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Pulmonary Vascular Original Research

Metabolomic Profiles Differentiate Scleroderma-PAH From Idiopathic PAH and Correspond With Worsened Functional Capacity

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> BACKGROUND: The prognosis and therapeutic responses are worse for pulmonary arterial ₇₅ hypertension associated with systemic sclerosis (SSc-PAH) compared with idiopathic pul-76 monary arterial hypertension (IPAH). This discrepancy could be driven by divergence in 77 underlying metabolic determinants of disease.

> RESEARCH QUESTION: Are circulating bioactive metabolites differentially altered in SSc-PAH⁷⁹ vs IPAH, and can this alteration explain clinical disparity between these PAH subgroups? STUDY DESIGN AND METHODS: Plasma biosamples from 400 patients with SSc-PAH and 1,082 82 patients with IPAH were included in the study. Another cohort of 100 patients with 83 scleroderma with no PH and 44 patients with scleroderma with PH was included for external 84 validation. More than 700 bioactive lipid metabolites, representing a range of vasoactive and 85 immune-inflammatory pathways, were assayed in plasma samples from independent dis-86 covery and validation cohorts using liquid chromatography/high-resolution mass 87 spectrometry-based approaches. Regression analyses were used to identify metabolites that ⁸⁸ exhibited differential levels between SSc-PAH and IPAH and associated with disease severity.

> RESULTS: From hundreds of circulating bioactive lipid molecules, five metabolites were found to distinguish between SSc-PAH and IPAH, as well as associate with markers of disease $_{92}$ severity. Relative to IPAH, patients with SSc-PAH carried increased levels of fatty acid 93 metabolites, including lignoceric acid and nervonic acid, as well as eicosanoids/oxylipins and 94 sex hormone metabolites.

> INTERPRETATION: Patients with SSc-PAH are characterized by an unfavorable bioactive metabolic profile that may explain the poor and limited response to therapy. These data provide important metabolic insights into the molecular heterogeneity underlying differences between subgroups of PAH. CHEST 2022; $\blacksquare(\blacksquare)$: \blacksquare

Q7 KEY WORDS: biomarkers; pulmonary hypertension; scleroderma

ABBREVIATIONS: $6MWD = 6$ -min walk distance; FAHFA = fatty acyl esters of hydroxy fatty acid; IPAH = idiopathic pulmonary arterial hypertension; LC/MS = liquid chromatography/high-resolution mass spectrometry; LTB_4 = leukotriene B_4 ; PAH = pulmonary arterial hypertension; $PGF_{2\alpha}$ = prostaglandin $F_{2\alpha}$; $PVR =$ pulmonary vascular resistance; SSc = systemic sclerosis; SSc-no PH = scleroderma-without pulmonary arterial hypertension; SSc-PAH = systemic sclerosisassociated pulmonary arterial hypertension; SVI = stroke volume in dex ; WHO FC = World Health Organization functional class

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Take-home Points

Study question: Are circulating bioactive metabolites differentially altered in SSc-PAH vs IPAH, and can this alteration explain clinical disparity between these PAH subtypes?

Results: Using robust design and large sample size, we identified and validated five metabolic plasma biomarkers that differentiate SSc-PAH from IPAH and associate with markers of disease severity. The selected biomarkers were increased in SSc-PAH compared vs SSC-alone, indicating these biomarkers are related to PAH condition and not simply due to the presence of scleroderma itself.

Interpretation: Patients with SSc-PAH are characterized by an unfavorable bioactive metabolic profile that may explain the poor and limited response to therapy. These data provide important metabolic insights into the pathogenesis of SSc-PAH molecular heterogeneity of subgroups of PAH and may be used for precision medicine approaches in PAH.

Pulmonary arterial hypertension (PAH) is a debilitating disease with enigmatic origins leading to elevated pulmonary arterial pressures and pulmonary vascular resistance (PVR). The most common subgroups are idiopathic PAH (IPAH) and systemic sclerosis-associated PAH (SSc-PAH).^{[1](#page-10-0)} Systemic sclerosis is a complex, immunologic disease, characterized by autoimmunity, fibrosis of the skin and internal organs, and small vessel vasculopathy.^{[2](#page-10-1)} Importantly, PAH in patients with SSc compared with patients with IPAH have a threefold higher mortality risk.^{$3-6$} Furthermore, patients with SSc-PAH stand out from those with other types of PAH, given their impaired response to

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	- DOI: <https://doi.org/10.1016/j.chest.2022.08.2230>

traditional therapies and worse overall clinical prognosis despite exhibiting similar end-organ pathology and often presenting with milder hemodynamic impairment. $3,7$ $3,7$ $3,7$ Proposed factors explaining these disparities include more pronounced inflammation,^{[8](#page-10-4)} autoimmunity, the distinct nature of the underlying vasculopathy,^{[9](#page-10-5)} and differing abilities of the right ventricle to adapt to the increased afterload. 10 Metabolic dysregulation has been proposed as a key mechanism by which IPAH and SSc-PAH differ and could control such disparities. $11,12$ $11,12$ Interrogating such metabolic dysregulation that also reflects contributory immune-inflammatory and vasoactive pathway activation is now possible by profiling circulating levels of bioactive lipid metabolites. $13-15$ However, the extent to which bioactive lipid profiles may specifically differentiate between SSc-PAH and IPAH phenotypes remains unknown. The ability to clarify the molecular mechanisms underlying SSc-PAH, in particular, could accelerate the development of more effective approaches to managing and treating this especially challenging PAH subtype. 166 167 168 169 170 171 172 173 174 175 176 177 178 179 180 181 182 183 184 185 186 187 188 189

Amid the broad diversity of metabolites that may be studied in relation to disease pathogenesis, lipidomic analytes include a subset of bioactive lipids that warrant focused interrogation in relation to pulmonary vascular disorders given the known, yet still understudied role of bioactive lipids in modulating inflammation, immune regulation, vascular function, and hemostasis.^{[13-15](#page-10-9)} To date, early studies of these bioactive metabolites in PAH have revealed changes in key energetic pathways, including abnormal lipid oxidation products, oxidative stress, and lipid metabolism. Notwithstanding these prior studies, limited data are available on how bioactive lipid activity may differentiate between the pathobiological processes underlying subgroups of PAH and specifically SSc-PAH.

In the current study, we hypothesized that patients with SSc-PAH exhibit unfavorable bioactive plasma metabolomic derangements that are associated with worse functional capacity compared with IPAH and which could explain the rapid decline and disease pathogenesis. The primary aim of this study was to determine whether there is a bioactive lipid signature of SSc-PAH. The secondary aim was to determine if this signature is associated with markers of disease severity. We applied liquid chromatography/high-resolution mass spectrometry (LC/MS) to characterize the plasma metabolic profiles from patients with IPAH, SSc-PAH, and scleroderma-without PAH (SSc-no PH). 207 208 209 210 211 212 213 214 215 216 217 218 219 220

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Study Design and Methods 222

Cohorts and Sample Collection 223

We conducted primary analyses in a prespecified discovery cohort followed by confirmatory analyses in a prespecified validation cohort, in accordance with a study design that we have used in prior human metabolomics studies and to evaluate the potential generalizability of our findings[.16](#page-10-10) Cohorts 1 and 2 included patients with IPAH and SSc-PAH and were obtained from the PAH Biobank resource. Cohort 3 included patients with SSc-no PH and patients with SSc-PAH obtained from Boston University. Details on study cohorts and sample collection are included in the e-Appendix. 224 225 226 227 228 229 230Q8 231

Metabolite Profiling 232

Bioactive metabolite analysis was performed on plasma samples by LC/MS using a Vanquish UPLC coupled to a high-resolution, Q Exactive Orbitrap mass spectrometer (Thermo Fisher Scientific), as described elsewhere^{[14](#page-10-11),1} (details are provided in the e-Appendix). Metabolites identified as xenobiotics or detected in < 20% of samples were excluded from the analysis, leaving 690 well-quantified biological metabolites. Following normalization, metabolite peaks were further compressed for multiple adducts and in source fragments. Metabolites missing values were imputed to the one-quarter of the lowest observed value of that molecule. Normalized, aligned, filtered data sets were subsequently used for statistical analyses, as described in the following section. 233 234 235 236 237 238 239 240 241 242

Statistical Analyses 243

Initial group comparisons between patients with SSc-PAH and IPAH, and between those with SSc-no PH and SSc-PAH, were performed by using the Student t test or the Mann-Whitney test for continuous variables and the χ^2 test for categorical variables. Prior to all analyses, metabolite values were natural logarithmically transformed, as needed, and later standardized with mean $= 0$ and $SD = 1$ to facilitate comparisons. Logistic regression analysis was used to determine metabolites that were significantly different between SSc-244 245 246 247 248 249 250

Results

Baseline demographic, clinical, and hemodynamic characteristics and medications for patients enrolled in the study are summarized in [Table 1,](#page-3-0) [Table 2,](#page-4-0) and e-Table 1. At the time of enrollment, patients with SSc-PAH had significantly lower mean right atrial pressure and PVR than IPAH counterparts. In Cohort 3, patients with SSc-no PH were younger and had less disease duration compared with patients with SSc-PAH. There was no difference in immunosuppression medication usage between the groups in Cohort 3.

Metabolites Differentiating Between SSc-PAH and IPAH

The study overview is described in [Figure 1](#page-5-0). Circulating levels of nine bioactive lipid metabolites distinguished SSc-PAH from IPAH at a "metabolome-wide" statistical threshold of $P < 10^{-4}$ (e-Table 2, Table 3) after adjusting for age, sex, and BMI. Further adjustment for potential confounders, including use of prostaglandin therapy, corticosteroids, immunosuppression therapy, warfarin, 268 269 270 271 272 273 ^{Q9} 274 275

PAH and IPAH (analysis I) in models adjusting for age, sex, BMI, 277 and potential confounders, including use of prostaglandin therapy, corticosteroids, immunosuppression therapy, warfarin, or thyroid hormone, as well as renal insufficiency and cirrhosis. Renal insufficiency and cirrhosis were determined based on treating 280 physicians' discretion. The selection of variables included for all 281 analyses was based on clinical expert identification of potentially 282 confounding factors. Variables for inclusion in multivariable-adjusted 283 analyses were also selected based on significant results observed in the unadjusted analyses. To determine if the prioritized metabolites were not driven by disease severity, 6-min walk distance (6MWD) 285 was included in the logistic regression model. 276 278 279 284 286

To determine significance, a Bonferroni-corrected P value threshold of .05 divided by a conservative estimate of the total number of unique 288 small molecules (ie, $P < 10^{-4}$) was used. False discovery rate using 289 the Benjamini-Hochberg method was also calculated, and 290 metabolites not meeting a q value threshold of $<$ 0.05 were 291 excluded. Receiver-operating characteristic curve was used to assess discriminating value of metabolites against diagnosis. To determine if the significant metabolites were related to scleroderma disease or 293 scleroderma-PAH, Student t test analysis was performed between the 294 significant metabolites in SSc-no PH and SSc-PAH in Cohort 3. 295 Logistic regression analysis was performed between the metabolites 296 meeting significance threshold $(P < .05)$ in the pairwise analysis. Regression analysis was performed between the significant metabolites from analysis I and markers of disease severity in SSc-PAH, IPAH, and SSc-PAH combined. Linear regression analysis was 299 used between the selected metabolites and 6MWD, right atrial 300 pressure, PVR, cardiac index, and stroke volume index (SVI), and 301 logistic regression analysis was used between the selected metabolites and World Health Organization functional class (WHO FC; analysis II). All analyses were performed in models adjusting for age, sex, 303 and BMI. Statistical analysis was performed with R with RStudio.² 287 292 297 298 302 304

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or thyroid hormone, as well as renal insufficiency and cirrhosis, did not significantly affect the analyses for all 309 of the metabolites but one. The directionality of association for a novel eicosanoid remained the same, although the significance of the association was attenuated after adjustment for warfarin use. After adjusting for 6MWD in the model, all nine metabolites remained significant. All the metabolites were able to distinguish SSc-PAH from IPAH in an independent validation cohort. These metabolites included alterations 318 in fatty acid oxidation, eicosanoid metabolism, and sex 319 hormones. ([Fig 2](#page-6-0)). In combination, these metabolites distinguished patients with SSc-PAH and IPAH at an area under the curve of 85.5% of accuracy (95% CI, 82.8- 322 88.3) ([Fig 3\)](#page-6-1). 308 310 311 312 313 314 315 316 317 320 321 323

Metabolites Distinguishing SSc-PAH From Scleroderma Disease

To determine if the selected metabolites were related to SSc per se, metabolomics analysis was performed comparing Cohort 3 (consisting of SSc-no PH) vs SSc-327 328 329 330

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TABLE 1] Patient Demographic Characteristics and Clinical Features of Patients With IPAH and SSc-PAH Q19 331

Data are expressed as No. (%) or mean \pm SD. 6MWD $=$ 6-min walk distance; IPAH $=$ idiopathic pulmonary arterial hypertension; mPAP $=$ mean pulmonary artery pressure; mRAP = mean right atrial pressure; PAWP = pulmonary artery wedge pressure; PVR = pulmonary vascular resistance; SSc-PAH = systemic sclerosis-associated pulmonary arterial hypertension; $SVI =$ stroke volume index.

PAH. When considering the plasma metabolite signature differentiating between SSc-PAH and IPAH, levels of fatty acyl esters of hydroxy fatty acid (FAHFA), nervonic acid, 17 β estradiol, prostaglandin $F_{2\alpha}$ (PGF_{2 α}), and a novel eicosanoid were significantly higher in SSc-PAH vs SSc-no PH [\(Fig 4](#page-7-0), [Table 4\)](#page-8-0). Levels of lignoceric acid and leukotriene B_4 (LTB₄) were significantly elevated in SSc-no PH compared with SSc-PAH. The difference in lignoceric acid and LTB4 attenuated after adjusting for disease duration (e-Fig 1, e-Table 3). 361 362 363 364 365 366 367 368 369 370 371

Associations of SSc-PAH Differentiating Metabolites With Markers of Disease Severity 373 374

To determine if certain distinguishing metabolites associate with worse functional capacity and markers of disease severity in PAH, we next performed association of the five metabolite biomarkers with 6MWD and WHO FC. Only 58 patients (18 of them had SSc-PAH) had a right heart catheterization within 14 days of sample collection, and their hemodynamics data were included in the analysis with hemodynamic measures of disease severity: right atrial pressure, PVR, cardiac index, and SVI. As shown in e-Figure 1 and [Figure 5](#page-8-1), three of 375 376 377 378 379 380 381 382 383 384 385

the metabolites were associated with at least one marker of disease severity in SSc-PAH, and all five metabolites were associated with at least one marker of disease severity when combining SSc-PAH and IPAH ($P < .05$). Two metabolites (nervonic acid and 17β estradiol) associated with decreased 6MWD in SSc-PAH, and four of the five metabolites associated with decreased 6MWD in combined SSc-PAH and IPAH (nervonic acid, 17β) estradiol, novel eicosanoid, and $PGF_{2\alpha}$) and were significantly higher in SSc-PAH. Intriguingly, 17β estradiol associated with lower cardiac index and SVI in SSc-PAH but not in IPAH. Four metabolites (FAHFA, 17β estradiol, novel eicosanoid, and PGF_{2a}) associated with lower cardiac index in combined SSc-PAH and IPAH (e-Table 4).

Discussion

In this study, we identified significant bioactive lipid alterations that distinguish patients with SSc-PAH from those with IPAH. We assayed hundreds of circulating bioactive lipid metabolites using LC/MS approaches in 400 patients with SSc-PAH and 1,082 patients with IPAH in independent discovery and validation cohorts. 435 436 437 438 439 440

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Data are expressed as mean \pm SD or No. (%). D \cos $=$ diffusing capacity of the lung for carbon monoxide; mPAP $=$ mean pulmonary artery pressure; $mRAP =$ mean right atrial pressure; PAWP = pulmonary artery wedge pressure; PVR = pulmonary vascular resistance; RVSP = right ventricular systolic pressure; SSc-no PH = scleroderma-without pulmonary arterial hypertension; SSc-PAH = systemic sclerosis-associated pulmonary arterial hypertension. 521 522

We observed a set of bioactive metabolite biomarkers that independently differentiated SSc-PAH from IPAH after adjusting for multiple potential confounders. In combination, these metabolites were able to distinguish SSc-PAH from IPAH with a high degree of accuracy (area under the curve, 85.5%; 95% CI, 82.8-88.3). Importantly, levels of the differentiating metabolites were found to be altered in an independent cohort of SSc-PAH compared with SSc-no PH, and the majority of these analytes were also associated with at least one marker of disease severity. Taken together, these findings provide molecular insights into the heterogeneity that is consistently seen across PAH subgroups, and they offer viable directions for further investigation of mechanisms underlying the worse prognosis and response to therapy seen in patients with SSc-PAH. 470 471 472 473 474 475 476 477 478 479 480 481 482 483 484 485 486 487 488

Although there is an advancing appreciation that PAH is a heterogeneous disease with clinical differences within subgroups, still missing is a comprehensive catalogue of molecular and metabolic profiles underlying the clinical manifestations of PAH subgroup. Namely, plasma 490 491 492 493 494 495

metabolomic profiles have been reported in PAH,^{[29-32](#page-11-1)} and a few reports have examined circulating metabolites that may point to potential metabolic pathways altered in SSc (with or without PAH). $33,34$ $33,34$ $33,34$ These studies indicated that distinct metabolic signatures exist between PAH and healthy or disease control subjects. In 531 the largest of these studies, Rhodes et al^{29} al^{29} al^{29} performed a comprehensive metabolomics analysis in patients with IPAH and control subjects. The investigators identified 534 that the measurements of a combination of seven circulating metabolites can be used to distinguish PAH 536 from control subjects. Interestingly, alterations in fatty acids, steroids, and RNA-based nucleoside levels correlated with clinical outcomes, and correction of several metabolites over time was associated with better clinical outcome. Our study adds substantially to this existing compendium of metabolites by making comparisons between subgroups of PAH and focusing on a putative difference between these subgroups in metabolic dysregulation. Notably, a prior small study of 546 eight patients with SSc without PAH and 10 patients with SSc-PAH using nuclear MRI identified an increase 548 in glycolysis and altered fatty acid profiles in SSc-PAH.^{[29](#page-11-1)} 549 525 526 527 528 529 530 532 533 535 537 538 539 540 541 542 543 544 545 547 550

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Figure 1 – Study overview. Summary of study workflow and data analysis plan. $6MWT = 6$ -min walk test; IPAH = idiopathic pulmonary arterial hypertension; $SSc-PAH = systemic$ sclerosis-associated pulmonary arterial hypertension; SSc-no $PH = \text{scleroderma-without}$ pulmonary arterial hypertension. 586 587 588 589024 590

However, none of these studies offered a broad plasma bioactive metabolite analysis with the intent of a comparison across independent cohorts of IPAH vs SSc-PAH and SSc-PAH vs SSc-no PH. Specific molecular signatures, perhaps indicating immune-inflammatory or vasoactive targets, could be instrumental in guiding the development and tailoring of more effective management strategies. Notably, none of the top differentiating metabolites in our study was measured in prior published work, potentially related to technical differences (use of NMR vs LC/MS) and smaller sample sizes of the previous studies. Thus, our findings now set the stage for precision medicine practices in PAH 592 593 594 595 596 597 598 599 600 601 602 603 604 605

 $1E-02$ 3E-02 9E-03 7E-03 3E-02 5E-02 6E-04 6E-04 2E-04 Ě FC OR CI-L CI-U P Value FDR FC OR CI-L CI-U P Value FDR Lignoceric acid | Fatty acid metabolism | 1.3 | 1.4 | 1.2 | 7E-05 | 8E-05 | 8E-05 | 1.2 | 1.5 | 1.1 | 2.0 | 9E-03 | 9E-03 Nervonic acid Fatty acid metabolism 1.1 | 1.3 | 1.3 | 3E-07 | 9E-07 | 9E-07 | 1.16 | 1.6 | 1.2 | 2.1 | 3E-03 | 7E-03 FAHFA | Fatty acid metabolism | 2.3 | 2.4 | 2.4 | 2.5 | 2.5 | 2.5 | 2E-02 | 3E-02 | 3E-02 | 3E-02 | 3E-02 | 3E-02 Nitrooleate Fatty acid metabolism 0.6 0.8 0.7 0.9 1E-04 1E-04 0.7 0.8 0.6 1.0 5E-02 5E-02 11-Testosterone Steroid hormones metabolism 0.8 0.7 0.6 0.8 3E-06 4E-06 0.7 0.5 0.4 0.7 2E-05 2E-04 176 estradiol Steroid hormones metabolism | 2 | 1.3 | 1.7 | 1.5 | 1.8 | 1.8 | 1.8 | 1.7 | 1.3 | 2E-04 | 6E-04 Novel eicosanoid Arachidonic acid metabolism 1.5 1.6 1.4 1.8 9E-09 6E-08 2.2 1.8 1.3 2.4 2E-04 6E-04 PGF2a Arachidonic acid metabolism 1.3 1.6 1.3 1.9 2E-06 3E-06 1.3 1.4 1.1 1.9 9E-03 1E-02 LTB4 Arachidonic acid metabolism | 1.5 | 1.4 | 1.4 | 1.4 | 1.5 | 1.5 | 1.5 | 1.6 | 1.7 | 2E-02 | 3E-02 | 3E-02 P Value 2E-02 5E-02 2E-05 2E-04 2E-04 9E-03 2E-02 5E-03 3E-03 J-U $\overline{2.0}$ 2.5 $\frac{0}{1}$ 0.7 2.4 $\frac{9}{1}$ 1.7 \overline{c} \overline{c} validation Discovery Validation م 0.4 1.3 1.3 1.0 ਰੋ Ξ $\frac{1}{11}$ Ξ $\dot{\mathsf{d}}$ $\frac{1}{1}$ 1.6 1.6 ∞ $\ddot{0}$. 1.8 $\frac{4}{1}$ 1.4 ϵ $\dot{\circ}$ 1.2 1.3 \triangleright $\overline{0}$.7 1.8 2.2 $1.\overline{3}$ 1.3 잎 $\ddot{\circ}$ 2E-06 1E-04 4E-06 6E-08 6E-08 3E-06 9E-06 8E-05 9E-07 FDR P Value 3E-06 $1E-08$ 2E-06 8E-06 7E-05 LE-04 9E-09 9E-07 3E-07 $\begin{array}{c}\n\hline\n-\hline\n\end{array}$ 1.6 1.9 2.0 0.9 $0.\overline{8}$ 1.7 1.8 1.9 1.6 Discovery 0.6 \vec{c} $\frac{1}{2}$ $\frac{3}{2}$ $\overline{4}$ 0.7 $1.\overline{3}$ $\frac{4}{1}$ $\frac{3}{1}$ 1.2 $0.\overline{8}$ 1.6 1.4 \circ 1.6 0.7 1.5 1.6 $\frac{1}{4}$ \approx $0.\overline{6}$ $0.\overline{8}$ 1.5 1.5 $1.\overline{3}$ 1.3 1.3 오 $\frac{1}{1}$ \sim Steroid hormones metabolism Steroid hormones metabolism Arachidonic acid metabolism Arachidonic acid metabolism Arachidonic acid metabolism Fatty acid metabolism acid metabolism metabolism Fatty acid metabolism yewupe Metabolite **Pathway** acid
1 Fatty Fatty 11-Testosterone Novel eicosanoid Lignoceric acid Nervonic acid L7^B estradiol Vitrooleate Metabolite FAHFA $PGF_{2\alpha}$ LTB₄

Q₂ P values originated from multivariable regression analysis. ORs reflect multivariable regression analysis. Fold change (FC) reflects the mean average of the metabolite level in systemic sclerosis-associated pulmonary $q\bar$ (FC) reflects the mean average of the metabolite level in systemic sclerosis-associated pulmonary $=$ false FAHFA = fatty acyl esters of hydroxy fatty acid; FDR fatty acyl esters of hydroxy fatty acid; FDR upper confidence interval; FAHFA CI-U = upper confidence interval; lower confidence interval; CI-U CI-L = lower confidence interval; Fold change P values originated from multivariable regression analysis. ORs reflect multivariable regression analysis. arterial hypertension (SSc-PAH) over idiopathic pulmonary arterial hypertension (IPAH). CI-L idiopathic pulmonary arterial hypertension (IPAH). $=$ prostaglandin $F_{2\alpha}$ discovery rate; LTB4 $=$ leukotriene B4; PGF_{2 α} $=$ prostaglandin F $_{2\alpha}$. $=$ leukotriene B4; PGF₂₀ arterial hypertension (SSc-PAH) over discovery rate; LTB4

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TABLE 3] Metabolites Distinguishing SSc-PAH From IPAH

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TABLE

Metabolites Distinguishing SSc-PAH From IPAH

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Figure 2 – Bioactive metabolite analysis of SSc-PAH vs IPAH. A, Volcano plot of metabolites distinguishing SSc-PAH from IPAH in the discovery and 732 validation cohorts. ORs and P values are derived from multivariable regression analyses. Red dots indicate metabolites significant in both discovery and 733 validation cohorts; black dots indicate metabolites significant only in the discovery cohort; and gray dots indicate all metabolites measured in the discovery and validation cohorts. B, Waterfall plot of significant metabolites distinguishing SSc-PAH from IPAH. Values are plotted as log2 fold change of metabolite levels in SSc-PAH relative to IPAH. FAHFA = fatty acyl esters of hydroxy fatty acid; Eic = eicosanoid; IPAH = idiopathic pulmonary 735 arterial hypertension; LTB₄ = leukotriene B₄; PGF_{2a} = prostaglandin F_{2a}; SSc-PAH = systemic sclerosis-associated pulmonary arterial hypertension; SSc-no $PH = scleroderma-without pulmonary arterial hypertension.$ y₂₃
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clinical trial development and management based on these plasma metabolomic signatures.

Compared with IPAH, patients with SSc-PAH in the current study displayed differentially elevated metabolites

Figure 3 – Receiver-operating characteristic curves show the performance of the model in distinguishing idiopathic pulmonary arterial hypertension from systemic sclerosis-associated pulmonary arterial hypertension using nine metabolites. The blue curve represents the training set, and the red curve represents the testing set. $AUC = area$ under the curve.

of fatty acid oxidation, eicosanoid metabolism, and sex hormones ([Fig 2,](#page-6-0) [Table 3\)](#page-5-1). Most of these elevations were 741 persistent when comparing patients with SSc-PAH vs those with SSc-no PH [\(Fig 4](#page-7-0), [Table 4](#page-8-0)), indicating that these alterations are specific to the condition of SSc-PAH and not the presence of SSc alone. Future work can be envisioned to determine if such markers may define early stages of PAH in asymptomatic patients with SSc. Of particular interest, FAHFAs are a newly discovered class of complex lipid species with known antiinflammatory activities in cancer.³⁵ Eicosanoids are small bioactive lipid 751 species that serve as upstream mediators of inflammation 752 and are known to modulate endothelial cell function as well as exert vasoactive properties. Certain eicosanoids are known to be central mechanistic triggers and drivers of PAH,^{[37](#page-11-6)} but the full range of eicosanoid pathobiology in PAH is not defined. Until recently, sensitive methods for comprehensively detecting and quantifying eicosanoids in large sample sizes have been lacking. In this study, newly developed methods were deployed to more comprehensively measure eicosanoid metabolites 14 that can now distinguish SSc-PAH compared with IPAH. Future work should be prioritized to determine how such 764 novel metabolites may promote and potentially relate to 765 the biology of canonical eicosanoids in both PAH subtypes.

Intriguingly, nervonic acid was associated with worse functional capacity (both higher WHO FC and lower

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Figure 4 – Metabolite levels in SSc-no PH vs SSc-PAH. Violin plots of nervonic acid, lignoceric acid, FHAFA, 17 β estradiol, novel eicosanoid, PGF₂₀₀ and LTB₄ levels in SSc-no PH vs SSc-PAH. All displayed metabolites had a P value < .05. FAHFA = fatty acyl esters of hydroxy fatty acid; LTB₄ leukotriene B_{4} ; PGF_{2 α} = prostaglandin F₂₀; SSc-PAH = systemic sclerosis-associated pulmonary arterial hypertension; SSc-no PH = sclerodermawithout pulmonary arterial hypertension.

6MWD) and higher right atrial pressure in SSc-PAH, despite the fact that patients with SSc-PAH displayed milder hemodynamic profiles. Previous reports have shown that patients with SSc-PAH have depressed rest and reserve right ventricular contractility.^{[38](#page-11-7)} Correspondingly, nervonic acid is a long-chain

monounsaturated omega-9 fatty acid involved in energy metabolism, antioxidant reactions, and apoptosis.³⁹ It also modulates cardiac function and has been positively associated with greater congestive heart failure, poor performance, and increased cardiovascular mortality.^{[40](#page-11-9)} In our cohort, nervonic acid was not associated with

P values originated from multivariable logistic regression analysis. Fold change (FC) reflects the mean average of metabolite level in systemic sclerosis- 947 associated pulmonary arterial hypertension (SSc-PAH) over scleroderma-without pulmonary arterial hypertension (SSc-no PH). ORs originated from 948 multivariable logistic regression analysis. CI-L = lower CI; CI-U = upper CI; FAHFA = fatty acyl esters of hydroxy fatty acid; FDR = false discovery rate; LTB₄ = leukotriene B₄; PGF_{2 α} = prostaglandin F_{2 α}.

cardiac index or SVI; however, our hemodynamic analysis was limited by sample size. Future work should be prioritized to define any causative links of nervonic acid in cardiac impairment in SSc-PAH.

Higher levels of 17 β estradiol and PGF_{2a} were also associated with worse functional capacity in SSc-PAH. In general, 17β estradiol is considered cardioprotective, but 17β estradiol is highly pleiotropic with respect to immune function, displaying proinflammatory and antiinflammatory activity under different conditions. $41,42$ $41,42$ Intriguingly, 17β estradiol associated

with lower cardiac index and SVI in SSc-PAH but associated with higher SVI in IPAH. Future studies should be geared toward defining the balance of protective vs proinflammatory effects in SSc-PAH in the 956 absence of normal immune regulation. $\mathrm{PGF}_{2\alpha}$ is a potent $\,{}^{957}$ pulmonary vasoconstrictor^{[43](#page-11-12)} and marker of inflammation and oxidative stress.^{[44](#page-11-13)} Consistent with our findings, levels of $PGF_{2\alpha}$ are known to increase with both acute^{[45](#page-11-14)} and chronic inflammation, including in connective tissue disease.⁴⁶ In animal models, $PGF_{2\alpha}$ promoted cardiomyocyte hypertrophy and fibrosis, ^{[47](#page-11-16)} suggesting the potential relevance of right ventricular

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pathobiology with $PGF_{2\alpha}$ as with nervonic acid. In our study, $PGF_{2\alpha}$ associated with lower cardiac index and SVI and higher PVR in SSc-PAH and IPAH combined. 991 992 993 994

It is possible that a number of the metabolic alterations associated with SSc-PAH in the current study were driven by SSc per se rather than PAH. For example, levels of lignoceric acid and LTB4 were significantly elevated in SSc-PAH compared with IPAH, but levels were more elevated in patients with SSc-no PH compared with those with SSc-PAH. Both biomarkers have been implicated in inflammation and autoimmune processes, with levels correlating with the degree of inflammation. $48-50$ LTB₄ also induces pulmonary vascular inflammation, endothelial cell apoptosis, and vascular smooth muscle cell proliferation.⁵⁰ Levels of LTB₄ were significantly elevated in BAL fluid from patients with SSc-related lung disease compared with SSc patients without SScrelated lung disease and healthy control subjects. 51 Interestingly, lignoceric acid was associated with a decreased 6MWD, and both lignoceric acid and LTB4 were associated with lower cardiac index and higher PVR in SSc-PAH (e-Fig 2, e-Table 3), suggesting a role of these proinflammatory biomarkers in vascular remodeling and perhaps impaired cardiac function. Studies have shown that cardiac involvement in SSc is not only linked to PAH but that SSc may have a direct impact on the right ventricular structure and function⁵¹; however, it is often difficult to differentiate between primary heart involvement and secondary impairment in the setting of PAH. More importantly, these changes may remain silent for a long time and are thus frequently underdiagnosed. 995 996 997 998 999 1000 1001 1002 1003 1004 1005 1006 1007 1008 1009 1010 1011 1012 1013 1014 1015 1016 1017 1018 1019 1020 1021 1022 1023 1024 1025 1026

In the current cohort, patients with SSc-PAH had a longer disease duration compared with patients with SSc-no PH; in fact, the differences in lignoceric acid and LTB4 levels attenuated after adjusting for disease duration (data not shown). This molecular alteration could represent an opportunity for early detection of either PAH or cardiac involvement in patients with scleroderma and will need further prospective investigations. Another explanation is that patients with SSc-no PH had advanced SSc and a higher level of inflammation, explaining higher levels of these proinflammatory biomarkers. Unfortunately, information on the degree of inflammation was not available in this cohort. Nonetheless, our findings shed light on possible molecular mechanisms of how SSc contributes to accelerated vascular remodeling and impaired cardiac function and could potentially 1027 1028 1029 1030 1031 1032 1033 1034 1035 1036 1037 1038 1039 1040 1041 1042 1043 1044 1045

have therapeutic implications. Inhibition of $LTB₄$ by bestatin (leukotriene A_4 hydrolase inhibitor) prevented and reversed severe PAH in animal models,⁵² but a large, randomized trial of bestatin in severe PAH did not suggest drug benefit.⁵³ Our results support a hypothesis that patients with SSc-PAH displaying high LTB₄ levels may respond more robustly to bestatin. The current study has limitations. Importantly, given the study design, adjustment for all potential confounders between IPAH and SSc-PAH was a challenge. Second, although metabolite markers were found to distinguish SSc-PAH from IPAH and independently associate with markers of disease severity, exploration of a clear causal relationship for the role of these metabolic pathways in SSc-PAH is pending. We acknowledge that 6MWD could be affected by other factors such as loss of muscle tone or arthritis, especially in patients with scleroderma. However, we did not have information available to $\qquad \text{Q11}$ adjust for, and to confirm our hypothesis, we performed regression analysis with the selected metabolites and markers of disease severity. Because a significant number of right heart catheterizations were performed prior to sample collection, which limited our statistical power specifically in the SSc-PAH group, we also performed the same analysis in IPAH patients only and combined IPAH and SSc-PAH. Even though most of our selected metabolites were not significantly associated with hemodynamic markers of right ventricular dysfunction in SSc-PAH only, they became significant when combining both SSc-PAH and IPAH, and we assume that this is due to underpowering in the SSc-PAH group. Future studies with more detailed phenotyping of patients with scleroderma will be needed to validate our findings. Despite these acknowledged limitations, our findings provide more comprehensive molecular insight on the metabolic alterations present in SSc-PAH and their potential role in disease pathobiology. 1046 1047 1048 1049 1050 1051 1052 1053 1054 1055 1056 1057 1058 1059 1060 1061 1062 1063 1064 1065 1066 1067 1068 1069 1070 1071 1072 1073 1074 1075 1076 1077 1078 1079 1080 1081 1082 1083 1084 1085 1086 1087 1088 1089

Interpretation

SSc-PAH is characterized by significant metabolomic alterations that associate with markers of disease severity, which may explain accelerated disease course and contribute to poor response to therapy compared with IPAH. Our observations now offer a more comprehensive metabolic guide to much-needed diagnostic, prognostic, and therapeutic strategies of precision medicine in patients with SSc-PAH.

Acknowledgments 1101

Author contributions: M. A. and M. J. designed the research studies, acquired data, analyzed data, and drafted the manuscript; W. C. N., M. W. P., A. A. D., A. M. B., R. L., and A. R. H. acquired data and drafted the manuscript; N. H. K., J. X.-J. Y., T. F., K. M. K., L. A., and A. M. designed the research studies and drafted the manuscript; J. D. W. $\frac{Q_{16}}{Q_{16}}$ $\frac{Q_{17}}{Q_{17}}$ conducted experiments, designed research
 $\frac{Q_{16}}{Q_{17}}$ $\frac{Q_{17}}{Q_{17}}$ $\frac{Q_{18}}{Q_{17}}$ $\frac{Q_{18}}{Q_{17}}$ $\frac{Q_{19}}{Q_{18}}$ $\frac{Q_{19}}{Q_{19}}$ $\frac{Q_{19}}{Q_{19}}$ studies, and analyzed data; T. L., S. C., and J. S. analyzed data and drafted the manuscript; and S. Y. C. designed the research studies, analyzed the data, drafted the manuscript, and is responsible for the integrity of the work as a whole. Funding/Support: This work was supported by the National Institutes of Health grants 1102 1103 1104 1105 1106 1107 1108 1109 1110 1111 1112 1113 1114912 1115

S10OD020025 and R01ES027595 to M. J.; K01DK116917 to J. D. W.; R01 HL124021 and HL105333 to W. C. N.; R01 HL136603 to A. A. D.; P01 HL108800 and R01 HL142720 to A. R. H.; HL 122596 and HL 124021 to S. Y. C.; R01-HL134168, R01-HL143227, R01- HL142983, and U54-AG065141 to S. C.; and R01-HL155955-01A1 to A. M. B. In addition, Q13 A. Malhotra is funded by the National Institutes of Health. S. Y. C. was also supported by the American Heart Association Established Investigator Award 18EIA33900027. M. A. was supported by a postdoctoral fellowship award from the Chest Foundation. ResMed provided a philanthropic donation to the University of 1116 1117 1118 1119 1120 1121 1122 1123226 1124 1125 1126 1127

- California San Diego. Financial/nonfinancial disclosures: The authors have reported to CHEST the following: S. Y. C. has served as a consultant to United Therapeutics and Acceleron Pharma; has held research grants from Actelion, Bayer, and Pfizer; is a director, officer, and shareholder of Synhale Therapeutics; and has submitted patent applications regarding metabolism in pulmonary hypertension. N. H. K. has served as consultant for Bayer, Janssen, Merck, and United Therapeutics; has received lecture fees for Bayer and Janssen; and has received research support from Acceleron, Eiger, Gossamer Bio, Lung Biotechnology, and SoniVie. A. M. B. served as a consultant to Biogen. A. M. reports income related to medical education from LivaNova, Equillium, and Corvus. K. M. K. received university grant money from Bayer; and served as a consultant for Actelion. None declared (M. A., J. S., M. W. P., W. C. N., A. R. H., J. X.-J. Y., T. F., L. A., A. A. D., R. L., J. D. W., T. L., 1128 1129 1130 1131 1132 1133 1134 1135 1136 1137 1138 1139 1140 1141 1142 1143 1144 1145
- S. C., M. J.). 1146
- Role of sponsors: The sponsor had no role in the design of the study, the collection and analysis of the data, or the preparation of the manuscript. 1147⁰¹⁵ 1148 1149

Other contributions: Samples and/or data from the National Biological Sample and Data Repository for PAH, which receives government support under an investigatorinitiated grant [R24 HL105333] awarded by the National Heart Lung and Blood Institute were used in this study. The authors thank 1150 1151 1152 1153 1154 1155

contributors, including the Pulmonary Hypertension Centers who collected samples used in this study, as well as patients and their families, whose help and participation made this work possible.

Additional information: The [e-Appendix](#page-11-20), [e-Figures](#page-11-20), and [e-Tables](#page-11-20) are available online under "[Supplementary Data](#page-11-20)."

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