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Funding: ELB is funded by NIH R01s FD007627, HL146588, HL163960, HL155278, DK124845, and NIH R61 HL158941. KWP is funded by NIH R01s HL158795 and HL162927.

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Abstract

Background: Mitochondrial dysfunction, characterized by impaired lipid metabolism and heightened reactive oxygen species (ROS) generation, results in lipid peroxidation-induced ferroptosis. Ferroptosis is an inflammatory mode of cell death as it both promotes complement activation and recruits macrophages. In pulmonary arterial hypertension (PAH), pulmonary arterial endothelial cells exhibit disrupted lipid metabolism and increased ROS production, and there is ectopic complement deposition and inflammatory macrophage accrual in the surrounding vasculature. However, the integrative effects of ferroptosis on metabolism, cellular landscape changes in the lung, complement induction, and pulmonary vascular remodeling are unknown.

Methods: Multi-omics analyses in rodents and a genetic association study in humans evaluated the role of ferroptosis in PAH.

Results: Ferrostatin-1, a small-molecule ferroptosis inhibitor, mitigated PAH severity and improved right ventricular function in monocrotaline rats. RNA-seq and proteomics analyses demonstrated ferroptosis was induced with increasingly severe PAH. Metabolomics and proteomics data showed ferroptosis inhibition restructured lung metabolism and altered phosphatidylcholine and phosphatidylethanolamine levels. RNA-seq, proteomics, and confocal microscopy revealed complement activation and pro-inflammatory cytokines/chemokines were suppressed by ferrostatin-1. Additionally, ferrostatin-1 combatted changes in endothelial, smooth muscle, and interstitial macrophage abundances and gene activation patterns in the lungs as revealed by deconvolution RNA-seq. Finally, the presence of six single-nucleotide polymorphisms in ferroptosis genes were independently associated with pulmonary hypertension severity in the Vanderbilt BioVU repository.

Conclusions: Rodent and human data nominate ferroptosis as a PAH regulating pathway via its ability to modulate lung lipid metabolism, repress pathogenic complement activation, dampen interstitial macrophage infiltration, and restore the lung cellular environment.

Introduction

The accumulation of iron-dependent lipid peroxides induces ferroptosis, a nonapoptotic form of cell death that integrates metabolic derangements, oxidative stress, and inflammation[1]. Multiple organelles regulate ferroptosis, but the mitochondria may be the most important   because mitochondria both initiate and propagate ferroptosis[1]. Altered ferroptosis homeostasis occurs in multiple disease states including cancer, sepsis, cardiovascular diseases, and aging, showing the broad implications this mode of cell death has in medicine[1]. The discovery of ferrostatin-1[2] and liproxstatin-1[3], two small molecule inhibitors of ferroptosis, greatly expanded our knowledge of ferroptosis as these molecules exert therapeutic effects in a wide-array of conditions[1]. In the systemic vasculature, ferroptosis induces endothelial cell dysfunction and accelerates atherosclerosis development in mice, and importantly this is suppressed by ferrostatin-1 treatment[4]. In pulmonary arterial hypertension (PAH), pulmonary arterial endothelial cell dysfunction, characterized by disrupted mitochondrial function and impaired iron and lipid metabolism[5], sets up a potentially pro-ferroptotic environment. Small molecule and genetic interventions that suppress ferroptosis reduce PAH severity in rodents[6-8], however a deeper mechanistic understanding of the role of ferroptosis in lung mitochondrial regulation and metabolism is needed to determine how ferroptosis may impact PAH pathogenesis.

In addition to being driven by disrupted metabolism, ferroptosis is a pro-inflammatory mode of cell death[9] that has the potential to drive adverse pulmonary vascular remodeling via modulation of the innate immune system. Ferroptotic cells release damage associated molecular patterns (DAMPs)[9], which can promote ectopic complement deposition[10], a finding present in rodent and human PAH[11]. DAMPs also recruit monocyte derived-macrophage to areas of tissue damage[12], which can further amplify the deleterious pro-inflammatory state. In rodent and human PAH, there is expansion of inflammatory interstitial macrophages, and blocking interstitial macrophage invasion into the lungs dampens PAH severity[13]. At present, the effects of ferroptosis on complement activation and macrophage recruitment in the lungs are unexplored.

To address these important unknowns, we employed a drug intervention approach in translational rodent studies and used quantitative lung proteomics, bulk and deconvolution RNA-sequencing, lung metabolomics, and a human genetic association study to evaluate how ferroptosis modulates lung metabolism, inflammation, and PAH severity.

Results

Ferroptosis Inhibition Mitigated Pulmonary Vascular Remodeling and Improved Right Ventricular Function in Monocrotaline Rats

We first evaluated the physiological effects of ferroptosis in monocrotaline (MCT) rats using a translational approach by starting treatment two weeks after MCT injection. Ferrostatin-1 imparted important therapeutic effects as it increased pulmonary artery acceleration time, reduced right ventricular systolic pressure (RVSP) and end-arterial elastance (Ea), and suppressed small pulmonary arterial remodeling (**Figure 1 A-D**). Accordingly, right ventricular (RV) function as defined by Ees/Ea, tricuspid annular plane systolic excursion (TAPSE), and RV free wall thickening were all improved with ferrostatin-1 (**Figure 1 E-F**). The summation of these data show ferroptosis inhibition combatted pulmonary vascular remodeling and augmented RV function.

RNA-Sequencing and Lung Mitochondrial Proteomics Analyses Identified Links Between Ferroptosis and Pulmonary Hypertension Severity

Next, we used RNA-sequencing and quantitative proteomics analyses of lung samples to perform an unbiased assessment of pathways that were dysregulated as PAH severity increased. Ferroptosis was the second most enriched pathway when delineating pathways associated with higher with Ea (**Figure 2A**). Correlational heatmapping identified multiple positive and significant associations between ferroptotic transcripts and Ea (**Figure 2B and C**). When evaluating pathways induced by higher RVSP, the ferroptosis pathway was not identified in our unbiased assessment (**Supplemental Figure 1**). However, correlational heatmapping demonstrated several ferroptotic transcripts were positively associated with RVSP (**Supplemental Figure 1**).

In our proteomics analysis, multiple metabolic pathways were dysregulated as PAH severity increased. Moreover, the ferroptosis pathway was enriched with increasing Ea and RVSP (**Figure 2 D and G**). Correlational heatmapping identified relationships between multiple ferroptotic proteins and Ea /RVSP (**Figure 2 E and H**). In particular, there were positive correlations between the pro-ferroptotic proteins, voltage-dependent anion-selective channel proteins 2 and 3 (VDAC 2/3), heme oxygenase 1 (HMOX1), and acyl-CoA synthetase long chain family members 1 and 5 (ACSL1/5) and Ea/RVSP (**Figure 2 F and I**). Conversely, the

anti-ferroptotic protein poly(rC)-binding protein 2 was negatively associated with Ea and RVSP (**Figure 2 F and I**).

Ferrostatin-1 Restructured the Lung Lipidomic Signature

Because our proteomics analysis identified multiple metabolic pathways were associated with pulmonary hypertension severity, we performed a combined metabolomics/lipidomics analysis of whole lung extracts. Both hierarchical cluster analysis and sparse least squares discriminate analysis identified differences in the overall metabolomics/lipidomic signature when the three experimental groups were compared (**Figure 3 A and B**). Random forest classification identified 15 metabolites that differentiated the three groups, and these variables were predominantly lipid species and one amino acid: (glycine) (**Figure 3C**). We subsequently used hierarchical cluster analysis to evaluate ferrostatin-1's effects on three major lipid classes: phophatidylcholines/lysophosphatidylcholines (PC/LPC), phosphatidylethanolamine/ lysophosphatidylethanolamine (PE/LPE), and phosphatidylserine/lysophosphatidylserine (PS/LPS) as these lipids had the most significant differences when the three groups were compared. The most dramatic effects of ferrostatin-1 were on PC/LPC and PE/LPE. Ferrostatin-1 increased multiple PC/LPC species but reduced nearly all PE/LPE (**Figure 3 D and E**). The effects of ferrostatin-1 on PS/LPS were less robust (**Figure 3F**). When profiling amino acids, we found all amino acids other than glycine were elevated in MCT-Veh lungs, which was mostly mirrored in the ferrostatin-1 treatment animals with the exception of valine (**Figure 3G**). Thus, ferroptosis inhibition appeared to have the greatest effect on lung lipid metabolism.

Ferroptosis Inhibition Suppressed Classical Complement Activation and Cytokine Signaling

Next, we probed our ferroptosis-inflammatory hypothesis, which we proposed is mediated by complement activation, by interrogating the coagulation/complement pathway using RNA-seq, proteomics, and immunofluorescence approaches. Hierarchical cluster analysis of RNA-seq data revealed ferrostatin-1 treatment blunted the upregulation of several coagulation/complement transcripts (**Figure 4A**). Correlational heatmapping displayed strong associations between multiple complement transcripts and RVSP and Ea (**Figure 4 B-E**). The transcript abundance of C1QA and C1QB were both correlated with Ea and RVSP (**Figure 4 C and E**). When this pathway was evaluated in our proteomic data, we found ferroptosis inhibition prevented

the upregulation of multiple complement proteins (**Figure 4F**). Correlational heatmapping showed multiple classical complement pathway proteins were associated with RVSP and Ea (**Figure 4 G-J**). To better understand how ferrostatin-1 modulated complement activation in the lungs, we used confocal microscopy to visualize perivascular complement deposition. In agreement with our proteomics and transcriptomics data, perivascular C3 levels in MCT-Veh lungs were significantly elevated as compared to controls, but this response was mitigated by ferrostatin-1 (**Figure 4 K and L**).

Because complement promotes cytokine and chemokine release, we evaluated how ferrostatin-1 impacted the lung inflammatory/cytokine signaling pathway in our RNAseq data. Hierarchical cluster analysis showed ferrostatin-1 reduced the abundance of multiple transcripts in the inflammatory/cytokine pathway as compared to MCT-Veh (**Figure 4M**). In particular, ferrostatin-1 reduced transcript abundance of nodal growth differentiation factor (NODAL), a secreted ligand of the transforming growth factor-beta superfamily of proteins, the transcript that exhibited the strongest relationship with Ea (**Figure 4 N and O**). In addition, ferrostatin-1 lowered transcript levels of tumor necrosis factor receptor superfamily member 11a (TNFRSF11A), a member of the tumor necrosis factor family whose transcript levels were associated with PAH severity (**Figure 4   N and O**). Finally, levels of the pro-inflammatory chemokines including C-X-C motif chemokine ligands (CXCL) 6/10 and C-C motif chemokine ligands (CCL) 9/21 were reduced with ferrostatin-1 (**Figure 4N**). Importantly, CXCL10 and CCL21 levels were positively associated with Ea (**Figure 4O**).

Deconvolution RNA-seq Analysis Revealed Ferrostatin-1 modulated endothelial cell, smooth muscle cell, interstitial macrophage abundance and metabolic and inflammatory phenotypes

To define how ferrostatin-1 modulated the cellular landscape of the pulmonary vasculature, we performed deconvolution RNA-seq analysis to define the changes in cell populations and pathways that were impacted by ferroptosis inhibition. All three experimental groups exhibited distinct cellular compositions in the lungs, and the composition in the ferrostatin-1 treated animals was an intermediate between control and MCT-Veh (**Figure 5A, Supplemental Table 1**). Correlational heatmapping identified relationships between cell types and Ea and RVSP (**Figure 5 B and C**). Cells known to underlie PAH pathobiology including smooth muscle cells, endothelial cells, and interstitial macrophages were strongly associated with Ea and RVSP.

Smooth muscle cells had the most robust correlational relationship with RVSP and Ea. Importantly, ferrostatin-1 treatment mitigated the increase in lung smooth muscle cells when compared to MCT-Veh rats (**Figure 5 D**). Additionally, there were differences in endothelial cell populations when comparing control and MCT-Veh rats (**Figure 5 E and F**). Overall, ferroptosis inhibition partially prevented the reduction of endothelial cells in the EA1 population and the increase in EA2 population. However, the reduction in EA1 as opposed to the increase in EA2 cells was more significantly associated with PAH severity (**Figure 5 E and F**). Additionally, greater abundances of interstitial macrophages were associated with more severe PAH as MCT-Veh rats had the highest numbers of interstitial macrophage (**Figure 5G**). Importantly, ferroptosis inhibition lowered interstitial macrophage numbers as compared to MCT-Veh (**Figure 5G**). Finally, pathway analysis delineated how ferrostatin-1 modulated the transcriptional environment in highly abundant cells. Ferroptosis inhibition suppressed the activation of multiple pathways in both endothelial cells and macrophages. In both cell types, changes in the DNA damage, cellular replication (PI3K,/AKT/MTOR signaling and mitotic spindle), heme metabolism, and lipid handling (adipogenesis) pathways were observed (**Figure 5H**).

Presence of single-nucleotide polymorphisms in ferroptosis genes was associated with more severe pulmonary hypertension

Finally, we evaluated how the presence of single-nucleotide polymorphisms (SNPs) in ferroptosis genes impacted noninvasive and invasive measures of pulmonary hypertension in a mixed cohort of patients evaluated at the Vanderbilt BioVU biorepository. The presence of six SNPs in ferroptosis genes (**Supplemental Table 2**) were associated with more severe pulmonary hypertension, however the overall frequency was low. Therefore, we pooled all six SNPs and compared how carriers of ferroptosis SNPs compared to those lacking potentially pathogenic SNPs. In an unadjusted analysis, carriers had significantly higher right ventricular systolic pressure [Carriers: 63.9 (45.0-80.6), Noncarriers 46.8 (35.0-62.0)] as determined by echocardiography (**Figure 6A**). Furthermore, invasively measured mean pulmonary arterial pressure [Carriers: 40.0 (25.0-51.0), Noncarriers 31.0 (22.0-41.0)], and pulmonary vascular resistance [Carriers: 4.3 (2.4-6.9), Noncarriers 2.6 (1.7-4.6)] were higher in those harboring ferroptosis SNPs (**Figure 6 B-C**). Because this was a mixed cohort, we performed a multivariate regression analysis and even after

correcting for age, sex, presence of heart failure and chronic obstructive pulmonary disease; ferroptotic SNPs were independently associated with higher RVSP, mPAP, and PVR (**Figure 6 D-E**). Thus, we provide human data demonstrating associations between ferroptosis and pulmonary hypertension severity .

Discussion

In summary, our translational rodent studies show small molecule inhibition of ferroptosis mitigates PAH and improves right ventricular function in MCT rats. Transcriptomics and proteomics analyses demonstrate a relationship between ferroptosis induction and PAH, which provides unbiased data to support our physiological findings. Our metabolomics/lipidomics experiments suggest ferrostatin-1 most robustly modulates lung lipid metabolism with particular changes in phophatidylcholines and phosphatidylethanonlamines species. In the pulmonary vasculature, suppression of ferroptosis alters endothelial and pulmonary artery smooth muscle cell numbers and gene activation patterns. Additionally, ferrostatin-1 mitigates pathological immune activation in the lung by suppressing perivascular complement deposition, lowering cytokines and chemokines, and reducing interstitial macrophage abundance. Finally, human studies reveal the presence of SNPs in ferroptosis genes is associated with more severe pulmonary vascular disease burden, and that association remains even after adjusting for relevant clinical co-morbid conditions. Our proposed model is ferroptotic pulmonary endothelial cell releases DAMPs that activate complement and recruit pro-inflammatory macrophage. These changes in-turn promote pulmonary artery smooth muscle cell proliferation and subsequent pulmonary hypertension (**Figure 7**).

Our findings that ferroptosis induces both metabolic derangements and pathological inflammation in the lungs has potential to link two heavily implicated molecular phenotypes in PAH pathology to one targetable pathway. In PAH, derangements in lung metabolism including altered fatty acid oxidation[14,15], heightened anaerobic glucose metabolism[16], and disrupted amino acid utilization[17-19] are well documented. Interesting, ferroptosis has the potential to impact several catabolic pathways via its ability to suppress electron transport chain activity[20], a final common pathway for nearly all metabolic processes. While targeting specific metabolic arms including suppression of fatty acid oxidation[14] and activation of glucose oxidative metabolism[21] have robust therapeutic effects in preclinical PAH, the translation of these studies to humans has not been met with overwhelming success[22]. Perhaps, targeting just one isolated branch of metabolism is insufficient to counteract human PAH pathogenesis, and more broad-based metabolic interventions, such as ferroptosis inhibition, would garner greater success. The observation that ferroptosis antagonism also combats ectopic complement activation, lowers levels of several cytokines/chemokines, and mitigates macrophage infiltration suggests its anti-inflammatory properties conferred beneficial effects in the pulmonary vasculature. While there is strong

data showing many individual cell types or cytokines/chemokines promote PAH in rodents[23]; unfortunately the translation of these findings to humans has not been as fruitful as desired. In particular, antagonism of interleukin-6 signaling with tocilizumab[24] or depletion of B-cells with rituximab[25] did not significantly change PAH severity in small clinical trials. Perhaps suppressing an individual cytokine or immune cell type may not be the most effective therapy in humans as the available data suggests there is widespread immune activation in PAH[23]. Moreover, the cross-talk between immune cells and pulmonary vascular cells is crucial in PAH progression as there is greater immune-pulmonary vascular interactions in hereditary PAH as compared to idiopathic PAH, and this finding correlates with hemodynamic severity[26]. Because our data suggests ferroptosis both dampens mitochondrial metabolism and initiates innate immune system activation in the pulmonary vasculature, approaches to counteract ferroptosis may lead to greater translational success in future studies.

While our study shows ferrostatin-1 mitigates PAH severity in MCT rats, there are additional preclinical and human data that support our hypothesis that ferroptosis promotes pulmonary hypertension. First, several ferropto   sis-suppressing molecules exhibit therapeutic efficacy in relevant preclinical models of pulmonary vascular disease including MCT rats, Sugen-hypoxia rats, chronic hypoxia rats, and lambs with persistent pulmonary hypertension of the newborn (**Table 1**). In addition, KEGG pathway analysis of upregulated transcripts in PAH endothelial cells analyzed by single cell RNA-seq[27] identifies ferroptosis as the pathway with the greatest enrichment (**Supplemental Figure 2**). Furthermore, a proteomic study shows there is a 35% reduction in glutathione peroxidase-4, an anti-ferroptotic protein, in pulmonary arterial endothelial cells from PAH patients[28]. Finally, there are higher systemic levels of lipid peroxidation in PAH patients as urinary abundance of isoprostaglandin F2a are significantly higher than controls[29]. The summation of our data, other published work, and human studies suggests ferroptosis may be a targetable pathway to suppress adverse pulmonary vascular remodeling.

In our proteomics analysis of the lungs, we highlighted differences in multiple metabolic pathways with ferroptosis inhibition. However, the metabolomics/lipidomics analysis suggested the greatest effect of ferrostatin-1 was on lipid metabolism. In particular, ferrostatin-1 increases levels of multiple phosphatidylcholines (**Figure 3**), which may have direct relevance to mitochondrial function because phosphatidylcholines are a major component of the mitochondrial membrane system[30]. Perhaps the greater

concentrations of phosphatidylcholines contributes to the proteomic changes in other metabolic pathways via the stabilization and preservation of mitochondria. In addition, phosphatidylcholines are required for inner membrane protein translocases in the mitochondria[30]. A change in phosphatidylcholines could also alter mitochondrial protein stability as matrix and inner membrane proteins may not be properly trafficked into the mitochondria in the PAH lung due to the dysregulation of phosphatidylcholines. Additionally, ferrostatin-1 lowered the levels of nearly all phosphatidylethanolamines profiled (**Figure 3**). This may be an important feedback mechanism to mitigate ferroptosis because peroxidation of phosphatidylethanolamine is crucial for ferroptosis initiation[31]. Surprisingly, ferrostatin-1 had almost no effect on lung amino acid abundances with the exception of reducing levels of valine, a branched chain amino acid. While amino acids regulate ferroptosis homeostasis in other conditions[32], our data suggests amino acids do not   play a dominant role in ferroptosis induction in PAH. In conclusion, the strongest effects of ferrostatin-1 on lung metabolism appears to be on lipid homeostasis, and these changes may underlie some of the beneficial physiological effects of ferroptosis antagonism.

Our deconvolution RNA-seq analysis identifies changes in endothelial cell, smooth muscle cell, and interstitial macrophage number and gene activation patterns. However, other immune cell types undoubtedly contribute to pulmonary vascular remodeling, but our approach was not sensitive enough to detect changes in these lower abundant immune cell populations. Certainly, there is literature demonstrating T-cells[33] and B-cells[34] play important roles in pulmonary vascular remodeling, however we did not detect changes in these cell populations with ferroptosis inhibition (**Supplemental Table 1**). In addition, we did not see a profound change in mast cell numbers with ferrostatin-1 treatment (**Supplemental Table 1**). With the limitations of our approach, it appears ferroptosis inhibition exerted the greatest effects on endothelial cells, smooth muscle cells, and recruited macrophage.

Our work has important limitations that we must acknowledge. First, we used whole lung tissue in our proteomics and metabolomics analyses, and defining what cell types are contributing to the observed changes can not be determined. We tried to overcome some of these limitations by using deconvolution RNA-seq to define changes in cell numbers and gene activation patterns. Moreover, our SNP analysis was conducted in a mixed population of patients and not only in PAH patients. When we mined the UK Biobank, our proposed pathogenic SNPs were in very low abundance, and they were not associated with differences in PAH severity

(data not shown). There are at least three potential reasons for the lack of congruent findings including 1) sample size, 2) ferroptosis may have a differing role in all distinct PAH etiologies, or 3) it may due to differences in ethnicities and genetic lineages between the two cohorts. In support of hypothesis 3, we found distinct racial differences when comparing ferroptosis SNP carriers (greater proportion of blacks) to those lacking SNPs in the BioVU cohort (**Supplemental Table 3**)

Figure 1: Ferrostatin-1 Treatment Combatted Pulmonary Hypertension Severity and Improved Right Ventricular Function in Monocrotaline Rats. (A) Ferrostatin-1 treatment increased pulmonary artery acceleration time in MCT rats (Con: 26±1, MCT-V: 16±1, MCT-Fer-1: 21±1 ms). (B) Ferroptosis inhibition with ferrostatin-1 reduced right ventricular systolic pressure (RVSP) (Con: 21±1, MCT-V: 69±7, MCT-Fer-1: 46±2 mmHg), *p*-values determined by Kruskal-Wallis test (C) End-arterial elastance (E_a) was lowered by ferroptosis inhibition (Con: 0.08±0.02, MCT-V: 0.40±0.04, MCT-Fer-1: 0.25±0.02 mmHg/μL), *p*-values determined by Kruskal-Wallis test. (D) Small vessel pulmonary arterial remodeling was blunted by ferrostatin-1 [Median, (25th-75th%), Con: 25.8, (21.5-29.3), MCT-V: 43.8, (38.5-49.5), MCT-Fer-1: 23.9%, (20.5-34.7), *p*-values determined by Kruskal-Wallis test]. (E) Ferrostatin-1 treated improved right ventricular-pulmonary artery coupling (E_{es}/E_a) (Con: 1.3±0.2, MCT-V: 0.37±0.04, MCT-Fer-1: 0.88±0.08, *p*-values determined by Brown-Forsythe and Welch ANOVA test), TAPSE (F), and RV free wall thickening (G).

Figure 2: Lung RNAsequencing and Proteomics Analyses Identified Associations Between Ferroptosis and Pulmonary Hypertension Severity. (A) Pathway analysis of transcripts significantly associated with Ea. (B) Correlational heat mapping of ferroptosis pathway transcripts and Ea. (C) Ten transcripts most strongly associated with Ea. (D) Pathway analysis of proteins significantly associated with Ea. (E) Correlational heat map of ferroptosis proteins with Ea. (F) Ferroptosis proteins most strongly associated with Ea. (G) Pathway analysis of proteins significantly associated with right ventricular systolic pressure (RVSP). (H) Correlational heat map of ferroptosis proteins and RVSP. (I) Ten most strongly associated proteins with RVSP.

Figure 3: Combined Metabolomics/Lipidomics Profiling of Whole Lungs Identified Changes in Lipid Metabolism with Ferrostatin-1. (A) Hierarchical cluster analysis of the most divergently regulated 250 metabolites in the lungs. (B) Sparse least squares discriminant analysis highlighted differences in the three experimental groups. (C) Random forest classification identified the top 15 most important metabolites for differentiating the three groups. Lipid species dominated the changes in the lung. (D) Hierarchical cluster analysis of lysophophatidylcholines (LPC) and phosphitidylcholines (PC). Ferrostatin-1 treatment increased a subpopulation of LPC and PC. (E) Hierarchical cluster analysis showed ferrostatin-1 reduced almost all LPE/PE species. Lung LPS+PS (F) and amino acids (G) levels were minimally altered by ferrostatin-1 treatment as compared to MCT-Vehicle. CE: Cholesterol ester, HxCer: Hexosylceramide, PE: phosphatidylethanolamine, LPC: Lysophophatidylcholine, PC: Phosphatidylcholine, PS: Phosphatidylserine, PA: Phosphatidic acid.

Figure 4: Ferroptosis Mitigated Complement Activation and Cytokine Signaling in the Lungs of MCT Rats (A) Hierarchical cluster analysis of transcripts in the complement coagulation pathway. Ferrostatin-1 reduced levels of many transcripts as compared to MCT-Veh. (B) Correlational heat map of complement/coagulation transcripts with Ea. (C) Identification of 10 transcripts most strongly associated with Ea. Classical complement components C1Qa and C1Qb were higher as Ea increased. (D) Correlational heat map of complement/coagulation transcripts with RVSP. (E) Ten transcripts most strongly associated with RVSP. (F) Hierarchical cluster analysis of proteins in the complement/coagulation cascade. (G) Correlational heat map of complement/coagulation proteins with Ea. (H) Identification of 10 proteins most strongly associated with Ea. (I) Correlational heat map of complement/coagulation proteins with RVSP. (J) Identification of 10 proteins most strongly associated with RVSP. (K) Representative confocal micrographs showed increased complement deposition around the pulmonary vasculature in MCT-Vehicle, which was mitigated by ferrostatin-1. (L) Quantification of perivascular C3 intentisty. *p*-values determined by Kruskal-Wallis test and Dunn's multiple comparisons test. (M) Hierarchical cluster analysis of the inflammatory/cytokine pathway form lung extracts. (N) Random forest classification shows multiple inflammatory cytokines are reduced by ferrostatin-1 treatment and that helps differentiate the three groups. (O) 15 inflammatory/cytokine transcripts that were most strongly associated with Ea. Red boxes outline classical complement components.

A Transcriptomics Analysis of Complement/Coagulation

B Transcriptomics Correlates of Ea

C 10 Transcripts Most Strongly Associated with Ea

p-value

CFD — 0.05
F2RL3 — 0.05
SERPINA1 — 0.032
C1QB — 0.005
C1QA — 0.005
VSIG4 — 0.002
BDKRB1 — 0.002
FGA — 0.002
SERPINC1 — 0.0004
SERPINE1 — 0.0001

Pearson *r*-value

D Transcriptomics Correlates of RVSP

E 10 Transcripts Most Strongly Associated with RVSP

p-value

C8G — 0.008
F2RL3 — 0.007
SERPING1 — 0.007
BDKRB1 — 0.007
SERPINE2 — 0.005
CFD — 0.004
SERPINA1 — 0.003
SERPINE1 — 0.0003
C1QB — 0.0001
C1QA — <0.0001

Pearson *r*-value

F Proteomics Analysis of Complement/Coagulation

G Proteomics Correlates of Ea

H 10 Proteins Most Strongly Associated with Ea

p-value

CPB2 — 0.03
ITGB2 — 0.02
FGG — 0.009
SERPINC1 — 0.008
CFHR1 — 0.006
C5 — 0.006
C1QB — 0.004
F10 — 0.003
ITGAX — 0.006
C5AR1 — 0.0001

Pearson *r*-value

I Proteomics Correlates of RVSP

J 10 Proteins Most Strongly Associated with RVSP

p-value

CD59 — 0.02
SERPINC1 — 0.02
F10 — 0.02
C5AR1 — 0.01
VWF — 0.01
C5 — 0.01
C2 — 0.003
FGG — 0.001
C1QB — <0.0001
CFHR1 — <0.0001

Pearson *r*-value

K

Control   MCT-Veh
α-actin   C3
MCT-Fer-1
40 μm

L

Relative Peri-Vascular C3 Intensity (AU)

>0.9999
0.0183
0.0110

Control   MCT-Veh   MCT-Fer-1

M

Con   MCT-Fer-1   MCT-Veh

N

EDA2R
LEPR
CCL9
TNFRSF11A
CXCL10
IL17RB
CSF2RB
IL1RL1
IL24
NODAL
PF4
CXCL6
IL23A
ACKR4
CCL21

MeanDecreaseAccuracy

Control
MCT-Fer-1
MCT-Veh

High
Low

O 15 Inflammatory/Cytokine Transcripts Most Strongly Associated with Ea

p-value

CXCL11 — 0.04
IL17RB — 0.03
ACKR4 — 0.03
TNFSF10 — 0.03
TNFRSF11A — 0.03
IL17B — 0.02
CCL21 — 0.02
IL6 — 0.02
CCL2 — 0.01
LIFR — 0.006
IL20 — 0.004
CSF3 — 0.003
GDF3 — 0.001
CXCL10 — 0.001
NODAL — 0.0002

Pearson *r*-value

Figure 5: Deconvolution RNA-sequencing Demonstrated Ferroptosis Inhibition Modulated Endothelial, Smooth Muscle, and Interstitial Macrophage Abundance and Gene Activation Patterns. (A) Map of cell type abundances in control, MCT-Veh, and MCT-Fer-1 animals as determined by deconvolution RNAseq. Correlational heat mapping identified relationships between cell type abundances and Ea (B) and RVSP (C). Relationships between smooth muscle cell abundance and Ea and RVSP. (D) Relationships between endothelial cell population 1 (EA1) and Ea and RVSP. (F) Relationships between endothelial cell population 2 (EA2) and Ea and RVSP. (G) Relationships between interstitial macrophage population and Ea and RVSP. (H) Pathway analysis of transcriptomic changes in endothelial cells, macrophage, and total cells with ferrostatin-1 treatment.

Figure 6: Presence of SNPs in Ferroptosis Regulating Genes Was Associated With More Severe Pulmonary Hypertension. (A) Patients harboring SNPs in ferroptosis genes had higher right ventricular systolic pressures [Carriers: 63.9 (45.0-80.6), Noncarriers 46.8 (35.0-62.0), median (25th-75th percentiles)] as determined by echocardiography, (B) invasively measured mean pulmonary arterial pressure [Carriers: 40.0 (25.0-51.0), Noncarriers 31.0 (22.0-41.0), median (25th-75th percentiles)], and pulmonary vascular resistance [Carriers: 4.3 (2.4-6.9), Noncarriers 2.6 (1.7-4.6), median (25th-75th percentiles)] as determined by invasive hemodynamic studies (C). *p*-values as determined by Mann-Whitney U-test. Forest plots depicted correlational co-efficient with standard errors and calculated *p*-values when RVSP (D), mPAP (E), and PVR (F) were modeled in multivariate regression analysis.

Figure 7: Proposed Model for the Pathogenic Role of Ferroptosis in Adverse Pulmonary Cascular Remodeling

Table 1: Numerous Ferroptosis Suppressing Drugs Combat Pulmonary Hypertension in Multiple Preclinical Models

Small Molecules	Proposed Mechanisms of Ferroptosis Suppression	Animal Models With Therapeutic Effects
AICAR and metformin	AMPK Activation	Chronic hypoxia-induced pulmonary hypertension in rats, sugen-hypoxia induced pulmonary hypertension, monocrotaline rats[35]
Apocyin	Reduces reactive oxygen species required for lipid peroxidation in the NOX family of proteins	Lambs with persistent pulmonary hypertension of the newborn[36]
Deferoxamine	Iron chelation to prevent iron-dependent lipid peroxidation	Chronic hypoxia-induced pulmonary hypertension in rats[37]
MK866	Inhibits lipoxygenase-mediated lipid peroxidation	Chronic hypoxia-induced pulmonary hypertension in rats[38]
Rosiglitazone/pioglitazone	Antagonizes ACSL4-induced conversion of free fatty acids into fatty CoA esters that then become peroxidated	Monocrotaline rats, sugen-hypoxia rats, chronic hypoxia rats, ApoE$^{-/-}$ mice, transgenic TGFβ1 mice[39]
Rapamycin	mTOR Suppression	Monocrotaline-induced pulmonary hypertension in rats, chronic hypoxia-induced pulmonary hypertension in mice and rats, Sugen-hypoxia rats[40]
Vildagliptin	Blocks DPP4-mediated lipid peroxidation	Monocrotaline-induced pulmonary hypertension in rats, chronic hypoxia-induced pulmonary hypertension in rats[41]
Zileuton	Inhibits lipoxygenase-mediated lipid peroxidation	Monocrotaline pulmonary hypertension[42]

Abbreviations: AMPK: Adenosine monophosphate activate protein kinase NOX: NADPH oxidases, ACSL4: acyl-CoA synthetase long-chain family member 4, mTOR: mammalian target of rapamycin, DPP4: dipeptidyl-dippeditase-4,

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