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## Circulating Markers of Inflammation and Angiogenesis and Clinical Outcomes Across Subtypes of Pulmonary Arterial Hypertension

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## Abstract

**Background:** Subtypes of pulmonary arterial hypertension (PAH) differ in both fundamental disease features and clinical outcomes. Angiogenesis and inflammation represent disease features that may differ across subtypes and are of special interest in connective tissue disease-associated PAH (CTD-PAH). We compared inflammatory and angiogenic biomarker profiles across different etiologies of PAH and related them to clinical outcomes.

**Methods:** Participants with idiopathic PAH, CTD-PAH, toxin-associated PAH (tox-PAH), or congenital heart disease-associated PAH (CHD-PAH) were enrolled into a prospective observational cohort. Baseline serum concentrations of 33 biomarkers were related to three-year mortality, echocardiogram, REVEAL score, and six-minute walk distance (6MWD). Findings were validated using plasma proteomic data from the UK PAH Cohort Study.

**Results:** 112 patients were enrolled: 45 idiopathic, 27 CTD-PAH, 20 tox-PAH, 20 CHD-PAH. Angiogenic and inflammatory biomarkers were distinctly elevated within the CTD-PAH cohort. Six biomarkers were associated with mortality within the entire PAH cohort: interleukin-6

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KH, PJL, and SGR designed the study, analyzed the data, and take full responsibility for the content of this manuscript. SN, DDR, WAA, and YZ contributed to study design and data interpretation. CJR, NWM, and MRW performed the analyses from the UK Cohort Study and contributed to data interpretation. All authors drafted and revised the manuscript.

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(IL-6, HR:1.6, 95% CI:1.18–2.18), soluble fms-like tyrosine kinase 1 (sFlt-1, HR:1.35, 95% CI:1.02–1.80), placental growth factor (PIGF, HR:1.55, 95% CI:1.07–2.25), interferon gamma-induced protein 10 (IP-10, HR:1.44, 95% CI:1.04–1.99), tumor necrosis factor-beta (TNF- $\beta$ , HR:1.81, 95% CI:1.11–2.95), and NT-proBNP (HR:2.19, 95% CI:1.52–3.14). Only IL-6 and NT-proBNP remained significant after controlling for multiple comparisons. IL-6, IP-10, and sFlt-1 significantly associated with mortality in CTD-PAH, but not non-CTD-PAH subgroups. In the UK cohort, IP-10, PIGF, TNF- $\beta$ , and NT-proBNP significantly associated with five-year survival.

**Conclusions:** Levels of angiogenic and inflammatory biomarkers are elevated in CTD-PAH, compared with other etiologies of PAH, and may correlate with clinical outcomes including mortality.

## Introduction:

Pulmonary arterial hypertension (PAH) is characterized by pulmonary vascular remodeling and leads to progressive right heart failure and ultimately death within a median of approximately six years from diagnosis.<sup>1</sup> PAH subtypes include, but are not limited to, idiopathic (IPAH), connective tissue disease-associated (CTD-PAH), toxin-associated (tox-PAH), and congenital heart disease-associated (CHD-PAH).<sup>2</sup> Patients across PAH subtypes differ in survival, symptom progression, and hemodynamics.<sup>3–7</sup> Variation between subtypes in fundamental features like vasodilator responsivity,<sup>3,8,9</sup> rates of bone morphogenic protein receptor type 2 (BMPR2) mutation,<sup>10–12</sup> and response to medical therapy<sup>8,9,13,14</sup> suggests that differences in outcomes may be driven by underlying pathophysiological divergence. Increasingly, the field has recognized the need for precision-medicine approaches to PAH.<sup>15,16</sup> Despite this recognition, personalized or subtype-specific medication strategies have yet to be developed, and guideline-based treatment algorithms do not distinguish by PAH subtype.<sup>17,18</sup> Treatment personalization is limited by our incomplete understanding of disease pathophysiology, and further obscured by disease heterogeneity both across and within subtypes.<sup>15,16,19</sup>

Peripheral serum biomarkers have emerged as a promising tool that offers the possibility of investigating disease heterogeneity at multiple levels and informing diagnosis and prognosis of PAH. Biomarkers of inflammation and angiogenesis are especially intriguing as they reflect likely mechanisms of disease which may be therapeutically targetable.<sup>20</sup> Specific inflammatory and angiogenic markers are elevated in PAH and variably predict patient outcomes<sup>21–26</sup>; however, few studies have compared biomarker concentrations across PAH subtypes and related them to clinical outcomes. Examining PAH patients in aggregate may obscure important signals within subtypes and delay recognition of separately targetable disease endotypes in PAH. Conversely, robust findings within one subtype may drive statistical significance in the aggregate group, leading to inappropriate application of therapy to all patients, including subgroups that may not benefit. These issues are critical for understanding PAH pathobiology and moving towards personalized medicine for individuals with PAH.

As such, the aim of this study was to evaluate the angiogenic and inflammatory biomarker profiles of patients across four PAH subtypes within a well-characterized prospective

observational cohort of patients with PAH. We hypothesized that these markers would systematically vary by PAH etiology and would have distinct relationships with mortality, echocardiographic findings, disease severity, and six-minute walk distance (6MWD).

## Methods:

## **Data Collection and Study Procedures**

Participants from the University of Washington pulmonary vascular disease clinic with an established diagnosis of PAH were enrolled in the Seattle Right Ventricle Translational Science (Servetus) cohort from April 2014 through May 2016. PAH diagnostic criteria were based on guidelines from the 5<sup>th</sup> World Symposium on Pulmonary Hypertension including a mean pulmonary artery pressure (mPAP) 25 mmHg, pulmonary capillary wedge pressure (PCWP) 15 mmHg, and pulmonary vascular resistance (PVR) > 3 Wood Units measured up to one year before study entry.<sup>27</sup> Participants with IPAH, tox-PAH, CTD-PAH, or CHD-PAH were included in this analysis. At enrollment, demographics were recorded, New York Heart Association (NYHA) functional class was assessed using a standardized decision aid, 6MWD was completed, and REVEAL 2.0 score was calculated.<sup>28</sup> Echocardiograms obtained up to six months before the index visit were read by one of two cardiologists using a standardized research protocol including measurement of RV basal diameter in diastole. Blood samples were collected on enrollment, processed, and frozen at  $-80^{\circ}$ C using a standardized protocol.<sup>29</sup> Samples were thawed only once for the current analysis and run in a single batch. An array of biomarkers was assayed using a Meso Scale Discovery multiplex immunoassay. N-terminal pro-brain natriuretic peptide (NT-proBNP) was measured for all participants and served as a "control" marker that was expected to correlate with clinical outcomes. Survival was monitored for 36 months from enrollment and included research questionnaires that were collected every four months. Vital status was available for all participants at study completion.

## Statistics

To compare biomarker levels across subtypes, biomarker concentrations were standardized by z-score by subtracting the sample mean and then dividing by SD. Biomarker concentrations across subtypes were compared using Kruskal–Wallis one-way analysis of variance with Dunn's comparison testing. Data was organized into a heatmap using GraphPad Prism (version 9.3.0 for Windows, GraphPad Software).

For relationships with mortality, biomarker levels were standardized within their own distribution by dividing each biomarker by the standard deviation (SD) for that marker. For each individual biomarker, separate Cox proportional hazards models were run to estimate relationships of a one-SD difference with the hazard of mortality over three years. Age, gender, and PAH etiology were considered in a fully adjusted model that was determined a priori. An additional exploratory model including NT-proBNP was performed to assess whether associations were independent of an established marker of severity. For biomarkers associated with mortality in the cohort at-large, analyses were repeated separately for each of the four subtypes of PAH. Linear regression estimated associations between a one-SD difference in biomarkers (exposure) and 6MWD (meters), right ventricular basal diameter

(RVD, mm), tricuspid annular plane systolic excursion (TAPSE, mm), or REVEAL score. Covariates included age, gender, height, weight, and PAH etiology. For mortality-associated biomarkers, Spearman's rank correlation coefficients were calculated.

A p-value 0.05 was defined as significant in the primary interpretation to avoid Type II error and a 'false negative' in this hypothesis-generating cohort. Primary analyses were complete case analyses of biomarkers with >90% capture. Given the possibility that "missing" biomarkers might represent biomarkers below the lower limit of detection, sensitivity analyses replaced "missing" biomarkers with a value equal to the lower limit of detection in the cohort. Statistical analysis and data illustration were performed with STATA 15.1 (StataCorp) and GraphPad Prism software.

#### Confidence in the results and external validation

Given that multiple biomarkers were tested, results in the Servetus cohort were also evaluated against a more restrictive false discovery rate (FDR) of 5% using a Benjamini-Hochberg procedure. In addition, for biomarkers associated with mortality in Servetus, a focused validation using the UK PAH Cohort Study was performed.<sup>30,31</sup> Proteomic data for 357 patients with idiopathic or heritable PAH was obtained on plasma samples, using an aptamer-based assay (SomaScan 4). For each significant biomarker in the Servetus cohort, Cox regression analyses corrected for age and sex, were used to validate or refute associations with all-cause five-year mortality or lung transplant in the UK Cohort.<sup>30</sup>

## **Results:**

## **PAH Patient Characteristics**

A total of 112 patients with pulmonary arterial hypertension (PAH) were included in this study (Table 1). The largest group was patients with IPAH. Nearly all tox-PAH participants were a result of methamphetamine use and most CTD-PAH patients had systemic sclerosis (70.4%). Age varied by subtype, with CTD-PAH participants being the oldest and CHD-PAH participants the youngest. Most patients were female (82% overall). While the majority of CTD-PAH, IPAH, and CHD-PAH patients were NYHA Functional Class I or II, a higher percentage of tox-PAH patients were functional class III. Mortality at 3-years was highest in CTD-PAH (33%) and lowest in IPAH (9%). Most patients were on PAH-directed therapy at the time of enrollment (Table 1).

#### **Biomarker Concentrations Across PAH Subtypes and Individual Patients**

Each biomarker was available for over 90% of patients; patient-level data for missing measurements is shown in the online supplement. Comparison of standardized concentrations for the 33 biomarkers across subtypes revealed a distinct CTD-PAH biomarker profile (Figure 1). Mean concentrations were highest in the CTD-PAH group in 25 out of 33 surveyed biomarkers. Overall, 13 biomarkers were significantly different across groups, and in all cases CTD-PAH was higher than one or more groups. These 13 biomarkers were: interleukin (IL)-7, IL-10, IL-12p40, tumor necrosis factor-alpha (TNF- $\alpha$ ), TNF- $\beta$ , interferon gamma-induced protein 10 (IP-10), monocyte chemoattractant protein-1 (MCP-1), and placental growth factor (PIGF) at p<0.01, and IL-17, serum amyloid A

(SAA), soluble intracellular adhesion molecule-1 (sICAM-1), soluble vascular cell adhesion marker (sVCAM-1), and vascular endothelial growth factor (VEGF) at p<0.05 (Figure 1). While CTD-PAH had the highest average age, biomarker levels did not increase with age within this subtype, and age did not appear to explain observed biomarker differences. Participant-level data for each biomarker was tabulated as a heatmap and showed higher levels of angiogenic and inflammatory biomarkers throughout the CTD-PAH cohort (Figure S1).

#### **Biomarkers Associated with Mortality in All PAH**

Biomarkers were investigated for their association with mortality in the full cohort of 112 enrolled PAH patients. Six of 33 biomarkers were associated with mortality: IL-6 (adjusted HR:1.6, 95%CI:1.18–2.18), IP-10 (adjusted HR:1.44, 95%CI:1.04–1.99), TNF- $\beta$  (adjusted HR:1.81, 95%CI:1.11–2.95), soluble fms-like tyrosine kinase 1 (sFLT-1, adjusted HR:1.55, 95%CI:1.07–2.25), PIGF (adjusted HR:1.55, 95%CI:1.07–2.25), and NT-proBNP (adjusted HR:2.19, 95%CI:1.05–1.99, (Figure 2). Exploratory models evaluated the association with mortality in individuals with otherwise similar levels of NT-proBNP at baseline. After accounting for differences in NT-proBNP, IP-10 was not independently associated with mortality. The relationships of the other biomarkers with mortality were qualitatively similar after adjustment by NT-proBNP, but were attenuated, and only TNF- $\beta$  remained statistically significant (HR:1.71, 95%CI:1.07–2.72; Figure S2). Sensitivity analysis performed by setting all missing biomarkers to the lowest detectable level did not influence the association with mortality. Accounting for multiple hypothesis testing using a threshold FDR < 5%, only IL-6 and NT-proBNP remained significant. Spearman testing did not suggest strong correlation among mortality-associated biomarkers (Figure S3).

#### Validation of Biomarker Associations with Mortality

Using data from the UK PAH Cohort Study (n=357), four of six proteins from the Servetus cohort were associated with worse adjusted five-year transplant-free survival: NT-proBNP (p<0.001), TNF- $\beta$  (p=0.009), IP-10 (p<0.001), and PIGF (p=0.05). IL-6 and sFLT-1 did not correlate with survival (Table S1).

#### Biomarker Association with Mortality by PAH Subtype

Having identified associations with mortality in the overall cohort and significantly different biomarker distribution in CTD-PAH compared to other subtypes, we performed subgroup analyses to determine if biomarker levels were differentially associated with mortality in CTD-PAH compared with non-CTD-PAH (pooled IPAH, tox-PAH, and CHD-PAH patients). There were similar numbers of deaths in the two groups with nine deaths among CTD-PAH participants and ten deaths among non-CTD PAH participants. Elevation of IL-6 (adjusted HR:1.71, 95% CI:1.12–2.62), IP-10 (adjusted HR:1.53, 95% CI:1.06–2.19), and sFlt-1 (adjusted HR:1.92, 95% CI:1.13–3.29) were associated with mortality in CTD-PAH, while associations did not reach significance in non-CTD-PAH but in many cases were qualitatively similar (Figure 3). NT-proBNP elevation was associated with mortality in both CTD-PAH (HR:2.97, 95% CI:1.45–6.06) and non-CTD-PAH (HR:1.88, 95% CI:1.20–2.96). Serum concentrations for three of the six biomarkers (IP-10, TNF- $\beta$ , and PIGF) were significantly different in CTD-PAH compared to the other subtypes (Figure S4).

## **Biomarker Association with Markers of Disease Severity**

For the six markers associated with mortality, linear regression was performed to evaluate associations with REVEAL risk score, right heart structure, right heart function, and exercise capacity. Increased IL-6, Flt-1, PIGF, IP-10, and NT-proBNP were associated with significant increases in REVEAL 2.0 score in the overall cohort of PAH patients (Figure 4). Elevated NT-proBNP was also associated with increased RVD (p<0.01), decreased TAPSE (p<0.01), and 6MWD (p<0.01). IL-6 was associated with increased RVD (p=0.02). When stratified into CTD-PAH and non-CTD-PAH, NT-proBNP continued to be associated with outcomes in both groups. Among those with CTD-PAH (but not those without), sFLT-1 was associated with REVEAL score and IP-10 and IL-6 with 6MWD. Among those with non-CTD-PAH, PIGF and IL-6 were associated with a worse REVEAL score (Table S2).

## **Discussion:**

In this single-center prospective cohort, we found that circulating levels of angiogenic and inflammatory cytokines were elevated in CTD-PAH, compared with three other subtypes of PAH. Significant heterogeneity in cytokine expression was observed at the level of both patient and subtype. Several biomarkers were associated with clinical outcomes, including mortality, and were validated using a second cohort. Interestingly, we identified distinct biomarker associations by subtype, such as those seen with sFLT-1 in CTD-PAH. Although large-scale proteomic analyses have made important recent contributions to understanding PAH, granular distinctions about protein levels and protein-outcome associations by PAH subtype are not yet well reported. This awareness has important implications for understanding heterogeneity in PAH.

Inflammation and angiogenesis are both involved in PAH pathogenesis, and prior studies have identified elevated circulating markers of inflammation and angiogenesis in PAH compared with control participants.<sup>25,26,32,33</sup> Our research extends these studies and identifies differential expression of inflammatory and angiogenic cytokines among individual subtypes of PAH. While there was significant heterogeneity among patients, even within PAH subtypes, we identified relatively consistent elevation of cytokines in the CTD-PAH group compared to the other groups. Indeed, all 13 biomarkers that were statistically different across subtypes were elevated in CTD-PAH. Prior studies have reported on increased concentrations of individual cytokines in CTD-PAH, including IL-6,<sup>23,34</sup> but our work is among the first to provide in-depth comparison of multiple biomarker levels across several subtypes of PAH. Mildly elevated markers of endothelial activation or vascular inflammation may be seen in patients with CTD at baseline and be associated with risk for PAH.<sup>35,36</sup> Although speculative, elevation of these markers before overt disease develops may reinforce a mechanistic explanation for our observations.

Relating biomarker levels to clinical outcomes, we identified six markers that associated with higher three-year mortality: NT-proBNP, IL-6, IP-10, TNF- $\beta$ , sFlt-1, and PIGF. In complementary and reassuring analyses, five of these six markers were also strongly associated with REVEAL score. While IL-6<sup>25,32,34</sup> and sFlt-1<sup>23</sup> have previously been associated with mortality in PAH, to our knowledge associations of TNF- $\beta$ , IP-10, and

PIGF with mortality have not been described before. In our single-institution cohort with limited power, only IL-6 and NT-proBNP were significant after accounting for multiple comparisons with a more stringent FDR threshold; nevertheless, focused validation in idiopathic/heritable PAH using the UK PAH Cohort Study reinforced the initial observation that IP-10, TNF- $\beta$ , PIGF, and NT-proBNP had significant associations with survival. Although speculative, a mechanistic explanation for these associations is plausible. IL-6 can cause vascular inflammation and remodeling, and lead to pulmonary vascular lesions in murine models.<sup>37</sup> Abnormalities in vascular endothelial growth factor (VEGF) signaling are implicated in angiogenesis in PAH, and VEGF pathway members PIGF and sFLT-1 are both implicated in deranged angiogenesis in preeclampsia and atherosclerosis.<sup>38–40</sup> In addition, IP-10 provokes both vascular inflammation and impaired angiogenesis,<sup>24</sup> and endothelial-derived TNF-β promotes vascular inflammation.<sup>41</sup>

Highlighting the potential for subtype-specific relationships, we found that sFLT-1 was associated with mortality in the full Servetus cohort; however, this relationship was predominantly seen in individuals with CTD-PAH, and no association was observed in those with non-CTD-PAH (Figure 3). While sFLT-1 was not "validated" in the UK cohort, this may be enitrely consistent with our findings given the lack of individuals with CTD-PAH in the UK Cohort.

IL-6 was also not validated in the UK cohort, which is curious given that association of IL-6 with PAH outcomes is widely reported.<sup>25,32,34,37</sup> Importantly, a prior publication found poor correlation between SomaScan and two other methods of IL-6 detection.<sup>42</sup> As aptamer-based assays are more widely embraced in protein research, this discordance with IL-6 may reinforce the importance of complementary studies using both immunoassay-based approaches (such as Servetus) and aptamer-based approaches (such as the UK cohort). High-dimensional proteomic analysis is a cutting-edge tool with substantial promise to elucidate complex mechanisms in PAH.<sup>30,31,43</sup> Using aptamer-based approaches, such studies examine thousands of proteins using an unbiased approach that can suggest unexpected associations and optimize risk prediction.<sup>30</sup> On the other hand, the use of immunoassays targeting a focused set of biomarkers, such as in our primary analyses, has unique strengths and weaknesses relative to a hypothesis-neutral proteomic approach. In addition to the noted differences across assays, a focused approach reduces the power needed to suggest a significant result, which can be important in a rare disease like PAH where relatively small sample sizes, even in large collaborations, limit power.

In addition to the iterative identification of additional biomarkers of interest, the key finding of this study is the heterogeneity across patients and subtypes of PAH which remains underreported. Understanding this heterogeneity is important to identify more precise approaches to PAH prognostication and treatment.<sup>15–18</sup> Despite a recognition that more precision is needed, studies have generally focused on prognostication or treatment for PAH patients in aggregate. Our results support the intuitive paradigm that there may be sufficient heterogeneity within PAH to warrant more focused investigation of subtype-specific biological pathways. Approaches targeting angiogenesis or inflammation may have disproportionate benefit in CTD-PAH – a hypothesis that finds support in reports on small numbers of patients with PAH associated with systemic lupus erythematosus or mixed

Our study has several important limitations. Most notably, we were limited by low mortality and sample size which precluded firm conclusions about relationships with mortality in tox-PAH or CHD-PAH. Multiple comparisons increased the probability of identifying a relationship by chance alone and while we are reassured by the UK validation, within Servetus alone only IL-6 and NT-proBNP were associated with mortality after correction for multiple comparisons (FDR 5%). In addition, it should be noted that in the UK cohort, PIGF's association barely met our significance threshold with a p-value of 0.0503 that rounded to 0.05 using three significant figures to determine significance.<sup>46</sup> It is noteworthy that an alternative explanation for our findings would be differences in severity of illness by subtype, rather than PAH subtype itself. Reassuringly, we obtained similar results following adjustment by NT-proBNP; however, the possibility of residual confounding by severity persists. Finally, we did not record information about whether patients were on immunosuppressing medications, which may bias interpretation of biomarker levels especially within the CTD-PAH cohort.

In summary, in a single-center cohort, we observed elevated inflammatory and angiogenic biomarker levels in CTD-PAH when compared to three other PAH subtypes, along with distinct associations with survival within CTD-PAH versus non-CTD-PAH subtypes. We corroborate prior work suggesting IL-6 is associated with PAH outcomes and newly identify IP-10, TNF- $\beta$ , and PIGF as associated with mortality in in both a discovery and validation cohort. We cautiously suggest sFlt-1 may be uniquely important in CTD-PAH and deserve further evaluation in this context. These results should encourage further research into subtype heterogeneity in PAH, particularly as mechanism-specific therapies are tested.

## **Supplementary Material**

Refer to Web version on PubMed Central for supplementary material.

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## List of non-standard abbreviations:

6MWD	Six-minute walk distance
BMPR2	Bone morphogenic protein receptor type 2
CHD-PAH	Congenital heart disease-associated PAH
CTD-PAH	Connective tissue disease-associated PAH
IL	Interleukin
IP-10	Interferon gamma-induced protein 10
IPAH	Idiopathic PAH
mPAP	Mean pulmonary artery pressure
NT-proBNP	N-terminal prohormone of brain natriuretic peptide
РАН	Pulmonary arterial hypertension
PCWP	Pulmonary capillary wedge pressure
PIGF	Placental growth factor
PVR	Pulmonary vascular resistance
RVD	Right ventricular basal diameter
sFlt-1	Soluble fms-like tyrosine kinase 1
TAPSE	Tricuspid annular plane systolic excursion
TNF	Tumor necrosis factor

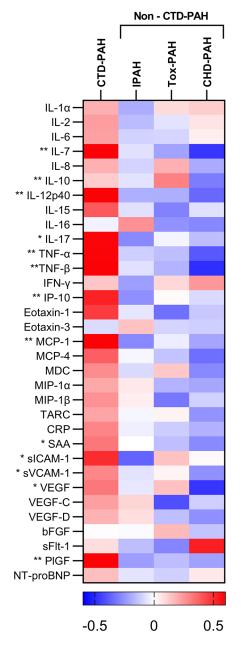
Tox-PAH	Toxin-associated PAH				
VEGF	Vascular endothelial growth factor				

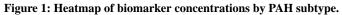
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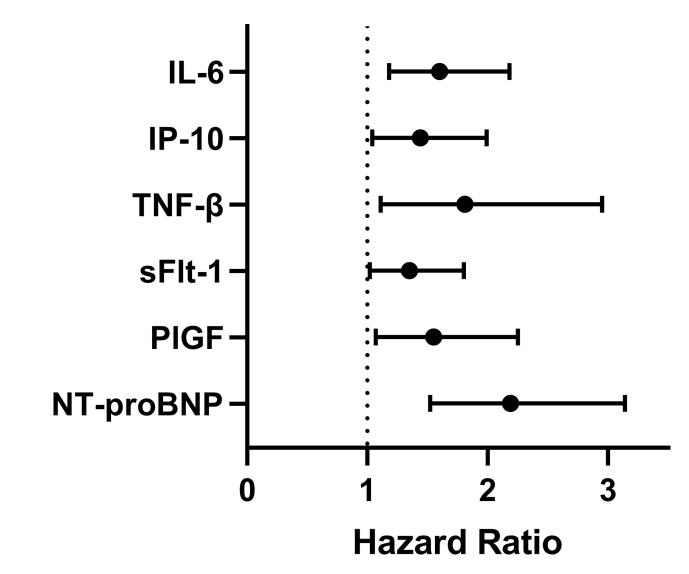
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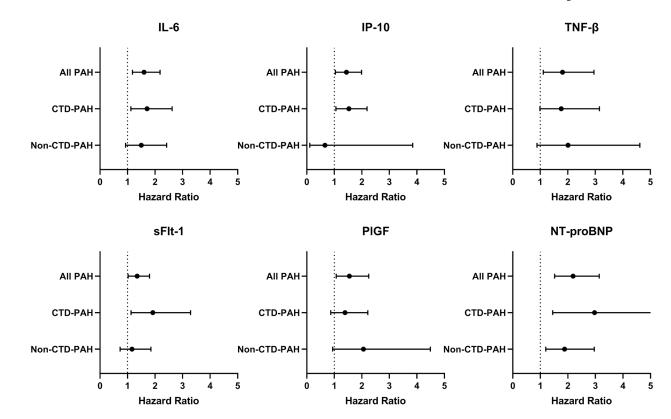
Heatmap displays row Z scores for serum markers of angiogenesis and inflammation across subtypes of pulmonary arterial hypertension. Asterisks denote biomarkers that significantly differ across subtype: \* p 0.05, \*\* p 0.01. PAH: pulmonary arterial hypertension; IPAH: idiopathic PAH; CTD-PAH: connective tissue disease-associated PAH; Tox-PAH: toxin-associated PAH; CHD-PAH: congenital heart disease-associated PAH.

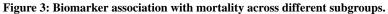


#### Figure 2: Biomarker associations with mortality in the pooled PAH cohort.

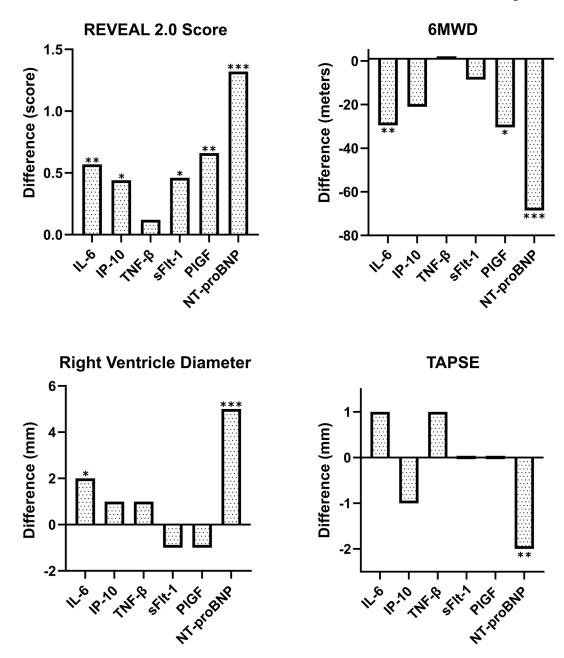
Cox proportional hazards models adjusted for age, sex, and pulmonary arterial hypertension etiology were run evaluating biomarker associations with mortality. The hazard ratio for a one-standard-deviation change in biomarker level against mortality is shown. Definition of abbreviations: IL-6: interleukin-6; IP-10: interferon gamma-induced protein 10; TNF- $\beta$ : tumor necrosis factor-beta; sFlt-1: soluble fms-like tyrosine kinase 1; PIGF: placental growth factor; NT-proBNP: N-terminal pro-brain natriuretic peptide.

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Cox proportional hazards models adjusted for age, sex, and pulmonary arterial hypertension etiology were performed separately for the CTD-PAH and non-CTD-PAH subgroups. The non-CTD-PAH subgroup includes patients with idiopathic, congenital heart disease-associated, and toxin-associated PAH. Definition of abbreviations: PAH: pulmonary arterial hypertension; CTD-PAH: connective tissue disease-associated PAH; IL-6: interleukin-6; IP-10: interferon gamma-induced protein 10; TNF-β: tumor necrosis factor-beta; sFlt-1: soluble fms-like tyrosine kinase 1; PIGF: placental growth factor; NT-proBNP: N-terminal pro-brain natriuretic peptide.



**Figure 4: Biomarker associations with echocardiographic and clinical outcomes.** Linear regression models were run on biomarker associations with REVEAL 2.0 score, right ventricle (RV) diameter, tricuspid annular plane systolic excursion (TAPSE), and 6-minute walk distance (6MWD). Models were adjusted for age, sex, etiology, and height. Graphs display the difference in REVEAL score, RV diameter, TAPSE, or 6MWD associated with a standard deviation change in biomarker concentration (\* p 0.05; \*\* p 0.01; \*\*\* p 0.001).

#### Table 1

#### Baseline patient characteristics

Patient Characteristics	All PAH (n=112)	CTD-PAH (n=27)	IPAH (n=45)	Tox-PAH (n=20)	CHD-PAH (n=20)
Age (year)	51.6 (14.4)	58.6 (11.5)	53.4 (14.4)	47.8 (8.8)	41.8 (16.9)
Female sex	82% (92)	89% (24)	76% (34)	90% (18)	84% (16)
BMI (kg/m2)	29.1 (7.3)	27.6 (6.5)	30.8 (7.7)	32.1 (6.8)	24.1 (4.8)
NYHA Functional Class					
I/II	66% (57)	65% (13)	71% (25)	44% (7)	75% (12)
III	22% (25)	30% (6)	20% (7)	50% (8)	25% (4)
IV	6% (5)	5% (1)	9% (3)	6% (1)	0% (0)
6MWD (meters)	366 (107)	334 (105)	387 (119)	358 (84)	372 (102)
Deceased	17% (19)	33% (9)	9% (4)	15% (3)	15% (3)
PAH Therapy					
Monotherapy	32% (36)	41% (11)	27% (12)	35% (7)	30% (6)
Dual Therapy	35% (39)	33% (9)	38% (18)	40% (8)	25% (5)
Triple Therapy	19% (21)	19% (5)	24% (11)	10% (2)	15% (3)
No Therapy	14% (16)	7% (2)	11% (5)	15% (3)	30% (6)
Right Heart Catheterization	All PAH (n=95)	CTD-PAH (n=25)	IPAH (n=36)	Tox-PAH (n=18)	CHD-PAH (n=16)
RAP (mmHg)	8.9 (5.8)	7.9 (5.4)	9.9 (5.7)	10.1 (5.9)	6.7 (6.2)
mPAP (mmHg)	47.1 (12.7)	42.8 (10.8)	49.5 (11.4)	51.0 (11.2)	44.1 (17.3)
PCWP (mmHg)	10.4 (3.4)	9.6 (3.5)	11.2 (3.4)	11.2 (2.7)	9.1 (3.8)
CI (L/min/m <sup>2</sup> )	2.6 (0.8)	2.3 (0.6)	2.6 (0.7)	2.3 (0.7)	3.3 (0.6)
PVR (Wood units)	8.8 (4.8)	9.5 (5.3)	8.6 (4.4)	10.0 (5.0)	6.6 (4.3)
Echocardiography	All PAH (n=88)	CTD-PAH (n=16)	<b>IPAH</b> (n=39)	Tox-PAH (n=18)	CHD-PAH (n=13)
RV Diameter (mm)	46 (9)	42 (8)	47 (10)	47 (7)	45 (1)
TAPSE (mm)	21 (6)	20 (4)	22 (6)	19 (6)	20 (6)

Data are presented as mean (standard deviation) or % (n). Functional class was available for 88 patients (79%) and 6MWD data for 98 (87.5%). For the 95 patients undergoing right heart catheterization, right atrial pressure data was available for 86 patients (91%), wedge pressure for 84 (88%), cardiac index for 73 (77%) and pulmonary vascular resistance for 70 (74%). Of the 88 patients with an echocardiogram, RV diameter and TAPSE were not measurable in 2 patients. PAH: pulmonary arterial hypertension; IPAH: idiopathic PAH; CTD-PAH: connective tissue disease-associated PAH; Tox-PAH: toxin-associated PAH; CHD-PAH: congenital heart disease-associated PAH; BMI: body mass index; NYHA: New York Heart Association; 6MWD: 6-minute walk distance; RAP: right atrial pressure; mPAP: mean pulmonary artery pressure; PCWP: pulmonary capillary wedge pressure; CI: cardiac index; PVR: pulmonary vascular resistance; RV: right ventricle; TAPSE: tricuspid annular plane systolic excursion.