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RESEARCH ARTICLE OPEN ACCESS

## Exploring the Genetic Association Between Connective Tissue Diseases and the Risk of Pulmonary Arterial Hypertension: A Mendelian Randomization Analysis

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Received: 16 September 2024 | Revised: 8 December 2024 | Accepted: 13 December 2024

Funding: The authors received no specific funding for this work.

Keywords: FinnGen | genetic association study | systemic lupus erythematosus | systemic sclerosis

### ABSTRACT

This study aimed to explore the potential causal link between genetic predisposition to various connective tissue diseases (CTDs), namely systemic lupus erythematosus (SLE), Sjögren's syndrome (SS), polymyositis (PM), dermatomyositis (DM), systemic sclerosis (SSc), mixed connective tissue disease (MCTD), and rheumatoid arthritis (RA), and the incidence of pulmonary arterial hypertension (PAH) utilizing Mendelian randomization (MR). Employing a two-sample MR approach, genetic variants associated with CTDs served as instrumental variables to investigate the exposure-outcome relationship, with GWAS data sourced from the FinnGen Biobank. Comprehensive statistical analyses, including the inverse variance weighted (IVW) method, were conducted, alongside heterogeneity, pleiotropy, and sensitivity tests to ensure the robustness and validity of findings. The results revealed that in the Finnish population, no significant causal associations were identified between PAH and SLE, SS, PM, DM, MCTD, or RA. Notably, a significant association was observed between SSc and an increased risk of PAH (IVW: OR = 1.278, 95% CI = 1.061–1.540, p = 0.010). However, this finding was not replicated in other European populations. These results indicate the unique genetic and pathological pathways underlying SSc-associated PAH, emphasizing the need for tailored screening and management protocols in this patient group.

### 1 | Introduction

Pulmonary hypertension (PH) is a severe and progressive disease characterized by elevated pulmonary arterial pressure and pulmonary vascular resistance, leading to right heart failure and ultimately death if untreated. PH is defined hemodynamically as a mean pulmonary arterial pressure > 20 mmHg at rest, as assessed by right heart catheterization (RHC). The disease is classified into five groups based on similar clinical presentation, pathological findings, hemodynamic characteristics, and treatment strategy, with pulmonary arterial hypertension (PAH) categorized under Group 1 PH [1]. PAH can develop as a secondary condition to numerous underlying diseases, with connective tissue diseases (CTDs) being responsible for 15%–25% of these cases [2]. CTDs represent a heterogeneous group of systemic autoimmune disorders characterized by immune system dysfunction and the subsequent production of disease-specific autoantibodies [3]. These conditions include systemic lupus erythematosus (SLE), Sjögren's syndrome (SS), polymyositis (PM), dermatomyositis (DM), systemic sclerosis (SSc), mixed connective tissue disease (MCTD), and rheumatoid arthritis (RA), which exhibit a wide range of systemic manifestations and their association with PAH has been a significant focus of research.

Prior observational studies indicated that the prevalence of PAH varied among different CTDs and was influenced by geographic regions and populations. PAH is particularly common in SSc

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and MCTD, but relatively rare in other CTDs [4]. SSc predominantly accounts for 60% to 75% of CTD-associated PAH (CTD-PAH) cases in Europe and North America [5, 6]. In contrast, SSc constitutes only 6%-22% of CTD-PAH cases in Asia, where SLE is more prevalent [7]. In Japan, MCTD is the leading cause of CTD- PAH at 43%, followed by SLE at 29% [8]. Among patients with SS, PAH incidence is low in Western countries but notably higher in Asia, such as 10% in Japan [8] and 15% in Chinese cohorts [7, 9]. Conversely, RA shows a PAH incidence similar to that of the general population (approximately 0.35%) [10], and PAH associated with idiopathic inflammatory myopathies is exceedingly rare [11]. These studies indicated significant heterogeneity and potential confounding factors affecting the observed associations. Such inconsistencies underscore the need for rigorous methodological approaches and larger, well-controlled studies to elucidate the true nature of these relationships.

The mechanisms underlying the observed associations between CTDs and PAH remain incompletely understood. Proposed explanations range from autoimmune-mediated endothelial dysfunction to shared genetic susceptibilities influencing both CTD development and pulmonary vascular remodeling [4, 12, 13]. The predominant mechanism of SLE-associated PAH (SLE-PAH) involves the proliferation of endothelial and smooth muscle cells, fibrinoid necrosis due to vasculitis, and the deposition of immunoglobulins and complement components in the intimal and medial layers of the pulmonary vessels [14]. In contrast, endothelial dysfunction, vasculopathy, and increased vascular stiffness of small and mid-size vessels are hallmarks of SSc-related PAH [15]. Furthermore, genetic studies have identified potential genetic risk factors that may predispose individuals with certain CTDs to develop PAH. For example, studies have identified genetic variants associated with both SSc and PAH, suggesting overlapping genetic susceptibility loci that could influence disease susceptibility and progression [15]. These findings highlight the importance of integrating genetic data into epidemiological studies to better understand the underlying genetic architecture and pathways linking CTDs to PAH.

Clinical observational studies often grapple with the challenges of potential confounders and reverse causation, which complicates the elucidation of causal relationships between CTDs and PAH. However, a methodological approach known as Mendelian randomization (MR)—also referred to as "nature's randomized controlled trial"—offers a compelling solution [16]. As a robust statistical tool in epidemiology and genetics, MR harnesses genetic variants as instrumental variables (IVs) to estimate the causal effect of exposures on outcomes. The strength of MR lies in the random allocation of genetic variants at conception, rendering it typically more resistant to confounding and reverse causation than traditional observational designs [17]. The efficacy of MR has been demonstrated in its successful application to discern causal relationships between various diseases, such as systemic lupus erythematosus (SLE) and autoimmune liver diseases [18], RA and bronchiectasis [19], and depression and PAH [20]. Therefore, in this study, we employed a two-sample MR approach to investigate the causal relationship between genetic predisposition to CTDs and the incidence of PAH.

## 2 | Methods

## 2.1 | Study Design

We carried out a two-sample MR investigation, with CTDs as the exposure and PAH as the outcome (Figure 1). This study followed the latest STROBE-MR guidelines for conducting MR research [16]. The validity of MR study is dependent on three essential assumptions [21]: (1) The IVs exhibit a robust correlation with the exposure; (2) Each IV does not have any association with confounding factors; (3) Each IV is linked to the outcome exclusively via the exposure, and no other routes exist for this association.

## 2.2 | Genome-Wide Association Studies (GWAS) Data Sources

The data sets for the primary MR analyses were obtained from the publicly accessible FinnGen Biobank. The FinnGen study is a large-scale genomics initiative that has analyzed over 500,000 Finnish biobank samples and correlated genetic variation with health data to understand disease mechanisms and predispositions. Summary statistics for SLE, SS, PM, DM, SSc, MCTD, RA, and PAH were obtained from their respective data sets, and all patients and controls were of the Finnish population. The descriptive details of the data used in our study are presented in Table 1. Given that SSc-associated PAH (SSc-PAH) accounts for the majority of CTD-PAH in European populations [5], we



FIGURE 1 | Study design of the Mendelian randomization (MR) analysis. SNPs, single nucleotide polymorphisms.

 TABLE 1
 Descriptive details of the data source of CTDs and PAH.

Phenotype	Cases	Controls	Sample size	Population	Data set
SLE	1083	306,504	307,587	European	finngen_R10_SLE_FG
SS	2735	399,355	402,090	European	finn-b-M13_SJOGREN
PM	244	399,355	399,599	European	finngen_R10_M13_POLYMYO
DM	405	285,035	285,440	European	finngen_R10_DERMATOPOLY_FG
SSc	680	399,355	400,035	European	finngen_R10_M13_SYSTSLCE
MCTD	2005	410,176	412,181	European	finngen_R10_M13_MCTD
RA	13,621	262,844	276,465	European	finngen_R10_M13_RHEUMA
PAH	248	289,117	289,365	European	R10_I9_HYPTENSPUL

Abbreviations: CTDs, connective tissue diseases; DM, dermatomyositis; MCTD, mixed connective tissue disease; PAH, pulmonary arterial hypertension; PM, polymyositis; RA, rheumatoid arthritis; SLE, systemic lupus erythematosus; SS, Sjögren's syndrome; SSc, systemic sclerosis.

performed additional MR analyses using GWAS data from other European cohorts. These included two GWAS data sets for SSc and one for PAH (Supporting Information: Table S1), aimed at validating the observed associations.

### 2.3 | IV Selection

To meet the initial hypothesis of MR analysis, which suggests that the IVs are strongly linked to CTDs, we first performed association analysis and selected single nucleotide polymorphisms (SNPs) that demonstrated a statistically significant correlation with each CTD at the genome-wide level  $(p < 5 \times 10^{-8})$ . To ensure the independence of the selected IVs and minimize selection bias, we proceeded with a linkage disequilibrium (LD) analysis. To obtain an optimal number of IVs, we chose a genetic distance threshold of 5000 kB and a  $r^2$  range of 0.001-0.1 (Supporting Information: Table S2). To circumvent potential confounding influences from genetic variations, the secondary phenotype of each SNP was evaluated using the PhenoScanner database with a *p*-value cutoff of  $p < 1 \times 10^{-5}$ . SNPs associated with confounders were eliminated to reduce pleiotropic effects. SNPs with palindromic sequences were likewise excluded. Additionally, we confirmed that the F statistic of all IVs exceeded the threshold of 10 to minimize weak instrument bias. The F statistic was calculated using the equation  $F = R^2(N - K - 1)/K(1 - R^2)$ , where  $R^2$  represents the proportion of variance in the exposure that is explained by the IVs, and N represents the sample size of the exposure data set [22].

### 2.4 | Statistical Analysis

To ensure the reliability and validity of our findings, a variety of robust statistical methods were utilized, including the inverse variance weighted (IVW) method under a random-effect model, the weighted median approach, the MR-Egger regression, the simple mode and weighted mode [19]. The IVW method, used as the primary analysis for causal estimates, was most precise when all IVs are valid [23]. Additionally, we performed sensitivity analyses to assess the dependability of our findings. The MR-Egger intercept was used to determine directional horizontal pleiotropy [24]. Subsequently, the Mendelian randomization pleiotropy residual sum and outlier (MR-PRESSO) test was applied to detect potential horizontal pleiotropy and correct it by removing outliers [25]. The Cochrane Q test was used to evaluate heterogeneity between SNPs [26]. Furthermore, the leave-one-out analysis was used to investigate whether the genetic causal relationship between exposures and outcomes was influenced by a single SNP. All statistical analyses were performed using the "TwoSampleMR" and "MRPRESSO" packages in R software (version 4.3.2).

### 3 | Results

## 3.1 | Characteristics of the Selected SNPs for IVs

When conducting the primary MR analysis using data from the Finnish population, we extracted SNPs that were significantly related to CTDs from the GWAS ( $p < 5 \times 10^{-8}$ ). To keep a balance between having enough IVs to ensure adequate statistical power and minimizing the inclusion of pleiotropic or weak instruments, we performed LD analysis with a genetic distance threshold of 5000 kB and a  $r^2$  range of 0.001–0.1 varying with specific CTDs. Subsequently, SNPs related to PAH were retrieved from the PhenoScanner database and no confounder was found. Furthermore, SNPs with palindromic sequences for each CTD were excluded respectively. Finally, 13 SNPs for SLE, 17 SNPs for SS, 11 SNPs for PM, 11 SNPs for DM, 8 SNPs for SSc, 22 SNPs for MCTD, and 26 SNPs for RA were selected as IVs and included in further analyses (Supporting Information: Tables S3–S9). Similarly, we obtained IVs for the two additional European SSc data sets using the same approach (Supporting Information: Tables S10-S11). No evidence of weak-tool bias was found in the IVs strength test (F-statistic > 10).

# 3.2 | Causal Estimates of Genetic Susceptibility to CTDs and PAH Risk

In the Finnish population, The MR results do not support a significant causal association between SLE, SS, PM, DM, MCTD, or RA and the risk of PAH, verified by all the five statistical methods, with IVW as the primary method in the absence of horizontal pleiotropy of IVs. The odds ratio (OR) of IVW analysis for SLE, SS, PM, DM, MCTD, and RA was 0.947 (95% confidence interval (CI) = 0.805-1.116, p = 0.517), 1.002

(95%CI = 0.836-1.203, p = 0.979), 0.902 (95%CI = 0.803-1.013, p = 0.081), 0.900 (95%CI = 0.767-1.056, p = 0.198), 1.156 (95% CI = 0.964-1.386, p = 0.118), and 0.921 (95%CI = 0.704-1.204, p = 0.545), respectively, demonstrating no statistically significant association between these CTDs and PAH. However, a significant association was found between SSc and increased risk of PAH (IVW: OR = 1.278, 95% CI = 1.061-1.540, p = 0.010) (Figure 2).

Interestingly, when separate MR analyses were performed using two additional European SSc data sets and another European PAH data set, no significant association between SSc and PAH was observed (Supporting Information: Figures S1–S2).

# 3.3 | Heterogeneity and Pleiotropy Tests and Sensitivity Analyses

In our primary MR analysis in the Finnish population, we conducted heterogeneity and pleiotropy tests to ensure the robustness of our causal inference. Cochran's Q test was performed to assess heterogeneity among the IVs. The test results showed no significant heterogeneity for all seven CTDs, indicating no heterogeneity between SNPs (Table 2). Additionally,

TABLE 2 | Heterogeneity tests of MR.

Phenotype	Method	Q-value	df	p-Value
SLE	Q MR Egger	8.472	11	0.670
	Q IVW	8.828	12	0.718
SS	Q MR Egger	15.682	15	0.403
	Q IVW	15.699	16	0.474
PM	Q MR Egger	6.010	8	0.646
	Q IVW	6.431	9	0.696
DM	Q MR Egger	13.849	9	0.128
	Q IVW	13.851	10	0.180
SSc	Q MR Egger	7.721	6	0.259
	Q IVW	7.725	7	0.358
MCTD	Q MR Egger	19.039	20	0.519
	Q IVW	21.137	21	0.451
RA	Q MR Egger	35.712	24	0.059
	Q IVW	35.809	25	0.075

Abbreviations: DM, dermatomyositis; IVW, inverse variance weighted; MCTD, mixed connective tissue disease; MR, Mendelian randomization; PM, polymyositis; Q, Cochran's Q test; RA, rheumatoid arthritis; SLE, systemic lupus erythematosus; SS, Sjögren's syndrome; SSc, systemic sclerosis.

Exposure	Sample size	nSNP	Method					OR (95%CI)	P-value
SLE	307587	13	MR Egger		_			0.822 (0.502, 1.347)	0.454
			Weighted median					0.945 (0.755, 1.182)	0.620
			Inverse variance weighted					0.947 (0.805, 1.116)	0.517
			Simple mode		_			0.956 (0.674, 1.357)	0.807
			Weighted mode		_			0.956 (0.688, 1.330)	0.796
SS	402090	17	MR Egger	-				0.972 (0.583, 1.622)	0.916
			Weighted median		-			0.949 (0.720, 1.251)	0.712
			Inverse variance weighted	+	-			1.002 (0.836, 1.203)	0.979
			Simple mode		_			0.908 (0.596, 1.381)	0.657
			Weighted mode					0.965 (0.712, 1.309)	0.823
PM	399599	11	MR Egger			-		1.069 (0.631, 1.810)	0.811
			Weighted median	+				0.983 (0.842, 1.149)	0.832
			Inverse variance weighted					0.902 (0.803, 1.013)	0.081
			Simple mode	÷	-			1.010 (0.776, 1.314)	0.943
			Weighted mode	+	_			1.016 (0.782, 1.320)	0.907
DM	285440	11	MR Egger		_	-		0.888 (0.418, 1.886)	0.765
			Weighted median	+	-			0.977 (0.809, 1.179)	0.807
			Inverse variance weighted	4				0.900 (0.767, 1.056)	0.198
			Simple mode		_			0.943 (0.686, 1.297)	0.727
			Weighted mode		-			0.951 (0.733, 1.235)	0.715
SSc	400035	8	MR Egger		•		_	1.307 (0.535, 3.194)	0.578
			Weighted median	÷	-			1.191 (0.943, 1.504)	0.143
			Inverse variance weighted	-	_			1.278 (1.061, 1.540)	0.010
			Simple mode	-+				1.007 (0.650, 1.562)	0.975
			Weighted mode	+	_			1.016 (0.703, 1.468)	0.934
MCTD	412181	23	MR Egger		_			0.743(0.397, 1.388)	0.362
			Weighted median	+	_			1.085(0.846, 1.393)	0.520
			Inverse variance weighted	÷	-			1.156(0.964, 1.386)	0.118
			Simple mode					1.062(0.689, 1.637)	0.789
			Weighted mode		_			1.082(0.755, 1.550)	0.672
RA	276465	26	MR Egger		_			0.878 (0.557, 1.384)	0.580
			Weighted median	-	_			1.018 (0.706, 1.469)	0.922
			Inverse variance weighted		-			0.921 (0.704, 1.204)	0.545
			Simple mode		-			0.668 (0.361, 1.235)	0.210
			Weighted mode		_			1.062 (0.713, 1.584)	0.769
			←	0.5 1		2	3		
			No	PAH	PAH				

**FIGURE 2** | MR estimates for association of CTDs and the risk of PAH. CTDs, connective tissue diseases; DM, dermatomyositis; MCTD, mixed connective tissue disease; MR, mendelian randomization; nSNP, number of SNPs; PAH, pulmonary arterial hypertension; PM, polymyositis; OR, odds ratio; RA, rheumatoid arthritis; SLE, systemic lupus erythematosus; SS, Sjögren's syndrome; SSc, systemic sclerosis.

TABLE 3   Horizontal	l pleiotropy	test of	MR
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Phenotype	Method	Intercept	SE	<i>p</i> -Value
SLE	MR-Egger regression	0.073	0.122	0.563
SS	MR-Egger regression	0.012	0.097	0.902
PM	MR-Egger regression	-0.117	0.181	0.535
DM	MR-Egger regression	0.008	0.214	0.973
SSc	MR-Egger regression	-0.009	0.186	0.961
MCTD	MR-Egger regression	0.118	0.082	0.163
RA	MR-Egger regression	0.012	0.048	0.800

Abbreviations: DM, dermatomyositis; MCTD, mixed connective tissue disease; MR, Mendelian randomization; PM, polymyositis; RA, rheumatoid arthritis; SE, standard error; SLE, systemic lupus erythematosus; SS, Sjögren's syndrome; SSc, systemic sclerosis.

MR-Egger regression analysis was used to evaluate the presence of horizontal pleiotropy. The intercept from the MR-Egger regression was not significantly different from zero for all CTDs, indicating no evidence of horizontal pleiotropy (Table 3). These findings support the validity of our MR analysis and suggest that the observed causal relationship is unlikely to be biased by pleiotropic effects.

The sensitivity analysis employed the leave-one-out method, sequentially removing each SNP and comparing the causal effects of the remaining SNPs with the results of the MR analysis that included all SNPs. This approach was used to identify whether any particular SNP disproportionately influences the overall causal estimate. The analysis for CTDs showed that the causal estimates remained relatively stable and consistent across all iterations of the leave-one-out analysis, indicating that the MR analysis results were robust (Supporting Information: Figures S3–S9).

## 4 | Discussion

To our knowledge, this study represents the first MR investigation into the relationship between CTDs and PAH. In the Finnish population, our results did not indicate significant causal associations between most CTDs and PAH, including SLE, SS, PM, DM, MCTD, and RA. However, the study demonstrated a significant association between SSc and an increased risk of PAH. Clinically, these findings emphasize the importance of focusing on SSc in PAH screening and management, while also advocating for further genetic research to uncover the underlying mechanisms.

SSc is a complex autoimmune condition marked by inflammation, excessive collagen accumulation, and fibrosis across multiple systems [27]. SSc-related PAH is a severe complication that occurs in 8% to 15% of SSc patients [28]. The pathogenesis of PAH in SSc involves complex interactions between endothelial dysfunction, smooth muscle proliferation, and immune-mediated inflammation [29]. Genetic predisposition plays a critical role in this multifactorial process. Multiple genes, including those in innate immunity (IRF5, IRF7, and TLR2), T and B cell activation (CD247, TNFAIP3, STAT4, and BLK), and the NF-kB pathway (TNFAIP3 and TNIP1), have been implicated in the pathogenesis of SSc through GWAS and exome sequencing [30]. However, most of these studies have not included enough patients complicated with PAH, thereby hindering

a definitive conclusion on whether the variants associated with the overall risk of the disease are also correlated with PAH. Despite the absence of a significant association between TGF- $\beta$  receptor polymorphisms and PAH in a cohort study of SSc-related PAH patients [31], certain genetic dispositions may still increase PAH susceptibility, including polymorphisms in MIF, TLR2, UPAR, KCNK5, and HLA-B35 [32]. Additionally, genes such as CSK, DDX6, DNA-SE1L3, and GSDMA/B may influence the vascular and fibrotic aspects of SSc [30], with some of these genes potentially contributing to the development of PAH in SSc patients. Understanding the genetic architecture of SSc-related PAH is crucial for developing novel targeted therapies based on the underlying genetic mechanisms.

Interestingly, when we performed two additional MR analyses using SSc data from two other European cohorts and PAH data from a separate European cohort, no significant association between SSc and PAH was found. We hypothesize that this discrepancy in results may be attributed to two factors. First, the study populations differ: the primary study focused on the Finnish population, whereas the additional study involved individuals from the United Kingdom (UK) and other Western countries. There may be genetic heterogeneity between some degree of these populations. Second, in the primary study, both the exposure and outcome data were derived from the Finnish population, while in the additional study, the exposure data were obtained from the UK population, and the outcome data were derived from a mixed population comprising individuals from the United States (US), France, Germany, the Netherlands, the UK, and Italy. This difference in population composition may have contributed to the variation in results. Therefore, further studies with larger sample sizes and more diverse populations are required to validate this finding.

Genetic studies on SLE have identified numerous susceptibility loci, including alleles associated with B cell responsiveness (e.g., BANK1, BLK, and PTPN22) and innate immune response (e.g., IRF5, STAT4, and TNFAIP3) [33]. Similarly, genetic risk factors for SS included both HLA loci (e.g., HLA-DQA1, HLA-DQB1, and HLA-DRA) and non-HLA loci (e.g., IRF5, STAT4, and IL12A) [34]. However, the genetic contribution of these risk alleles to PAH in SLE and SS appears limited. Certain genetic variants have been identified as risk factors for SLE and SS-related PAH [35, 36], while research findings on the genetic susceptibility to PAH related to MCTD, PM, DM, and RA are scarce. Despite the fact that CTDs including SLE, SS, PM, DM, MCTD, and RA may be complicated by PAH [2, 4], the current study suggests no significant genetic association between these CTDs and PAH. A possible explanation is that the genetic architecture of PAH may differ fundamentally from that of the CTDs studied. While shared genetic susceptibilities exist, their influence on PAH development might be overshadowed by other factors, such as environmental triggers, epigenetic modifications, chronic inflammation, and autoantibody presence. Besides, the polygenic nature of CTDs implies that multiple low-effect genetic variants collectively contribute to disease susceptibility, which may not be captured adequately in MR analyses focusing on individual loci. These findings highlight the complexity of CTDrelated PAH pathogenesis and the need for multifaceted research approaches. Future studies should integrate genetic, epigenetic, and environmental data to provide a comprehensive understanding of the mechanisms driving PAH in CTD patients.

Although MR is a robust method for inferring causality that reduces confounding and reverse causation, there are several limitations to this study. Firstly, the study's focus on genetic factors may overlook the contribution of nongenetic factors, such as environmental exposures and lifestyle choices, which play significant roles in CTD and PAH pathogenesis. Integrating these factors into future analyses could provide a more holistic understanding of the disease mechanisms. Secondly, the generalizability of the findings may be limited by the population studied. The analysis using GWAS data from Finnish and other European populations vielded inconsistent results, which may be attributed to the genetic characteristics of the Finnish population, which exhibits significant distinctions from other Europeans due to unique demographic history marked by genetic bottlenecks and population isolation [37, 38]. Furthermore, this study lacks data from Asian populations, which are particularly relevant for understanding associations such as that between SLE and PAH, as these associations may differ due to genetic and epidemiological variations. This limitation highlights the need for future studies to include more diverse cohorts to ensure broader applicability and relevance of the findings. Thirdly, the complexity of CTD-PAH pathogenesis suggests that single-locus MR analyses may not capture the full genetic architecture. Polygenic risk scores and pathway-based approaches could provide more comprehensive insights into the genetic underpinnings of these conditions.

In conclusion, this MR study, conducted primarily within Finnish population, revealed no significant causal association between several CTDs (SLE, SS, PM, DM, MCTD, and RA) and PAH risk, while SSc showed a significant association with an increased risk of PAH. These findings underscore the distinct genetic and pathogenic landscape of SSc-PAH and highlight the necessity for targeted screening and management strategies in this patient population. Comprehensive studies that integrate genetic, environmental, and lifestyle factors are crucial to fully understand the complex interplay driving PAH in CTD patients. Expanding research to include diverse populations will enhance the generalizability of the findings and contribute to the development of more effective, personalized treatment approaches for PAH in patients with CTDs.

### **Author Contributions**

Xiaoqin Wang conceptualized the study, analyzed the data, and wrote the original manuscript. Leilei Yang conceptualized the study and acquired the GWAS data. Bingjie Gu assisted in data acquisition and analysis. Dinglei Su conceptualized and supervised the study, reviewed the data analysis, wrote, and edited the manuscript. All authors read and approved the final manuscript.

### Acknowledgments

We want to acknowledge the participants and investigators of the FinnGen study.

### **Ethics Statement**

This study included human subjects gathered from prior investigations to present the extensive genome-wide association studies (GWAS). Ethical approval and informed consent of participants were obtained in all the respective original studies.

### **Conflicts of Interest**

The authors declare no conflicts of interest.

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#### **Supporting Information**

Additional supporting information can be found online in the Supporting Information section.