cardiomyocyte-relevant REs. Thus, STARR-seq may be used for repressor identification, in line with observations of others.²⁵

The observed difference in activity between STARR-seq-identified variant AF-associated SNPs was significant but modest, which may, in part, be due to the strong core promoter in the pSTARR vector and the position of the RE, downstream of the promoter, which blunt measured differences in enhancer activity²⁴ (our observations). Nevertheless, the observed small difference in activity of such variant REs is in line with the estimated small effect size of risk variants on the expression of nearby genes.⁶⁴ How this relatively mild change in enhancer activity due to single-nucleotide changes leads to AF is not well established. There are an estimated 10× more REs compared with genes, implying that a gene could be regulated by multiple REs.⁶⁵ Indeed, it has been shown that multiple enhancers are needed for the correct dynamic expression of certain genes throughout development.^{66–68} This use of multiple RE or combinatorial RE interactions involving both repressors and enhancers could be mechanisms at play in the loci in this study, and it is possible that the activity of individual REs is influenced by such interactions in vivo, resulting in an overestimation of RE activity. However, the tools to investigate such interactions are currently lacking. On the other hand, some RE activity could also be missed in our assay, as multiple affected REs may synergistically lead to small but significant changes in expression of their target gene(s). Such a mechanism was proven to increase the risk of the complex disease Hirschsprung⁶⁹ and is likely to play a role in AF risk as well. Furthermore, the small effects seen in transfection-based assays may underestimate the effect size of the variant on RE function in vivo. REs usually function in the context of local genome structure, chromosome conformation, and epigenetic state. A change in TF binding (altered affinity, different TF) may strongly impact on endogenous transcriptional regulatory complexes while the consequences for artificial, episome-driven transcription as with pSTARR-seq human are small.

Variant RE-target gene identification requires functional assays in addition to contact maps. We identify 2 variants with allele-specific regulatory activity and here show an example of determining the functional targets. Deletion of the 2 REs identified by STARR-seq homologous to the human region upstream of *Hcn4* in the mouse in vivo led to homozygous lethality at embryonic day 11.5 and severely diminished *Hcn4* expression in heterozygous animals, showing that the deleted region(s) have indispensable developmental function. *Hcn4* expression is essential for proper generation of pacemaker potentials in the developing sinoatrial node, and global and cardiomyocyte-specific *Hcn4* depletion leads to embryonic lethality before embryonic day 11.5.^{48–50,70} We see increased heart rate variability, sinus node dysfunction,

and AF inducibility in heterozygous mice, similar to observations in familial HCN4 mutations in human that cause both bradycardia and AF.^{71,72} Moreover, studies suggest that bradycardia could be hidden by a reflex sinus tachycardia,^{71,73} and that slow heart rate is a substrate for AF through the increased likelihood of atrial ectopy,^{74,75} and thus causes increased risk of AF.⁷⁶

Although we here identify gene targets of REs *in vivo*, we are currently still unable to address the function of SNPs since the effect sizes of disease-associated variants are expected to be small in most cases, which may not be detected in dedicated mouse models, rendering their generation and analysis laborious and risky. To evaluate such an effect, multiple-unknown-synergistic SNPs are likely needed in parallel. Moreover, the conservation of human REs in the mouse is only moderate,⁷⁷ rendering testing in human cells necessary. However, as of yet, it is technically not feasible to pick up small effects on gene expression in differentiated human stem cells, the only tool available to date, because of the variation in phenotype of differentiated cell types derived from different modified stem cell clones.

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Disclosures

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Supplemental Materials

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