#### **RESEARCH**



# **Gene Regulation of Neutrophils Mediated Liver and Lung Injury through NETosis in Acute Pancreatitis**

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#### **Abstract**

Acute pancreatitis (AP) is one of the most common gastrointestinal emergencies, often resulting in self-digestion, edema, hemorrhage, and even necrosis of pancreatic tissue. When AP progresses to severe acute pancreatitis (SAP), it often causes multi-organ damage, leading to a high mortality rate. However, the molecular mechanisms underlying SAP-mediated organ damage remain unclear. This study aims to systematically mine SAP data from public databases and combine experimental validation to identify key molecules involved in multi-organ damage caused by SAP. Retrieve transcriptomic data of mice pancreatic tissue for AP, lung and liver tissue for SAP, and corresponding normal tissue from the Gene Expression Omnibus (GEO) database. Conduct gene diferential analysis using Limma and DEseq2 methods. Perform enrichment analysis using the clusterProfler package in R software. Score immune cells and immune status in various organs using single-sample gene set enrichment analysis (ssGSEA). Evaluate mRNA expression levels of core genes using reverse transcription-polymerase chain reaction (RT-PCR) and immunohistochemistry. Validate serum amylase, TNF- $\alpha$ , IL-1 $\beta$ , and IL-6 levels in peripheral blood using enzyme-linked immunosorbent assay (ELISA), and detect the formation of neutrophil extracellular traps (NETs) in mice pancreatic, liver, and lung tissues using immunofuorescence. Diferential analysis reveals that 46 genes exhibit expression dysregulation in mice pancreatic tissue for AP, liver and lung tissue for SAP, as well as peripheral blood in humans. Functional enrichment analysis indicates that these genes are primarily associated with neutrophil-related biological processes. ROC curve analysis indicates that 12 neutrophil-related genes have diagnostic potential for SAP. Immune infltration analysis reveals high neutrophil infltration in various organs afected by SAP. Single-cell sequencing analysis shows that these genes are predominantly expressed in neutrophils and macrophages. FPR1, ITGAM, and C5AR1 are identifed as key genes involved in the formation of NETs and activation of neutrophils. qPCR and IHC results demonstrate upregulation of FPR1, ITGAM, and C5AR1 expression in pancreatic, liver, and lung tissues of mice with SAP. Immunofuorescence staining shows increased levels of neutrophils and NETs in SAP mice. Inhibition of NETs formation can alleviate the severity of SAP as well as the levels of infammation in the liver and lung tissues. This study identifed key genes involved in the formation of NETs, namely FPR1, ITGAM, and C5AR1, which are upregulated during multi-organ damage in SAP. Inhibition of NETs release efectively reduces the systemic infammatory response and liver-lung damage in SAP. This research provides new therapeutic targets for the multi-organ damage associated with SAP.

**Keywords** Acute pancreatitis · Multi-organ damage in severe acute pancreatitis · Neutrophil extracellular traps (NETs) · FPR1 · ITGAM · C5AR1

# **Introduction**

AP is a common infammatory disease of the exocrine pancreas, characterized by acute infammation of the pancreas and histological destruction of acinar cells. It is one of the

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common gastrointestinal emergencies. In recent years, the global incidence of pancreatitis has been on the rise, with a global incidence of 30–40 cases per 100,000 population annually [[1\]](#page-16-0). Approximately 80% of patients present with mild acute pancreatitis (MAP), which is relatively mild and can be rapidly improved with appropriate fuid resuscitation, pain management, and early enteral nutrition. However, about 20% of patients will progress from local involvement to systemic organ and system involvement, becoming SAP

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[\[2](#page-16-1)]. SAP is characterized by critical illness, multiple complications, and a high mortality rate, with hospital mortality rates ranging from 13% to 35% [[3](#page-16-2)]. However, the mechanism of multi-organ damage associated with SAP remains unclear. Therefore, understanding its epidemiology, risk factors, pathophysiology, and potential mediators is crucial for the prognosis and management of AP patients.

Acute lung injury (ALI) is the earliest and most common complication of SAP. It is characterized by difuse damage to pulmonary microvascular endothelial cells and alveolar epithelial cells, increased permeability of the microvascular basement membrane, and exudation of protein-rich edema fuid into the interstitium or alveoli. Its main clinical manifestations are refractory hypoxemia and respiratory failure, with a mortality rate of approximately 60%–70%, making it one of the leading causes of death in SAP patients [\[4](#page-16-3)[–7](#page-16-4)]. However, the mechanism by which severe pancreatitis leads to ALI remains unclear, and efective interventions to mitigate lung injury are lacking. Additionally, due to the blood leaving the pancreas being processed by the liver before returning to the heart, the liver often sufers damage from extra-pancreatic organs. As early as 1984, Blamey et al. reported liver damage in 80% of AP patients, with the severity of liver damage positively correlated with the progression of AP [\[8](#page-16-5)]. Clinically, liver damage is an important indicator of the severity of AP and has signifcant prognostic value for AP [\[9](#page-16-6), [10\]](#page-16-7). In SAP models, elevated levels of serum alanine aminotransferase and aspartate aminotransferase have long been considered evidence of liver damage. Although the liver has compensatory function, liver damage remains a serious, and even fatal, complication in the development of severe pancreatitis.

Neutrophils serve as the frontline defense against microbial pathogens, protecting the body from invasion. However, excessive activation of neutrophils can also mediate tissue damage and sterile infammation. Recent studies have found that neutrophils play a central role in the development of SAP. In the early stages of SAP, the infammatory response is primarily mediated by neutrophils [[11\]](#page-16-8). During SAP, pancreatic cell damage leads to abnormal activation of pancreatic proteases, which generate sterile infammatory signals recruiting neutrophils to the pancreas and releasing cytokines and chemokines. Meanwhile, activated neutrophils prolong their lifespan and release reactive oxygen species (ROS) and cytotoxic substances, further exacerbating local pancreatic injury [[12](#page-16-9)]. As infammation persists, neutrophils undergo a cascade reaction of transendothelial migration, leading to capillary obstruction and microthrombus formation, resulting in local tissue necrosis. This exacerbates local pancreatic infammation into systemic infammatory response syndrome (SIRS) and, through overwhelming infammatory responses, causes distant organ damage and multiple organ dysfunction syndrome (MODS). However, the mechanisms by which neutrophils cause tissue damage require further investigation.

In this study, through analysis of bulk transcriptomic data and single-cell RNA sequencing (scRNAseq) data during acute pancreatitisand SAP, neutrophils are implicated in tissue damage *via* the formation of NETs. The study also explores the relationship between NETs formation during AP and liver-lung damage, predicts potential traditional Chinese medicine and drug targets, and provides new insights for improving the prognosis of AP and the treatment of associated liver-lung damage.

#### **Method**

#### **Data Collection and Processing**

Downloaded transcriptomic data from two AP datasets, GSE109227 and GSE65146, from the GEO database; transcriptomic data related to SAP lung injury from dataset GSE151572; transcriptomic data related to SAP liver injury from dataset GSE151927; peripheral blood transcriptomic data during human AP from dataset GSE194331. According to the corresponding data sets, tissue samples were obtained within 24 hours post modeling in mice for GSE109227, GSE65146, GSE151572, and GSE151927. Blood samples were obtained within 24 hours after hospital admission for patients in GSE194331. To increase sample size, merged and batch effects were removed for GSE109227 and GSE65146 using the "Combat" package in R software. Dataset GSE181276 contained single-cell transcriptomic data from pancreatic cells of control mice and mice with AP at 1, 7, and 28 days; dataset GSE198183 contained single-cell transcriptomic data from pancreatic cells of control mice and mice with AP at 2 days and 6 weeks. Control mice from GSE181276 at day 1 of AP and control mice from GSE198183 at day 2 of AP were included as single-cell transcriptomic data for this study. The standard workfow of scRNA-seq data analysis was performed using the "Seurat" package in R. Cells with fewer than 200 or more than 6000 genes, as well as those with mitochondrial gene expression exceeding 15%, were fltered out. The "harmony" package in R was used to reduce batch effects between samples. The "FindVariableFeatures" function was employed to identify the top 3000 variably expressed genes. Cell subtypes were identifed by comparing with marker genes from the Cell-Marker2.0 database.

#### **Diferential Analysis**

For microarray data, diferential analysis was conducted using the "Limma" package in R software. For raw sequencing data, diferential analysis was performed using the "DESeq2" package in R software. Diferential genes were defned with a threshold of Fold Change >1.5 and  $FDR < 0.05$ .

### **Homologous ID Conversion**

Perform homologous ID conversion for mice-origin genes to match human-origin genes using the g:Profler online tool [\(https://biit.cs.ut.ee/gprofiler/orth](https://biit.cs.ut.ee/gprofiler/orth)).

### **Functional Enrichment Analysis**

Perform enrichment analysis using the "clusterProfler" package in R software. This includes enrichment analysis for Gene Ontology (GO), Kyoto Encyclopedia of Genes and Genomes (KEGG), and Reactome pathways, with a corrected  $p$  value  $\langle 0.05 \rangle$  considered significant enrichment.

# **Protein‑Protein Interaction Network and Identifcation of Core Genes**

The STRING database (<https://string-db.org/>) integrates all experimentally validated or predicted protein-protein interaction relationships [\[13\]](#page-16-10). Protein interaction analysis is conducted using the STRING database with a Confdence Score>0.4 threshold. The MOCODE plugin in Cytoscape 3.8.0 software is utilized for modular analysis of the proteinprotein interaction (PPI) network derived from the STRING database. The Cytohubba plugin in Cytoscape 3.8.0 software is employed to extract core genes from the PPI network using algorithms such as MCC, Degree, MNC, EPC, and Closeness.

# **Immune Cell Infltration and Immune Scoring**

Calculate the immune cell infltration scores and immune status scores in each tissue using the ssGSEA algorithm.

### **Gene‑Drug Network**

The relationship between traditional Chinese medicine monomers and genes is established using the HERB database [\[14\]](#page-16-11), and visualization is performed using Cytoscape.

### **Animal Husbandry and Intervention in Experiments**

All experimental procedures were approved by the Ethics Committee of the First Afliated Hospital of Harbin Medical University. The mice were housed under controlled conditions with a temperature of  $18-24$  °C and humidity of 50–60%, with a 12-hour light-dark cycle. They were provided with *ad libitum* access to food and water. Mice were allowed one week to acclimate to the new environment before initiating the dietary intervention, which lasted for 8 weeks. Following random allocation principles, mice were divided into the following groups: control group (NC group), mild acute pancreatitis group (MAP group), severe acute pancreatitis group (SAP group), SAP+Neutrophil depletion group (SAP+Anti-Ly6g group) and SAP+NETs depletion group (SAP+DNase I group). For AP modeling, a physiological saline solution containing 5 μg/ml cerulein was administered *via* intraperitoneal injection at a dose of 10 ml/kg every hour for 10 consecutive doses, and the mice were euthanized 24 hours later. For SAP modeling, a sterile solution of 8% L-arginine salt (A92600, MiliporeSigma, Burlington, MA) in physiological saline was prepared and adjusted to pH 7.0. Mice received intraperitoneal injections of L-arginine (4 g/kg) every hour, while the control group received intraperitoneal injections of physiological saline [[15–](#page-16-12)[17\]](#page-16-13). The neutrophils in mice were depleted using anti-Ly6g antibody (Bio X Cell, clone 1A8, #BP0075–1), specifcally by intraperitoneal injection of the antibody at a dosage of 100μg per mouse once every 48 hours for one week prior to euthanasia. DNase I (Merck) was used to inhibit the formation of NETs, administered by intraperitoneal injection at a dosage of 5 mg/kg one day before establishing the AP model in mice.

#### **Real‑Time Fluorescence Quantitative PCR**

Total RNA was extracted from tissues or cells using the RNA extraction kit from Axygen Scientifc Inc. (Silicon Valley, USA). The extracted RNA was then reverse transcribed into cDNA using the Toyobo Reverse Transcription Kit. SYBR GREEN reagent was employed to detect the expression of target genes. RT-qPCR samples were preheated at 95 °C for 10 minutes, followed by 40 cycles of denaturation at 95 °C for 15 seconds and annealing/extension at 60 °C for 1 minute. GAPDH was used as an internal reference gene. Data were analyzed using the  $2^{\wedge}$ - $\Delta\Delta$ Ct method. Supplementary Table 1 provides details of the primer information.

### **ELISA**

Peripheral blood was collected using the mice fundus vein puncture method. The collected blood was centrifuged at 3000 rpm for 15 minutes at 4 °C, and the supernatant was collected for enzyme-linked immunosorbent assay (ELISA) analysis. The levels of IL-1β, IL-6, and TNF- $α$ were analyzed according to the manufacturer's instructions using ELISA kits purchased from Elabscience Biotech Co. (Wuhan, China).

Serum amylase activity was determined using a commercial amylase assay kit. In brief, serum samples were added to wells containing known concentrations of excess substrate (starch). Amylase in the samples hydrolyzed starch,

and then iodine was added to react with the unhydrolyzed starch, producing a blue-colored compound. By measuring the absorbance of the blue-colored compound at 660 nm, the amount of starch hydrolyzed by amylase could be inferred, and thus the amylase activity could be calculated. The unit is expressed as U/L.

#### **Hematoxylin and Eosin Staining**

The mice pancreas, liver, and lung tissue specimens were fxed in 4% paraformaldehyde solution, dehydrated in a series of alcohol gradients, embedded in paraffin, and then sectioned into continuous slices of 5 μm thickness. The tissue sections were stained with hematoxylin and eosin (H&E), and the tissue morphology was observed using an optical microscope.

#### **Immunohistochemistry**

The freshly collected pancreas and liver-lung tissues were fxed overnight in 4% paraformaldehyde, dehydrated, and embedded in paraffin. The paraffin-embedded samples were then sectioned into 4 μm thick slices. Antigen retrieval was performed in a pressure cooker for 2 minutes using Tris-EDTA buffer ( $pH=9$ ). Endogenous peroxidase activity was blocked with 3% hydrogen peroxide. The sections were then incubated with 10% goat serum at 37 °C for 30 minutes to block nonspecifc binding. Subsequently, the sections were incubated overnight at 4 °C with primary antibodies against ITGAM (SANTA; sc-1186; 1:200), ITGAM FPR1 (SANTA; sc-53,795; 1:200), and FPR1 (abcam;ab113531;1:200). After washing, the sections were incubated with horseradish peroxidase (HRP)-conjugated secondary antibodies at 37 °C for 30 minutes. Finally, the sections were incubated in Diaminobenzidine (DAB) for 5–10 minutes to develop a stable color.

#### **Immunofuorescence**

After antigen retrieval in citrate bufer (Hangzhou Hulk Biotechnology Co., Ltd., Hangzhou, China, HK1222) using microwave, pancreas and liver-lung tissue sections were blocked with 5% BSA (Beyotime, Jiangsu, China, ST2254) for 30 minutes. The sections were then incubated overnight with primary antibodies at 4 °C, followed by three washes with PBS and addition of secondary antibodies. Nuclear staining was performed with 4′,6-diamidino-2-phenylindole (DAPI). Images were captured using a microscope (Leica, Wetzlar, Germany, DM2500) and captured by Pannoramic SCAN II (3D HISTECH) and fuorescence microscope (LAS X software, Leica, Wetzlar, Germany).

The antibodies used were as follows: Anti-CitH3 (Abcam, ab281584, 1:100), Anti-MPO (Abcam, ab300650, 1:100),

Anti-Ly6g (Abcam, ab238132, 1:100), Fluorescein (FITC) conjugated Affinipure Goat Anti-Rat  $IgG(H+L)$  (Proteintech, SA00003–11,1:100), Fluorescein (FITC)-conjugated Affinipure Rabbit Anti-Goat  $IgG(H+L)$  (Proteintech, SA00003–4, 1:100).

### **Statistical Analysis**

For the bioinformatics analysis, statistical analysis was conducted using R software (version 4.0.2). For experimental validation, diferential analysis was performed using Graph-Pad Prism 8. Continuous variables between two groups were compared using either the t-test or Mann–Whitney U test, depending on whether the data followed a normal distribution. For comparisons among three groups of samples, the Kruskal-Wallis test was used. Spearman correlation analysis was used for all correlation analyses. The diagnostic ability of molecules was refected by receiver operating characteristic (ROC) curves. For all statistical analyses, a signifcance level of  $P < 0.05$  was considered statistically significant ( $*,$ *P*<0.05; \*\*, *P*<0.01; \*\*\*, *P*<0.001).

# **Result**

### **Data Processing and Hub Gene Selection**

The GSE65146 and GSE109227 datasets were merged and batch effects were successfully removed (Supplementary Fig. 1A-B). Diferential analysis of mice pancreatic transcriptome data revealed 3264 upregulated and 1905 downregulated genes in AP pancreatic tissue compared to normal pancreatic tissue (Supplementary Fig. 2A). Compared to normal lung tissue, SAP lung tissue had 651 upregulated and 471 downregulated genes (Supplementary Fig. 2B). Compared to normal liver tissue, SAP liver tissue had 4375 upregulated and 2716 downregulated genes (Supplementary Fig. 2C). There were 106 genes simultaneously upregulated (Supplementary Fig. 2D) and 14 genes simultaneously downregulated (Supplementary Fig. 2E) in pancreatic, lung, and liver tissues. Compared to normal human blood, AP patient peripheral blood had 3149 upregulated and 1768 downregulated genes (Supplementary Fig. 2F). After converting the selected mice-origin genes to human-origin genes in the three groups (pancreas, liver, and lung) and taking the intersection with the diferentially expressed genes identifed in blood, 45 upregulated and 1 downregulated gene were obtained (Supplementary Fig. 2G-H). Functional enrichment analysis of these diferentially expressed genes revealed that they were mainly associated with MAPK, NF-κB, IL-17, cytokine-cytokine receptor interaction pathways based on KEGG enrichment analysis (Supplementary Fig. 3A). Reactome enrichment analysis indicated that these genes were mainly related to IL-4/IL-13, IL-10, IL-1, TOLL-like receptor signaling pathways (Supplementary Fig. 3B). GO-BP enrichment analysis showed that these genes were mainly associated with neutrophil-mediated immunity, neutrophil activation, neutrophil degranulation, and neutrophil migration (Supplementary Fig. 3C). Through the analysis of the results of the three enrichment analyses, it was found that these genes mainly enriched in neutrophil-related biological processes (Supplementary Fig. 3C). Given the important role of neutrophils in infammation and organ damage associated with SAP [[18,](#page-16-14) [19](#page-16-15)], we decided to select 12 genes (including C5AR1, CD14, CLEC4D, FPR1, ITGAM, LCN2, LRG1, MMP8, PLAUR, PTPRJ, S100A8, and STOM) out of the 46 genes that could enrich in neutrophil-related processes for further analysis.

# **Diferential Genes Related to Neutrophils Have Diagnostic Potential for Moderate to Severe Pancreatitis**

By analyzing the expression of the aforementioned 12 neutrophil-related genes in mild and moderate-severe acute pancreatitis, it was found that compared to normal peripheral blood, the expression of these 12 genes was signifcantly increased in peripheral blood of AP patients (Supplementary Fig. 4A). Among them, ITGAM, LRG1, and S100A8 showed a significant increase in expression in peripheral blood with the severity of AP (Supplementary Fig. 4A). To establish the potential of these genes in diagnosing mild and moderate-severe AP, ROC curve analysis was performed. The results showed that among the 12 genes, LCN2 (AUC = 0.718), MMP8 (AUC = 0.723), S100A8  $(AUC=0.702)$ , and STOM  $(AUC=0.713)$  performed well in distinguishing between mild and moderate-severe AP and had diagnostic signifcance (Supplementary Fig. 4B). To further improve diagnostic efficacy, ROC curve analysis was performed for the combination of LCN2, MMP8, S100A8, and STOM. The results showed that the combined AUC value of LCN2, MMP8, S100A8, and STOM in distinguishing between mild and moderate-severe AP was 0.770, further enhancing the diagnostic potential for mild and moderate-severe AP (Supplementary Fig. 4C). Additionally, a protein-protein interaction (PPI) network and a diseasedrug-target gene network were constructed, and potential therapeutic Chinese medicines were screened (Supplementary Fig. 5A-B).

#### **AP Can Lead to Multiorgan Immune Dysregulation**

The ssGSEA algorithm can assess the levels of immune cells and immune status in organs based on transcriptomic data. We used the ssGSEA algorithm to score the immune cells and immune status in the pancreas and peripheral blood during AP, as well as in the liver and lungs during SAP. We found that compared to the normal pancreas, the infltration levels of B cells, macrophages, neutrophils, pDCs, Th1, and Th2 cells were signifcantly increased in the pancreas of the AP group, while the levels of CD8<sup>+</sup> T cells, mast cells, and helper T cells were signifcantly decreased (Fig. [1A](#page-5-0)). In addition, the infammatory score, type I IFN response, and type II IFN response scores were higher in the pancreas of the AP group compared to the normal pancreas (Fig. [1](#page-5-0)B). Compared to normal peripheral blood, the scores of neutrophils and macrophages were signifcantly increased in the blood of AP patients, while the scores of other cells such as B cells and T cells were signifcantly decreased (Fig. [1](#page-5-0)C). Surprisingly, the infammatory score was decreased in the blood of AP patients compared to normal blood (Fig. [1](#page-5-0)D). Compared to the normal liver, the levels of macrophages, Tfh cells, Treg cells, infammatory score, and auxiliary infammation score were signifcantly increased in the liver of the SAP group, while pDCs were decreased (Fig. [1E](#page-5-0) and F). Similarly, compared to the normal lungs, the levels of macrophages, neutrophils, Treg cells, and type II IFN response scores were signifcantly increased in the lungs of the SAP group, while  $CD8<sup>+</sup>$  T cell infiltration was decreased (Fig. [1G](#page-5-0) and H), suggesting immune dysregulation in multiple organs during AP.

# **The Correlation between the Expression Levels of the 12 Genes in Various Organs and the Infltration of Immune Cells and Immune Status Scores**

We analyzed the correlation between the expression levels of these 12 genes in various organs and the infltration of immune cells and immune status scores. It is evident that in the pancreas, peripheral blood, liver, and lung tissues, the expression of hub genes is signifcantly positively correlated with neutrophil and macrophage infltration (Fig. [2A](#page-6-0)-D). Additionally, in pancreatic, liver, and lung tissues, the expression of hub genes is positively correlated with auxiliary infammatory response scores and type II IFN response scores (Fig. [2](#page-6-0)A, C-D). Surprisingly, in peripheral blood tissue, hub genes are only positively correlated with the APC co-inhibition response score, macrophages, and neutrophils, while they are negatively correlated with almost all other immune cells and immune status scores (Fig. [2B](#page-6-0)). Considering the results of previous enrichment analyses, it can be speculated that hub genes may play an intermediary role in highly infltrated neutrophils and macrophages during SAP-induced damage to other organs.



<span id="page-5-0"></span>**Fig. 1** Immune cells and immune status scores of each tissue. (**A**-**B**) pancreatic immune cell and immune status score. (**C**-**D**) peripheral blood immune cells and immune status score. (**E**-**F**) liver immune

cells and immune status score of severe pancreatitis. (**G**-**H**) pulmonary immune cells and immune status scores in severe pancreatitis. \**P*<0.05 \*\**P*<0.01 \*\*\**P*<0.001



<span id="page-6-0"></span>**Fig. 2** Correlation between the expression levels of 12 genes in each organ and immune cell infltration and immune status score. (**A**) Pancreatic immune cell infltration and immune status score; (**B**) peripheral blood immune cell infltration and immune status score;

(**C**) liver immune cell infltration and immune status score; (**D**) pulmonary immune cell infiltration and immune status score. \**P*<0.05 \*\**P*<0.01 \*\*\**P*<0.001

# **The Expression of the 12 Neutrophil‑Related Genes at the Single‑Cell Level**

To better understand the expression of these 12 genes at the single-cell level, we conducted scRNA-seq analysis in a mice AP model (Fig. [3A](#page-7-0)). We identifed a total of 27 cell subtypes in four samples from the control group and the AP group (Fig. [3](#page-7-0)B). By comparing these 27 cell subtypes with the marker genes of various cell types in mice pancreatic tissue from the CellMarker database, we found that the 27 cell subtypes could be classifed into 12 cell types, including acinar cells, fbroblasts, ductal cells, endothelial cells, macrophages, B cells, monocytes, neutrophils, beta cells, dendritic cells, and peptide cells (Fig. [3](#page-7-0)C). Figure [3](#page-7-0)D shows the top 5 marker genes for each of the 12 cell types.

Subsequently, we explored and compared the expression of these 12 hub genes across the 12 cell types (Fig. [4\)](#page-8-0). The results showed that C5AR1, CD14, CLEC4D, PLAUR, ITGAM, FPR1, PTPRJ, and S100A8 had the highest expression levels in neutrophils, followed by macrophages (Fig. [4](#page-8-0)A-H). On the other hand, LRG1 and STOM exhibited the highest expression levels in endothelial cells, while LCN2 was predominantly expressed in ductal cells, and MMP8 was mainly expressed in macrophages (Fig. [4](#page-8-0)I-L).

Through integrated analysis with the KEGG pathway database, we found that among these 12 genes, FPR1, ITGAM, and C5AR1 were simultaneously identified as key genes involved in the formation of NETs (Supplementary Fig. 5). NETs play a crucial role in mediating



<span id="page-7-0"></span>**Fig. 3** Expression of 12 neutrophil-associated genes at the single-cell level. (**A**) scRNAseq analysis was performed in mice AP model; (**B**) classifcation of cell subtypes in four samples in the control and AP groups; (**C**) cell annotation in each subtype; (**D**) marker genes in each subtype



<span id="page-8-0"></span>**Fig. 4** Expression of 12 genes in 12 cell types

the development of AP  $[9, 20]$  $[9, 20]$  $[9, 20]$  $[9, 20]$ , but their involvement in the multi-organ damage observed in SAP remains unclear [[10](#page-16-7), [21\]](#page-16-17). Therefore, we decided to further investigate FPR1, ITGAM, and C5AR1 as targets for experimental validation.

# **FPR1, ITGAM, and C5AR1 Exhibit Increased Expression in AP Tissues**

To validate whether FPR1, ITGAM, and C5AR1 mediate multi-organ damage caused by SAP, we frst verifed

<span id="page-9-0"></span>**Fig. 5** Expression levels of FPR1, ITGAM and C5AR1 as key genes in the formation of NETs in SAP organs. (**A**) Pancreatic tissue infammation levels, pathological scores and serum amylase levels in MAP and SAP mice. (**B**-**E**) serum amylase, TNF-α, IL-1β and IL-6 levels in MAP and SAP mice; (**F**) mRNA expression levels of FPR1,ITGAM and C5AR1 in pancreas in MAP group; (**G**) mRNA expression levels of FPR1,ITGAM and C5AR1 in lung tissue in MAP group; (**H**) mRNA expression levels of FPR1,ITGAM and C5AR1 in liver tissue in MAP group; (**I**-**K**) expressions of FPR1,ITGAM and C5AR1 in three tissues by IHC; (**L**) expressions of Ly6g in three tissues by immunofuorescence, \**P*<0.05 \*\**P*<0.01 \*\*\**P*<0.001



whether they were upregulated in various organs of SAP. We used C57BL/6 mice to establish models of MAP and SAP. HE staining results showed signifcant infammation in pancreatic tissues of MAP and SAP mice compared to the control group, with a signifcant increase in pathological scores and serum amylase levels (Fig. [5](#page-9-0)A). In contrast, signifcant infammatory damage was observed in the lung and liver tissues of the SAP group, while no signifcant infammation was observed in the lung and liver tissues of the AP group (Fig. [5](#page-9-0)A). Compared to the control group, MAP mice showed elevated levels of serum amylase, TNF- $\alpha$ , IL-1 $\beta$ , and IL-6, and these indicators were further increased in the serum of SAP mice (Fig. [5B](#page-9-0)-E).

Subsequently, we validated the expression of FPR1, ITGAM, and C5AR1 in the mice models using qPCR. In pancreatic tissues, mRNA expression of FPR1, ITGAM, and C5AR1 was signifcantly increased in the MAP group compared to the control group, and this trend was more signifcant in the SAP group (Fig. [5F](#page-9-0)). In lung tissues, mRNA expression of FPR1, ITGAM, and C5AR1 was signifcantly increased in the SAP group compared to the control group, while no signifcant increase was observed in the MAP group (Fig. [5](#page-9-0)G). In liver tissues, mRNA expression of FPR1, ITGAM, and C5AR1 was signifcantly increased in the SAP group compared to the control group, while no signifcant increase was observed in the MAP group (Fig. [5](#page-9-0)H). Subsequently, we further validated the diferential expression of FPR1, ITGAM, and C5AR1 at the protein level using immunohistochemistry, and the results were consistent with those obtained by qPCR (Fig. [5I](#page-9-0)-K).

# **Neutrophiles Increase during AP and Mediate SAP‑Related Multi‑Organ Damage**

To investigate the role of neutrophils in the multi-organ damage associated with SAP, we examined the expression of the neutrophil-specifc marker Ly6g through immunofuorescence. The results indicated that, compared to the control group, there was an increase in neutrophils in the pancreas of the MAP group, and this phenomenon was even more signifcant in SAP (Fig. [5L](#page-9-0)). In lung tissue, compared to the control and MAP groups, the infltration of neutrophils was signifcantly increased in the SAP group, although there was no signifcant diference between the control and MAP groups (Fig. [5L](#page-9-0)). Similarly, in liver tissue, the infltration of neutrophils was signifcantly increased in the SAP group compared to the control and MAP groups (Fig. [5L](#page-9-0)).

Subsequently, we depleted neutrophils in mice using an anti-Ly6g antibody, and then established an SAP model to explore the role of neutrophils in SAP-associated multiorgan damage. Immunofuorescence results showed that the infltration of neutrophils in the pancreas, lungs, and liver of SAP mice was increased, while the anti-Ly6g antibody successfully depleted neutrophils in these organs (Fig. [6A](#page-11-0)). ELISA results showed that treatment with the anti-Ly6g antibody reduced levels of blood amylase, IL-1β, IL-6, and TNF- $\alpha$  in the peripheral blood of SAP mice, indicating a reduction in systemic infammation (Fig. [6B](#page-11-0)-E). H&E staining showed that treatment with the anti-Ly6g antibody reduced the level of tissue damage in the pancreas, lungs, and liver of SAP mice (Fig. [6](#page-11-0)F).

# **NETs Increase during AP and Mediate SAP‑Related Multi‑Organ Damage**

Subsequently, we performed immunofuorescence confocal microscopy to detect the formation of NETs. The results showed that compared to the control group, both MAP and SAP groups exhibited NETs in pancreatic tissues (Fig. [7](#page-12-0)A). In lung tissues, NETs were not detected in the control and MAP groups, while there was a signifcant increase in NETs in the lung tissues of the SAP group (Fig. [7B](#page-12-0)). Similarly, in liver tissues, NETs were not detected in the control and MAP groups, while there was a signifcant increase in NETs in the liver tissues of the SAP group (Fig. [7](#page-12-0)C). This indicates that during SAP, there is a signifcant formation of NETs that contribute to multi-organ damage.

DNase I is a commonly used inhibitor of NETs. To determine whether NETs release is involved in mediating multiorgan damage in SAP, we inhibited the generation of NETs using DNase I and induced a mice SAP model. After applying DNase I, fuorescence confocal microscopy revealed a signifcant reduction in NETs in pancreatic, lung, and liver tissues of SAP mice, indicating a signifcant inhibition of NETs formation (Fig. [8A](#page-13-0)-C). Subsequently, we performed HE staining on liver and lung tissues of SAP mice treated with DNase I to study the severity of SAP and the extent of damage to the pancreas, lung, and liver. The results showed that compared to SAP mice without DNase I treatment, SAP mice treated with DNase I exhibited significantly reduced inflammatory responses and decreased damage to the pancreas, lung, and liver (Fig. [8](#page-13-0)D). After inhibiting NETs formation and release, the levels of serum amylase, TNF- $\alpha$ , IL-1β, and IL-6 in SAP mice were reduced, indicating a reduction in the severity of systemic infammation (Fig. [8](#page-13-0)E-H).

# **Discussion**

AP leads to signifcant morbidity and mortality. Globally, the estimated incidence of AP is 33.74 cases per 100,000 person-years (95% CI 23.33–48.81), with a mortality rate due to AP of 1.60 cases per 100,000 person-years (95% CI 0.85–1.58) [[22\]](#page-16-18). The severity of AP can be mild, moderate, or severe, depending on the extent of local pancreatic injury and, more importantly, systemic damage to organs distant from the pancreas [[23](#page-16-19)]. MAP typically lacks obvious local or systemic complications. However, about 20% of AP patients present with a more severe form of the disease, characterized by signifcant local complications such as necrosis, often due to systemic damage caused by widespread infammation. In this pathophysiological process, a large release of cytokines and infammatory mediators activates multiple signaling pathways, causing damage to the body. However, the underlying mechanisms are not fully understood.



<span id="page-11-0"></span>**Fig. 6** Neutrophil-mediated multi-organ damage in SAP. (**A**) Immunofuorescence demonstrated that treatment with the anti-Ly6g antibody reduced neutrophil infltration in the pancreas, lungs, and liver; (**B**-**E**) serum amylase, IL-1β, IL-6, and TNF-α levels in mice treated

with the anti-Ly6g antibody were verifed by ELISA; (**F**) H&E staining showed that treatment with the anti-Ly6g antibody alleviated multi-organ damage associated with SAP

Previous studies have long believed that the excessive activation of pancreatic enzymes is the direct pathogenic mechanism of pancreatitis [[24,](#page-16-20) [25\]](#page-16-21). However, in clinical practice, the condition of SAP patients treated with pancreatic enzyme inhibitors did not improve signifcantly. Therefore, there are still pathogenic mechanisms of AP <span id="page-12-0"></span>**Fig. 7** NETs increase at MAP and mediate SAP related multiple organ injury. (**A**) NETs formation in pancreatic tissue. (**E**) NETs formation in lung tissue. (**C**) NETs formation in liver tissue Control



independent of excessive pancreatic enzyme activation. In recent years, increasing evidence supports that infammatory factors are crucial pathogenic mechanisms of pancreatitis independent of pancreatic enzyme activation [[26](#page-16-22)]. The release of infammatory signals from pancreatic acinar cells can mediate the recruitment and activation of circulating infammatory cells (monocytes and neutrophils) [[27](#page-16-23), [28](#page-16-24)]. The excessive activation of neutrophils can trigger intense

<span id="page-13-0"></span>**Fig. 8** Infammatory response and NETs formation after NETs inhibitors. (**A**-**C**) NETs formation in pancreatic, lung and liver tissues after administration of NETs inhibitors. (**D**) H&E staining showed that treatment with the NETs inhibitors alleviated multi-organ damage associated with SAP. (**E**-**H**) serum amylase, TNF-α, IL-1β and IL-6 levels in mice treated with NETs inhibitors were verifed by ELISA, \**P*<0.05 \*\**P*<0.01 \*\*\**P*<0.001



local and systemic infammatory responses, leading to acute respiratory distress syndrome, cardiovascular failure, renal failure, and gastrointestinal bleeding, which are also the reasons for the high mortality rate of SAP [[29\]](#page-16-25). Enrichment analysis revealed that diferential genes are mainly associated with neutrophil-mediated immunity, activation, degranulation, migration, and other biological processes. Additionally, the analysis of the expression levels of 12 hub genes in various organs and their correlation with immune cell infltration and immune status scores revealed a signifcant positive correlation between hub gene expression and neutrophils and macrophages in pancreatic, peripheral blood, liver, and lung tissues. Furthermore, increased neutrophil infltration levels in pancreatic and lung tissues in the SAP group suggest that neutrophils participate in the immune dysregulation of multiple organs during SAP. During SAP, the release of TNF-α, IL-1, and IL-6 promotes neutrophil adhesion and migration, increases capillary permeability, exacerbates pancreatic damage, and SIRS [[30–](#page-16-26)[32](#page-17-0)]. Additionally, increased complement C3a in peripheral blood can promote neutrophil activation and infltration, increasing vascular permeability [[33\]](#page-17-1). Moreover, immune complexes, such as IC3b complement deposition on endothelial cell membranes, can serve as signaling mediators for neutrophils, facilitating their long-distance migration in tissues [[34](#page-17-2)]. Although neutrophil recruitment is considered a nonspecifc defensive response against invading microorganisms, excessive recruitment and activation of neutrophils may lead to the release of large amounts of pro-infammatory mediators and ROS. Therefore, SAP patients may experience the progression of pancreatitis and multiple organ failure due to the continuous exacerbation of systemic infammatory cascades [\[35](#page-17-3)].

Under the action of infammatory mediators and chemotactic factors, neutrophils are the frst cells to migrate to the pancreas, releasing infammatory mediators and triggering local inflammatory reactions [\[36](#page-17-4)]. However, neutrophil infiltration into tissues often comes at the expense of damaging host cells, and the level of neutrophil infltration can refect the extent of tissue damage to some extent. Under the stimulation of various infammatory factors, activated neutrophils can release a meshwork of DNA fbers called NETs, which are packed with intracellular substances such as elastase, tissue protease G, and MPO to protect the host from infammatory damage [\[37](#page-17-5), [38](#page-17-6)].

Our research suggests that neutrophils and NETs may play signifcant roles in the occurrence and development of SAP. In mouse models of pancreatic inflammation, significant improvements in tissue damage were observed by inhibiting neutrophil infltration and NETs generation. Inhibiting NETs can reduce the release of CXCL2 in the pancreas and lungs and the recruitment of neutrophils, a fnding worth noting as it suggests that NETs themselves may act as chemoattractants in the form of DAMPs or stimulate the release of chemotactic factors, thereby exacerbating the infammatory response [\[39](#page-17-7)]. This indicates that NETs may act as a doubleedged sword in infammation, with their formation inhibiting the infammatory response to some extent but amplifying it in certain circumstances, worsening tissue damage. For example, neutrophils accumulated in the pancreas can retrogradely migrate to the circulatory system, causing systemic and local complications of SAP such as multiple organ failure, thrombosis, IPN, and sepsis. Research has also found that NETs can regulate the activity of important molecular mediators such as STAT3 and the activation of pancreatic protease in pancreatic acinar cells during infammation [\[39](#page-17-7)]. Additionally, IL-17A, primarily produced by activated T cells, can promote neutrophil accumulation in pancreatic ducts, while bicarbonate ions and calcium carbonate crystals in pancreatic juice, together with accumulated neutrophils, promote the formation of NETs. This, in turn, exacerbates SAP by blocking pancreatic ducts, leading to acute biliary pancreatitis [[40\]](#page-17-8).

At the level of amplifying the infammatory response, NETs can activate infammatory cells such as monocytes or macrophages by regulating the assembly of NLRP3 infammasomes in neutrophils *via* PAD4 [\[41](#page-17-9), [42](#page-17-10)], leading to the release of inflammatory factors such as IL-1β [[43](#page-17-11)] and IL-18 [[44](#page-17-12)]. Studies have found that NETs may also induce the secretion of pro-infammatory chemokines IL-8 and B cellactivating factor (BAFF) through pathways involving Akt, ERK1/2, and p38 phosphorylation [[45\]](#page-17-13). Extracellular AIM2- NET interaction may further promote sustained secretion of IFN-I, thereby amplifying the infammatory response [[46\]](#page-17-14).

Aldabbous has demonstrated that MPO derived from NETs stimulates the activation, proliferation, and migration of endothelial cells in a model of pulmonary arterial hypertension [\[47](#page-17-15)]. Activated endothelial cells, in turn, promote NETosis *via* the IL-8 signal. This could potentially form a positive feedback loop of tissue damage and infammation. Additionally, the negatively charged DNA within NETs, along with serine proteases and neutrophil elastase, can promote platelet aggregation. Through the NETs-plateletcoagulation axis, this promotes thrombus formation, thereby contributing to tissue damage and amplifying the infammatory process [\[48](#page-17-16)]. Although NETs play a crucial role in infammation, we must still recognize that the exacerbation of infammation is the result of the combined action of multiple factors, including Netosis. Our fndings also indicate that inhibiting the formation of NETs can only partially alleviate the severity of infammation.

Through combined analysis, we identifed genes associated with NETs, including C5AR1, FPR1, and ITGAM, as NETs are their common downstream. ITGAM encodes the α chain of integrin αM, an integrin that has been shown to be crucial for promoting the adhesion and transmembrane migration of neutrophils and monocytes to activated endothelial cells, primarily through ICAM-1 on the activated endothelial cells, thus directing these immune cells to migrate to sites of infection or infammation [[49\]](#page-17-17). Various integrins play a pathogenic role in MAP/SAP [[50\]](#page-17-18). During acute and severe pancreatitis, the levels of ITGAM in the peripheral blood of patients are signifcantly increased [[51,](#page-17-19) [52](#page-17-20)]. ITGAM can independently promote the generation of reactive oxygen species (ROS) through activating signaling pathways such as Src kinase, Syk, and PI3K δ, thereby facilitating the release of NETs [[53\]](#page-17-21). C5aR1 was initially found in neutrophils, monocyte macrophages, and mast cells and is one of the most important components of the complement cascade with multiple pro-inflammatory effects. C5a/ C5aR1 can directly trigger neutrophil activation but does not participate in myeloid cell infltration into the lungs [\[50](#page-17-18)]. We studied its possible role in myeloid cell activation, focusing mainly on neutrophils. In Alzheimer's disease, neutrophils can be attracted to amyloid plaques by several pro-infammatory factors such as C5a, and release NETs [\[54](#page-17-22)]. Although these data suggest an association between C5a/C5aR1 and NETs formation, we cannot rule out the indirect efects of C5a on NETs formation. Indeed, evidence suggests that NETs can amplify the infammatory process by promoting tissue damage and the production of additional cytokines/ chemokines. NETs play a crucial role in the interaction between neutrophils and macrophages during the early acute phase of ALI. They promote ALI by facilitating macrophage polarization towards the M1 phenotype. The gene FPR1 encodes the G protein-coupled receptor expressed on macrophages, mediating their response to microbial invasion of the host. The macrophage-SCIMP-FPRs-neutrophil axis plays a critical role in the immune process of ALI [\[55](#page-17-23)]. Our research also confrms the upregulation of FPR1 expression in multiple organs during SAP.

Although this study found that NETs act as a common downstream efector promoting SAP-related infammation for ITGAM, FPR1, and C5AR1, they do not solely exert their pro-infammatory efects through NETs. During viral infections, extracellular dsRNA can activate many immune cells, including macrophages [[56](#page-17-24)]. As a pattern recognition receptor (PRR) on the cell surface, ITGAM can detect extracellular dsRNA. Extracellular dsRNA enhances TLR3 dependent infammatory oxidative signaling by activating ITGAM, and triggers infammation signaling that is dependent on ITGAM but not on TLR3 [[57\]](#page-17-25). FPR1 can recognize bacterial and host-derived N-formyl peptides, such as N-formylmethionyl-leucyl-phenylalanine (fMLF) released during bacterial infections. When FPR1 binds these ligands, it activates downstream infammatory signaling pathways, promoting the activation of the NLRP3 infammasome and the production of IL-1β, IL-6, or TNF- $\alpha$  [[58,](#page-17-26) [59\]](#page-17-27). C5aR1 is often associated with sterile infammation. When complement activation is enhanced, the binding of C5a to C5AR1 can cause contraction and increased permeability of vascular endothelial cells, thereby facilitating the ingress of infammatory mediators and immune cells through the vascular wall into the interstitial tissue [[60](#page-17-28)]. The activation of C5aR1 on endothelial cells induces an infammatory state in the endothelium, while its activation on innate immune cells promotes antigen uptake, tissue infltration, and the

induction of a pro-inflammatory effector phenotype [[61](#page-17-29)], together constituting chronic pathological infammation.

Based on previous research fndings and the discoveries of our study, we boldly speculate that during SAP, various damage-related molecular patterns activate neutrophils within the pancreas. Activated neutrophils release proinflammatory cytokines such as TNF- $\alpha$ , IL-1β, and IL-6, causing neutrophil migration to peripheral blood, lungs, and liver, as well as increased NETs. Subsequently, NETs further exacerbates the cascade of infammation. Meanwhile, C5AR1, FPR1, and ITGAM participate in this process, exacerbating the infammatory response through the elevation of NETs levels and other pathways. Therefore, targeting key therapeutic targets such as FPR1, ITGAM, and C5AR1 is likely to alleviate SAP and SAP-related ALI and AHI by inhibiting the activation of neutrophils and the formation of NETs. However, further experiments are needed to validate our speculation.

### **Conclusion**

We found that the formation of NETs can exacerbate liver and lung damage associated with SAP, while inhibiting NETs release can efectively reduce the severity of systemic infammatory responses and liver and lung injury during AP. Through screening and studying the core genes involved in NETs formation, we identifed FPR1, ITGAM, and C5AR1 as closely related to NETs formation during SAP, potentially serving as common biomarkers among MAP/SAP, SAP-ALI, and SAP-AHI, laying the theoretical groundwork for future research. Additionally, by constructing a diseasedrug-gene network, we predicted potential traditional Chinese medicines and drug targets, offering new avenues for the treatment of liver and lung damage associated with AP.

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**Author Contributions** X.L. designed the study and analyzed the data. Y.Z. and H.W. wrote the manuscript. X.L. and Z.M. prepared the images and tables. D.X reviewed and revised the manuscript. Y.Z. supervised the research. All authors approved the fnal manuscript.

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**Data Availability** Data is provided within the manuscript or supplementary information fles.

#### **Declarations**

**Ethics Approval** This study was performed in line with the principles of the Declaration of Helsinki. Approval was granted by the Ethics Committee of First Afliated Hospital of Harbin Medical University (No: 2021091).

**Conflict of Interest** The authors declare no competing interests.

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