## New biomarkers from multiomics approaches: improving risk prediction of atrial fibrillation

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Abstract	Atrial fibrillation (AF) is a common cardiac arrhythmia leading to many adverse outcomes and increased mortality. Yet the molecular mechanisms underlying AF remain largely unknown. Recent advances in high-throughput technol- ogies make large-scale molecular profiling possible. In the past decade, multiomics studies of AF have identified a number of potential biomarkers of AF. In this review, we focus on the studies of multiomics profiles with AF risk. We summarize recent advances in the discovery of novel biomarkers for AF through multiomics studies. We also discuss limitations and future directions in risk assessment and discovery of therapeutic targets for AF.
Keywords	Atrial fibrillation • Mechanism • Aetiology • Genomics • Multiomics •

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## **1. Introduction**

Atrial fibrillation (AF) is the most common cardiac arrhythmia with increasing prevalence and incidence globally.<sup>1–3</sup> The lifetime risk of AF in individuals older than 55 years is ~37%.<sup>4,5</sup> It is estimated that ~59.7 million people were affected by AF worldwide in 2019, about double the number in 1990. An additional five million individuals are diagnosed each year.<sup>1,6</sup> The number of AF cases is estimated to reach 12.1 million by 2030 in USA alone.<sup>7</sup> AF is associated with increased risk of many comorbidities, such as stroke,<sup>8</sup> heart failure,<sup>9</sup> myocardial infarction,<sup>10</sup> dementia,<sup>11</sup> as well as increased mortality.<sup>9,12,13</sup> The adjusted annual incremental cost for individuals with AF is \$18 601,<sup>14</sup> resulting in an increase in the US health care costs of \$28.4 billion (estimated for 2016).<sup>15</sup> Therefore, it is important to identify new strategies to prevent AF.<sup>16</sup>

Many risk factors have been identified for AF,<sup>17–21</sup> including advancing age, smoking, alcohol consumption, obesity, diabetes, elevated blood pressure, heart failure, and myocardial infarction. Risk scores, based on the epidemiologic cohorts' data, have been developed to predict the 5- and 10-year risk of AF.<sup>22,23</sup> However, the molecular mechanisms underlying AF pathogenesis are not yet fully understood, and therapies for AF are only partially effective with substantial morbidity.<sup>24,25</sup>

Recent advances in high-throughput technologies make large-scale molecular profiling possible. In the past decade, multiomics studies of AF

have identified hundreds of potential biomarkers of AF. In this review, we focus on the studies of multiomics profiles with AF risk. In addition, we summarize recent advances in the discovery of novel biomarkers for AF through multiomics studies. We also discuss limitations and future directions in risk assessment and discovery of therapeutic targets for AF.

#### **1.1 Search strategy**

An electronic search for relevant publications was performed in the PubMed database. The major search terms included 'atrial fibrillation OR AF' AND 'incident' AND 'biomarker'. Specific search terms included 'genomic' OR 'transcriptomic' OR 'proteomic' OR 'metabolomic'. Two authors (J.K. and H.L) independently screened all retrieved records by titles and abstracts and then full-text articles. A detailed search strategy could be found in Supplementary material online, *Table S1*.

## 2. Multiomics study of AF

## 2.1 Genomics

#### 2.1.1 Heritability

The familial nature of AF was first reported in 1936 with a case series noting in a footnote that three brothers were affected, all before the age of 30 years.<sup>26</sup> Familial aggregation of AF was later validated in several

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other studies, suggesting that familial AF comprised up to 15% of lone AF cases.<sup>27,28</sup> Fox *et al.*<sup>29</sup> observed that approximately one-third of AF patients had at least one affected parent. Marcus *et al.*<sup>30</sup> found that first-degree family history was associated with increased risk of lone AF. Christophersen *et al.*<sup>31</sup> reported the importance of genetic heritability in same-sex twins and found that the co-twin of an AF-affected twin might be considered high risk for the development of AF. Lubitz *et al.*<sup>32</sup> further validated the familial nature of AF and reported that having one first-degree family member was associated with a 40% increased risk. In addition, there was a 24% increased risk in AF per additional affected first-degree family member. A younger age of onset in familial members was also associated with increased risk of AF.<sup>32,33</sup> Therefore, a better understanding of the genetic architecture of AF may pave the road for greater insight into AF pathogenesis.<sup>34</sup>

#### 2.1.2 Candidate genes

The search for causal genes in AF started in the late 1990s.<sup>35,36</sup> Since then, over 35 genes have been identified to associate with AF in familial studies.<sup>36–38</sup> One example is *SCN5A*, which encodes a cardiac sodium channel essential to the cardiac action potential. *SCN5A* mutations were observed in up to 6% of AF patients, including lone AF and those with underlying cardiac co-morbidities.<sup>39</sup> Makiyama *et al.*<sup>40</sup> described a novel gain-of-function *SCN5A* mutation in familial AF.

Another example is *GJA5*, which encodes the connexin-40 responsible for atrial conduction. GJA5-knockout mice showed increased vulnerability to atrial arrhythmias.<sup>41,42</sup> Loss-of-function variants in *GJA5* inhibit cell-cell electrical coupling or gap-junction congregation at the surface.<sup>43</sup> Chimeric mice with inconsistent expression of connexin-43 had conduction delays in their atrial myocardium, suggesting that mosaicism in the connexin tissue might be involved in arrhythmia initiation.<sup>44</sup> However, most of the variants in candidate studies are rare, observed only in affected families, and replication efforts mostly failed.<sup>45</sup> Hence, researchers have turned to comprehensive genome-wide screening of variants in large populations.

#### 2.1.3 Genome-wide association studies

The most popular method to identify genetic variants for common diseases is the genome-wide association study (GWAS), which allows the comparison of allele frequency between disease cases and referents for each genetic variant [e.g. single-nucleotide polymorphisms (SNPs)]. The first GWAS of AF was performed in 2007 based on participants from Iceland, which identified the first common locus 4q25 for AF.<sup>46</sup> Lubitz et al.<sup>47</sup> later showed that at least four distinct AF susceptibility signals at the locus were associated with prevalent and incident AF. The closest gene at this locus is PITX2, which plays an important role defining rightleft cardiac symmetry, developing pulmonary vein myocardium, and inhibiting sinus node formation in the left atrium.<sup>48,49</sup> In animal models, PITX2c knockout-mice had shorter atrial refractory periods and were more predisposed to atrial arrhythmias.<sup>50</sup> Using human left atrial samples, it had been shown that patients with AF have lower expression of the PITX2c isoform compared to non-AF individuals.<sup>51</sup> In order to identify additional AF-related loci and since most genetic loci have small effects, the AFGen consortium was organized as an international effort for AF GWAS. The Consortium has led the field of AF genetics, describing the vast majority of genetic loci associated with AF in the past decade.<sup>47,52–56</sup> The latest AF GWAS included over 65 000 AF cases from more than 50 cohorts, and identified 97 AF-related loci.<sup>57</sup> Large biobanks, such as the UK BioBank, are also being utilized to identify

additional genetic loci.<sup>58</sup> Many of the genetic loci identified through GWAS implicated genes related to cardiopulmonary development, cardiac-expressed ion channels, channelopathies, and signalling molecules, emphasizing the polygenic nature of AF.<sup>59</sup>

Based on the GWAS results, a polygenic risk score (PRS) may be constructed that allows individualized projections of AF risk. PRSs represent the combined effect of multiple genetic variants on disease risk. Whereas individual SNPs carry relatively little effect (ranging from 0.07 to  $0.37^{56}$ ), pooled SNPs register observable differences among individuals. By pooling SNPs to create the PRS, Weng *et al.*<sup>4</sup> reported that individuals with the highest tertile PRS had 1.82-fold lifetime risk of those with lowest tertile PRS. Moreover, individuals with high PRS but low clinical risk were associated with a lifetime AF risk of 43.6%, which was comparable to those with high clinical risk.

Despite the remarkable success of GWAS, several challenges remain. Genetic variation accounted for 22.1% of variance in AF risk,<sup>60</sup> but known AF-related loci may explain only a relatively small proportion of AF heritability, suggesting many more are yet to be identified. One possible reason for the missing heritability is unidentified rare variants with large effects compared to common genetic traits.<sup>61,62</sup> Most of the GWAS analyses were conducted using microarray-based genotyping platforms, which have limited resolution to identify rare variants. In addition, the top variants from the GWAS are considered to tag, or serve as proxies, for the underlying functional variants. The functions of most GWAS loci are yet to be determined.<sup>63</sup>

#### 2.1.4 Targeted sequencing and exome sequencing

The advance of next-generation sequencing allows the identification of rare variants in the general population. Lin et al.<sup>64</sup> performed targeted sequencing on 77 GWAS loci and studied the association of both common and rare variants with AF. Rare damaging variants within *PRRX1* were found to associate with AF. In addition, a common variant rs11265611 was found to associate with AF. This SNP is located in the first intron of *IL6R*, which codes the interleukin-6 receptor, a pro-inflammatory marker triggering acute-phase proteins.<sup>65,66</sup> Inflammation is known as one of the causal pathways related to AF initiation and maintenance.<sup>67</sup>

Similar to targeted sequencing, exome sequencing aims to perform sequencing on the entire exome. Lubitz et al.<sup>68</sup> performed exome sequencing on more than 1700 individuals with AF and 9000 controls from three cohorts. None of the rare variant regions were significant after adjusting for multiple testing, suggesting that rare coding variants may not be the predominant mechanism for AF in the community.

#### 2.1.5 Whole-genome sequencing

As sequencing cost continues to decline, whole-genome sequencing is used with increasing frequency to identify genetic variants associated with complex disease. Several large-scale whole-genome sequencing projects have been initiated, including the Trans-Omics for Precision Medicine (TOPMed) project (https://www.nhlbiwgs.org/) that has generated variant calling from more than 200 K whole-genome sequencing samples. Whole-genome sequencing offers several advantages compared to target sequencing. First, whole-genome sequencing is able to cover the entire genome, which is particularly useful in identifying genetic loci that are located in non-coding regions. Second, since there is no requirement for the target region enrichment, whole-genome sequencing is capable of providing more consistent coverage. Moreover, wholegenome sequencing can also identify structural variants, which remain a challenge for targeted sequencing or exome sequencing. Based on the TOPMed project, Choi *et al.*<sup>69</sup> reported that loss-offunction variants in titin (*TTN*) were associated with early AF onset. The study included 2781 early-onset AF cases (<66 years) and 4959 referents. Titin is essential in myocardial function as a passive stabilizer of the sarcomere, suggesting that structural sarcomeric abnormalities might play a role in AF pathogenesis. Furthermore, the association with hypertrophic and dilated cardiomyopathies may explain the co-occurrence of AF in these patients.

#### **2.2 Epigenomics**

DNA methylation represents an important type of epigenetic modification without changing underlying DNA sequences. The methylation process adds a methyl group to the cytosine of cytosine-phosphate-guanine dinucleotides (CpG), and thus, modifies the conformational structure of chromatin and the binding of transcription factors. Different tissue types have different methylation states, and the methylation status may be modified by both genetic and environmental factors.<sup>70,71</sup> Many AF risk factors such as obesity,<sup>72</sup> smoking,<sup>73</sup> inflammation,<sup>74</sup> and alcohol consumption<sup>75</sup> also alter methylation profiles. The first epigenome-wide association study of AF in the community included 183 prevalent AF cases, 220 incident AF cases, and 2236 referents from the Framingham Heart Study.<sup>76</sup> Two CpG sites were significantly associated with prevalent AF, and five different CpG sites were associated with incident AF. One of the significant CpG sites was cg13639451, located upstream of WFIKKN2, which is known to be involved in the muscle fibre development and cardiac excitation-contraction coupling.77,78 Cg07191189 was another CpG site for prevalent AF. It is located near STRN that encodes striatin, which is able to bind with caveolin-134 and is known to be involved in cardiac development.<sup>79</sup> Shen et al.<sup>80</sup> studied the global DNA methylation in the right atrial myocardial tissue obtained from rheumatic valvular patients. From 10 AF patients and 10 referents, it was observed that AF patients tended to have higher global DNA methylation levels than referents (P < 0.05).

#### **2.3 Transcriptomics**

Gene expression is considered an intermediate phenotype between genetic variation and disease traits.<sup>81</sup> Both animal models and human studies suggest that AF pathogenesis is accompanied by alterations in gene expression.<sup>82–84</sup> Using whole blood transcriptomic profiles of individuals from the Framingham Heart Study, seven transcriptomic signatures were found to associate with prevalent AF.<sup>85</sup> The most significant gene was PBX1 that has an important role in great-artery patterning, septation of outflow tract,<sup>86</sup> and development of persistent truncus arteriosus.<sup>87</sup> SLC7A1 was another significant gene, which has been related to endothelial dysfunction and hypertension.<sup>88</sup> An AF-specific interaction network also was built and it was enriched with genes involved in multiple cardiovascular signalling pathways, such as the hypoxia signalling pathway responsible for oxygen deficit in cardiovascular organs, and the antiproliferative signalling pathway involved in the remodelling of cardiac myocardium.<sup>89,90</sup> Of note, none of these genes were associated with incident AF, suggesting that different signalling pathways are responsible for AF onset and maintenance.

MicroRNAs (miRNAs) are a class of short non-coding RNAs that regulate mRNA expression. They increasingly have been recognized as potential biomarkers for cardiovascular disease, in part, due to their stability in peripheral circulation.<sup>91,92</sup> Dawson *et al.*<sup>93</sup> reported MiR-29 was a potential biomarker for AF. Liu *et al.*<sup>94</sup> studied the association of plasma miRNAs with AF in a Chinese hospital-based cohort. Compared to referents, the expression of miRNA-150 was significantly downregulated in paroxysmal AF and persistent AF patients. MiRNA-150 is involved in the regulation of cardiac fibrosis and cellular proliferation in myocardial infarction and heart failure.<sup>95</sup> McManus et al.<sup>96</sup> performed another study that included 153 prevalent AF cases, 107 incident AF cases, and 2185 referents from the Framingham Heart Study. The only miRNA associated with prevalent AF was miRNA-328. MiRNA-328 is known as an important gene regulator secreted by cardiomyocytes under stress.<sup>97</sup> In an experimental model, the expression of miRNA-328 was upregulated in the left atrial samples in animals with AF.<sup>98</sup> As some circulating miRNAs are platelet-derived, anti-platelet medications might directly affect miRNA levels, and thus be important for AF patients with concurrent cardiovascular or cerebrovascular diseases with indication for antiplatelet treatment.<sup>99</sup> The major part of miRNAs in plasma is localized in microparticles and originates in up to 45% from platelets.<sup>100</sup> Furthermore, previous studies indicated an association between altered expression of miR-146b and the P38MAPK/COX-2 pathway, making a causal relationship between antiplatelet medication and Cox inhibition possible.<sup>101</sup>

In another study based on clinical samples, McManus et al.<sup>102</sup> observed that circulating plasma expression of miRNA-21 and miRNA-150 were significantly associated with AF. Patients with persistent AF had lower miRNA-21 expression compared with paroxysmal AF, suggesting that higher AF burden could affect plasma miRNA expression. The miRNA-21 expression in the right atrium was down-regulated in patients undergoing cardiovascular surgery. In addition, a three-fold increase of miRNA-21 and miRNA-150 was observed after rhythm restoration in patients undergoing AF catheter ablation, suggesting significant dynamic changes after sinus rhythm restoration. Despite a relatively small study sample, this was the first study describing a strong association between circulating and tissue miRNAs linked to AF and significant improvement of miRNA levels after sinus rhythm restoration.<sup>102</sup>

#### 2.4 Proteomics

Proteomics refers to simultaneous screening of large numbers of proteins as potential biomarkers for different diseases. Lind et al.<sup>103</sup> used a custom-made proteomics chip to profile plasma proteins in participants from the Swedish study. Among the 92 screened proteins, 7 were significantly associated with incident AF after adjustment for age and sex. Two proteins, IL-6 and NT-proBNP, remained significant after adjusting for additional AF risk factors.<sup>103</sup> Willeit et al.<sup>104</sup> performed another proteomic study based on 880 participants from the Bruneck Study who were free of AF at the baseline. One hundred and seventeen participants developed AF during 20-year follow-up. Among the 13 inflammation markers measured at the baseline, sVCAM-1 was found to associate with incident AF after adjusting for age and sex. Ko et al.<sup>105</sup> screened 1373 proteins by using the SOMAScan assay in the Framingham Heart Study and identified eight proteins associated with incident AF. Two of them, NT-proBNP and ADAMTS13 remained significant after adjusting for known risk factors for AF. NT-proBNP is a marker of myocardial stress and ventricular remodelling known to be associated with AF.<sup>106</sup> ADAMTS13 is a protease of von Willebrand factor involved in left atrial remodelling,<sup>107</sup> and it has been used as a biomarker of rhythm outcomes after cardioversion.<sup>108</sup> In a recent study, Staerk et al.<sup>109</sup> tested the association of 85 proteins with incident AF, which were measured using the Luminex xMAP platform. Higher levels of NT-proBNP and insulin-like growth factor-binding protein 1 as well as lower levels of insulin-like growth factor 1 were associated with increased risk of incident AF after adjusting for AF risk factors.

#### Table I Genomics association studies of AF

Study	Population	Genes	Top variants
Gudbjartsson et al. <sup>46</sup>	lceland	PITX2	rs2200733
	AF n = 2.251		rs10033464
	No AF n = 13.238		
	UK/US European ancestry		
	AF n = 779		
	No AF $n = 1.542$		
	Chinese cohort		
	AF n = 333		
	No AF $n = 2.836$		
enjamin et al. <sup>52</sup>	European ancestry	MTHFR	rs17375901
enjamin et ut.	Prevalent AF $n = 896$	PITX2	rs17042171
	Referents $n = 15.768$	ZFHX3	rs2106261
	Incident AF $n = 2.517$	ZHINS	132100201
	Referents $n = 21.337$		
	Replication in German AFNET AF n = 2.145		
llinor et al. <sup>54</sup>	Referents $n = 4.073$		((()))
llinor et al.	European ancestry	KCNN3-PMVK	rs6666258
	AF n = 6.707	PRRX1	rs3903239
	Referents $n = 52.426$	PITX2	rs6817105
	Replication	WNT8A	rs2040862
	AF n = 5.381	CAV1	rs3807989
	Referents $n = 10.030$	C9orf3	rs10821415
	Japanese cohort	SYNPO2L	rs10824026
	AF n = 843	SYNE2	rs1152591
	Prevalent AF $n = 3.350$	HCN4	rs7164883
_		ZFHX3	rs2106261
ubitz et al. <sup>47</sup>	European ancestry <i>n</i> = 64 683	KCNN3-PMVK	rs6666258
	Prevalent AF $n = 3.302$	PRRX1	rs3903239
	Incident AF $n = 3.869$	PITX2	rs1448818
	Japanese cohort <i>n</i> = 11 309	PITX2	rs6817105
	Prevalent AF <i>n</i> = 7916	PITX2	rs4400058
		PITX2	rs6838973
		CAV1	rs3807989
		C9orf3	rs10821415
		SYNPO2L	rs10824026
		SYNE2	rs1152591
		HCN4	rs7164883
		ZFHX3	rs2106261
inner et al. <sup>55</sup>	European ancestry	NEURL	rs12415501
	No AF $n = 52.426$	TBX5	rs10507248
	AF n = 6.707	CAND2	rs4642101
	Replication	GJA1	rs13216675
	, No AF <i>n</i> = 17.144	NEURL	rs6584555
	AF n = 6.691	CUX2	rs6490029
	Japanese cohort		
	No AF n = 3.350		
	AF n = 843		
	Replication		
	No AF $n = 17.190$		
	AF n = 7.530		
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Christophersen et al. <sup>56</sup>	Multi-ancestry cohort GWAS		rs72700118 rs3771537

Study	Population	Genes	Top variants
	AF n = 17 931		rs2540949
	No AF <i>n</i> = 115 142		rs2288327
	ExWAS and RVAS		rs337711
	AF n = 22 346		rs2967791
	No AF <i>n</i> = 132 086		rs4946333
			rs7508
			rs35176054
			rs75190942
			rs6800541
			rs89107
			rs11047543
Low et al. <sup>140</sup>	Japanese cohort	KCND3	rs12044963
	AF n = 8180	PPFIA4	rs17461925
	Controls <i>n</i> = 28 612	SLC1A4–CEP68	rs2540953
	Replication cohort:	HAND2	rs17059534
	AF n = 3120	HAND2	rs7698692
	Controls <i>n</i> = 125 064	NEBL	rs2296610
		SH3PXD2A	rs2047036
Lee et al. <sup>141</sup>	Korean cohort	PRRX1	rs3903239
	AF n = 672	PITX2	rs6817105
	Controls $n = 3700$	NEURL1	rs6584555
	Replication study	TBX5	rs10507248
	AF <i>n</i> = 200	ZFHX3	rs2106261
	Controls $n = 1812$		
Roselli et al. <sup>57</sup>	Multi-ancestry cohort		67 novel loci
	AF n = 22 346		
	No AF <i>n</i> = 132 086		
Nielsen et al. <sup>58</sup>	European ancestry		63 novel loci
	AF <i>n</i> = 60 620		
	No AF n = 970 216		
Choi et al. <sup>69</sup>	Lone AF <i>n</i> = 2781	TTN	OR (95% CI), <i>P</i> value
	No AF <i>n</i> = 4959		2.16 (1.34–3.48); 1.55×10 <sup>-3</sup>

GWAS, genome-wide association study; ExWAS, exome-wide association study; RVAS, rare variant association study.

#### **2.5 Metabolomics**

Metabolomics are studies to perform systematic analyses of metabolites with diseases. Mayr et al.<sup>110</sup> observed patients with persistent AF had elevated ketone body metabolism in the atria. De Souza et al.<sup>111</sup> reported increased metabolic stress was associated with impaired energy utilization and increased ketoacid metabolism in a canine AF model. Alonso et al. performed the metabolomics profiling of blood samples from  $\sim$ 1900 African American participants in the Atherosclerosis Risk in Communities (ARIC) study.<sup>112</sup> The participants were followed over 20 years. Two bile acids (glycolithocholate sulfate and glycocholenate sulfate) were significantly associated with incident AF, suggesting a connection between liver function and AF, in agreement with previous studies.<sup>113,114</sup> Potential arrhythmogenic effects of bile acids had been reported in humans,<sup>115</sup> and elevated maternal bile acid levels during pregnancy were associated with cardiac arrhythmias in fetuses.<sup>116</sup> In another study, Ko et al.<sup>117</sup> analyzed liquid chromatography-tandem mass spectrometry metabolomics profiles in over 2000 individuals of European ancestry from the Framingham Heart Study; they did not

reveal metabolites significantly associated with incident AF. In addition, neither bile acids identified in the ARIC study were replicated, possibly due to different ancestries, tissue types, or metabolic profiling platforms.<sup>118</sup>

# 3. Tissue consideration for multiomics

Unlike genetic profiles, other omics profiles, such as transcriptomic and epigenomic profiles, can change from one tissue to another. The most relevant tissue for AF is the left atrium. However, it is not feasible to perform invasive specimen collection on a large scale, especially in community-based cohorts. Most multiomics studies have measured molecular profiles from blood samples, which may be different from the heart samples. Furthermore, the left and right atria can have quite distinct expression patterns for some genes, resulting in different structure and function between these two chambers.<sup>119,120</sup>

#### Table 2 Multiomics association studies of AF

Omics	Study	Population	Tissue type	Platform	Significant signatures
Epigenomics— Methylation	Lin et al. <sup>76</sup>	European ancestry FHS Offspring cohort n = 2639 Prevalent AF $n = 183$ Incident AF $n = 220$ Follow-up 9 years.	Whole blood	lllumina Infinium Human Methylation 450 BeadChip	Prevalent AF cg13639451 cg07191189 Incident AF cg26602477 cg15440392 cg04064828 cg27529934 cg06725760
Transcriptomics— mRNA expression	Lin et al. <sup>85</sup>	European ancestry FHS Offspring cohort n = 2446 Prevalent AF $n = 177$ Incident AF $n = 143$ No AF $n = 2126$ Follow-up 7 years.	Whole blood	Affymetrix Human Exon 1.0ST Array	Prevalent AF PBX1 C17orf39 PNP C18orf10 SLC7A1 SPTB ANKH
Transcriptomics— MicroRNA expression	Liu et al. <sup>94</sup>	Chinese ancestry 5 healthy controls, 5 patients with parox- ysmal atrial fibrillation (PAF) alone, and 5 patients with persis- tent atrial fibrillation (PersAF)	Plasma	MirVana PARIS kit (Invitrogen) and mas- sively parallel signa- ture sequencing	16 miRNAs for PAF and 11 miRNAs for PersAF
Transcriptomics— MicroRNA expression	McManus et al. <sup>96</sup>	European ancestry FHS offspring cohort n = 2445 Prevalent AF n = 153 Incident AF n = 107 Follow-up 5.4 years	Whole blood	TaqMan (PAXgene, Applied Biosystems)	Prevalent AF miR-328
Transcriptomics— MicroRNA expression	McManus <i>et al</i> . <sup>102</sup>	AF $n = 112$ European ancestry n = 108 No AF $n = 99$ European ancestry n = 67	Right atrial tissue Plasma	Quantitative reverse transcriptase–poly- merase chain reaction Qiagen (Valencia, CA) miScriptAssays BioMark System (Fluidigm)	miRs-21 miRs-150
Proteomics	Lind et al. <sup>103</sup>	European ancestry PIVUS study No AF n = 830 AF n = 148 Follow-up 10.0 years European ancestry ULSAM study No AF N = 602 Incident AF = 123 Follow-up 7.9 years	Plasma	A proximity extension assay (PEA) chip	IL-6 NT-proBNP
Proteomics	Willeit <i>et al</i> . <sup>104</sup>	European ancestry No AF $n = 763$ AF $n = 117$ Follow-up 20 years	Venous blood	A commercially available enzyme-linked immu- nosorbent assay kit (Bender MedSystems)	sVCAM-1

Continued

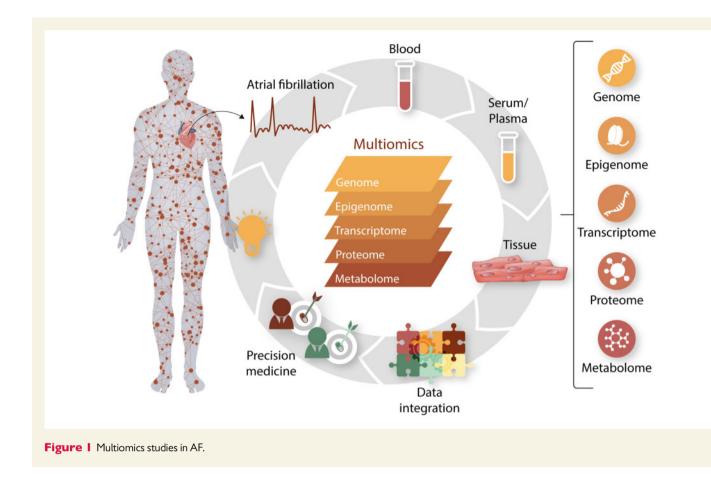
Omics	Study	Population	Tissue type	Platform	Significant signatures
Proteomics	Ko et al. <sup>105</sup>	European ancestry FHS Offspring cohort <i>n</i> = 1885 Incident AF <i>n</i> = 349 Follow-up 18.3 years.	Citrate-plasma	SOMAscan proteomic profiling platform	Analyzed plasma pro- teins (n = 1373) NCAM-120 WFIKKN2 Ntrk3 EGFR ADAMTS13 Angiopoietin-2 NT-proBNP BMPR1A
Proteomics	Staerk et al. <sup>109</sup>	European ancestry FHS Offspring and Third Generation cohorts (n = 3378) Incident AF n = 401 Follow-up 12.3 years.	Plasma	Luminex xMAP platform	Analyzed plasma pro- teins (n = 85) IGF1 IGFBP1 NT-proBNP
Metabolomics	Alonso <i>et al.</i> <sup>112</sup>	African ancestry ARIC study ( <i>n</i> = 1919) Incident AF <i>n</i> = 183 Follow-up 22 years.	Serum	Untargeted, gas chroma- tography/mass spec- trometry and liquid chromatography/mass spectrometry-based metabolomic quantifi- cation (Metabolon, lnc)	Bile acids glycolithocho- late sulfate and glyco- cholenate sulfate
Metabolomics	Ko <i>et al.</i> <sup>117</sup>	European ancestry FHS Offspring ( <i>n</i> = 2458) Incident AF <i>n</i> = 156 Follow-up 10 years.	Plasma	Targeted liquid chroma- tography-tandem mass spectrometry (AB SCIEX 4000 QTRAP triple quadru- pole mass spectrome- ter for positively charged polar com- pounds and lipids) and an AB SCIEX 5500 QTRAP triple quadru- pole mass spectrome- ter for negatively charged polar compounds	Analyzed 217 metabo- lites (54 positively charged, 59 nega- tively charged, 104 lipids) None

IGF1, insulin-like growth factor 1; IGFBP1, insulin-like growth factor-binding protein 1; NT-proBNP, N-terminal prohormone of brain natriuretic peptide.

One useful resource is the Genotype-Tissue Expression (GTEx) project, which quantified gene expression across 54 tissue types collected from 948 donors.<sup>121</sup> Computational methods, such as PrediXcan,<sup>122</sup> MetaXcan,<sup>123</sup> RIVER,<sup>124</sup> and ExPecto,<sup>125</sup> are being developed to predict tissue-specific transcription profiles from genetic variants. For example, Roselli *et al.*<sup>57</sup> performed a transcriptome-wide association study of AF using MetaXcan based on the GWAS summary association statistics. The pre-computed models were generated from the left and right atria from the GTEx project.<sup>121</sup> The models predicted expression of 57 genes associated with AF, 42 of which were located in a single AF GWAS loci.

### 4. Data integration

As multiomics data become increasingly available, future studies might integrate different omics to obtain a more comprehensive picture of AF pathogenesis. Quantitative trait loci (QTL) analyses study the associations between genetic variants and other omics data.<sup>81</sup> One study investigated the association between genetic variants and gene expression in the left and right atria.<sup>126</sup> It identified 187 eQTLs from 53 left atrial samples and 259 eQTLs from 52 right atrial samples. Many of the eQTLs were shared between the left and right atrial samples, including rs3740293, which was one of the top AF-related variants. The SNP is



located at the 3'-UTR of SYNPO2L, about 5 kb upstream of MYOZ1. It was significantly associated with the expression of MYOZ1 in both left and right atria, but not SYNPO2L, suggesting that the functional gene at this locus is likely to be MYOZ1 instead of SYNPO2L.<sup>126</sup> The association was further validated using 70 additional samples collected from patients at Massachusetts General Hospital. In another study, the mQTL analyses were performed to investigate the association of AF-related variants with nearby DNA methylation.<sup>76</sup> The most significant association was observed between rs6490029 at the *CUX2* locus and cg10833066. The methylation of cg10833066 increased with increasing copies of the 'A' allele of rs6490029, which also was associated with higher AF risk as found in the previous GWAS.<sup>54</sup> Further studies are needed to validate these results and apply QTL mapping to other AF-related electrophysiological traits like PR and RR intervals.<sup>127,128</sup>

Another approach to data integration is to perform multiomics modelling, which integrates the results from different omics association studies. Wang *et al.*<sup>129</sup> recently developed a strategy to integrate the GWAS, the epigenome-wide association study, and the transcriptome-wide association study results for AF. The summary statistics from different omics data were meta-analyzed and weighted by the sample size of each omics data type. A tissue-specific network was then built<sup>130</sup> and used to predict potential AF-related genes, which increased the proportion of heritability from 3.5% (by GWAS alone) to 10.4%. Importantly, a few potential drug targets were identified, including *ADORA1, ATP1A3, ATP1B2, CACNA1D, KCNQ4, NR3C2*, and *THRA*. Similarly, van Ouwerkerk *et al.*<sup>131</sup> developed another approach to prioritize potentially functional variants by integrating transcriptomic and epigenomic data together with chromatin conformation information. A list of potentially target genes

was identified from AF-associated variants, which could be further investigated for future studies.

## 5. Future directions

The summary of omics findings related to AF is presented in *Tables 1* and 2 and *Figure 1*. Despite the success of omics study in AF, several aspects are important to consider for future studies.

- First, current omics studies have been based mostly on samples collected at a single examination, whereas longitudinal omics profiling is still very scarce. It is challenging to investigate the effects of longitudinal changes in omics profiles on AF pathogenesis since omics platforms and profiles change over time. In addition, the relationship between AF and omics profiles could be bidirectional and the causal effects remain unclear.<sup>132</sup> Therefore, longitudinal omics methods should be added to the future investigation of AF pathogenesis.
- Second, it would be valuable to explore the association of additional types of omics with AF, such as in samples collected from the gut microbiome,<sup>133</sup> urine,<sup>134</sup> saliva,<sup>135</sup> and right and left atrial and left pulmonary vein tissues. These omics data might identify additional molecular signatures and biomarkers for AF. Given the limited availability of heart samples, the use of induced pluripotent stem (iPS) cells to derive heart tissue from fibroblasts or even peripheral blood cells may greatly expand research capabilities.<sup>136,137</sup>
- Third, further development of data integration methodology is needed to combine different omics data to better understand the pathophysiologic pathways of AF. Such efforts would be important to the risk stratification and the identification of novel therapeutic targets for AF.<sup>138,139</sup>

- Fourth, further clinical and observational studies are needed to define whether multiomics profiles are different in individuals with AF dependent on disease burden. As hundreds of potential biomarkers of AF have been reported in various studies, additional scrutiny will be necessary to understand any potential bias of omic biomarkers for risk profiling. Almost all studies were adjusted for age and sex; however, many studies did not take into account known clinical risk factors that might confound the results. In addition, some biomarkers reached only lenient significance; the associations will no longer be significant after adjusting for multiple testing.
- Fifth, the mechanisms relating biomarkers are uncertain. Are they directly related, confounders, related via intermediate mechanisms, or merely spurious associations yet to be determined? In addition, even if the associations are replicated, it remains uncertain how the biomarkers are involved in the pathogenesis of AF.
- Sixth, most of the existing omics studies were based on participants of European ancestry from Western Europe and North America; generalizability of these findings to other ancestries and regions is largely unknown. Therefore, it is imperative to include participants from diverse ancestries/ethnicities and regions for future omics studies, such as African American, Asian, Hispanic, and Indigenous individuals.<sup>94,112,140,141</sup>
- Finally, from clinical perspective, the incorporation of omics profiling into clinical routine is yet to come. The risk prediction of AF using omics is limited mostly to genomics information, whereas omics information has not been used to improve prediction beyond clinical score. In addition, very few studies have analyzed C-statistics and reclassification metrics of predictive value after adjustment for biomarkers or genetic risk (Supplementary material online, *Table S2*). Most of them showed only modest improvement of predictive value.<sup>142–147</sup> Future studies are needed to analyze risk prediction and to identify effect sizes, population attributable risks, and risk reclassification using different omics profiles.

In summary, the past decade has witnessed enormous progress in the multiomics study of AF, which has identified hundreds of potential biomarkers or targets for future investigations. Recent efforts paved the way towards more advanced analyses elucidating pathophysiological complexity of AF underlying processes. The next studies are needed to highlight not separate biomarkers based on genomic, proteomic, or metabolomics studies, but rather using a multiomics approach in diverse multiracial populations.

## Supplementary material

Supplementary material is available at Cardiovascular Research online.

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