## Identification of the pivotal differentially expressed genes and pathways involved in *Staphylococcus aureus*-induced infective endocarditis by using bioinformatics analysis

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**Abstract.** – OBJECTIVE: Infective endocarditis (IE), particularly by *Staphylococcus aureus*, is an uncommon bacteremia-associated infection of the endocardium and cardiac valves. Herein, we evaluated predictive noninvasive biomarkers for IE caused by *S. aureus* through bioinformatics analysis.

**MATERIALS AND METHODS:** Staphylococcus aureus-associated and IE-associated differentially expressed genes (DEGs) were identified by bioinformatics analysis of the GSE6269 and GSE29161 Gene Expression Omnibus (GEO) datasets. The DEGs were analyzed with the LIMMA package, and the coregulated genes were chosen as the intersection of DEGs between the two datasets, called common differentially expressed genes (CDEGs). The enrichment study of CDEGs was subsequently performed with the DAVID and KOBAS web resources. Finally, protein-protein interaction (PPI) network, microRNA (miRNA)-transcription factor (TF)-mRNA (messenger RNA) regulatory network, and the network of drug-genes were identified.

**RESULTS:** From GSE6269 and GSE29161, respectively, a total of 201 and 741 DEGs were obtained. Gene Ontology (GO) analysis showed that CDEGs were primarily involved in innate immune response, extracellular exosome, as well as calcium ion binding, while the pathway analysis of Kyoto Encyclopedia of Genes and Genomes (KEGG) revealed that CDEGs were significantly enriched in the B-cell receptor, IL-17, and NF-kappa B signaling pathways. The hub genes in the PPI network included HP, S100A12, SPI1, CD14, CCR1, S100A9 and so on. In the miR-NA-TF-mRNA regulatory network, SPI1 could target miR-361-5p, miR-155-5p, and miR-339-5p in the progression of IE.

# **CONCLUSIONS:** Several pivotal genes and pathways were identified in the progression of *S. aureus*-induced IE, which may have the potential for early detection.

Key Words:

*Staphylococcus aureus*, Infective endocarditis, Differentially expressed genes, Pathways, Protein-protein interaction network, MicroRNA-transcription factor-mRNA network.

#### Introduction

Infective endocarditis (IE) is a severe, mostly bacterial disease with an occurrence of 1.7-10/100 000 person-years, defined as an infection of a native or prosthetic heart valve, the endocardial surface, or an indwelling cardiac device<sup>1,2</sup>. IE is linked to serious complications and high rates of in-hospital mortality, despite advances in medicine<sup>3</sup>. Staphylococcus aureus can cause both acute and recurrent persistent infections and is a frequent cause of IE<sup>4</sup>. Early diagnosis of IE is currently challenging. Echocardiography remains the primary imaging test for IE, but it is skipped in up to 30% of cases<sup>5</sup>. The possibility of IE should be considered in all patients with gram-positive bacteremia, especially due to S. aureus<sup>6</sup>. However, the mechanisms of S. aureus-induced IE are poorly known.

Current research has concentrated on the mechanisms of *S. aureus* infection. Phagocytosis by neutrophils and macrophages is the main mechanism through which *S. aureus* in-

fection is regulated by the immune system<sup>7</sup>. In addition, miRNAs, including miR-142, miR-24, miR-223 and miR-155, play an important role in immune defense toward *S. aureus* infections by modulating a wide variety of events such as inflammatory reactions, host innate immunity, and adaptive immunity<sup>8</sup>. Ranganathan et al<sup>9</sup> found that the general stress response of *S. aureus* might be conducive to the development of chronic infection by acting on host immune defenses. Nonetheless, few studies have attempted to determine the mechanism of *S. aureus* infection-induced IE.

Bioinformatics is the science of storing, extracting, and analyzing biological information by using computers as tools<sup>10</sup>. In terms of biomarker discovery, the rapid development of bioinformatics has provided a popular and feasible means of studying diseases<sup>11</sup>. In the present study, by analyzing the microarray data of S. aureus infection and IE in the Gene Expression Omnibus (GEO) public database, we screened out the differentially expressed genes (DEGs), conducted Gene Oncology (GO) enrichment analysis and Kyoto Encyclopedia of Genes and Genomes (KEGG) pathway analysis, analyzed protein-protein interaction (PPI) network, and constructed microRNA (miRNA)-transcription factor (TF)-mRNA (messenger RNA) network and drug-gene network to identify key genes and pathways that participated in S. aureus-induced IE. Not only do these results provide novel insights into the disease mechanisms but they also provide new therapeutic targets that can help to establish more effective S. aureus-induced IE treatments.

#### Materials and Methods

#### Microarray Data

The microarray expression data of GSE6269 and GSE29161 were acquired from the GEO database (https://www.ncbi.nlm.nih.gov/geo/)<sup>12</sup> and were selected for DEG analysis. The dataset GSE6269 included 31 samples from the blood leukocytes of pediatric patients with *S. aureus* infection and six unrelated healthy controls based on the platform Affymetrix Human Genome U133 Array. A further of five IE patients and five healthy control samples were collected from the GSE29161 dataset, which was sequenced by Agilent-014850 Whole Human Genome Microarray 4x44K G4112F.

#### Screening of DEGs

The raw microarray data of the two datasets was processed using the R language LIMMA package to filter the DEGs<sup>13</sup>. Probe sets without corresponding gene symbols or genes with over one probe set were omitted or averaged, respectively. The criteria of *p*-value <0.05 and | log2(fold change, FC) | >1 parameter were set as the cut-off values for DEG screening.

## GO and KEGG Enrichment Analyses of Common DEGs

To analyze the function of common DEGs (CDEGs), GO annotation and KEGG pathway enrichment analyses of the CDEGs were performed using the Database for Annotation, Visualization and Integrated Discovery (DAVID, https://david.ncifcrf.gov/)<sup>14</sup> and KOBAS 3.0 (http://kobas.cbi.pku.edu.cn) webtool<sup>15</sup>, respectively. The significantly enriched GO terms and KEGG pathways met the criterion of p < 0.05 and counts  $\geq 2$ .

#### **PPI Network Analysis**

The Search Tool for Retrieving Interacting Genes/Proteins (STRING) database (https://string-db.org/)<sup>16</sup> was used to predict the association between CDEGs, and the PPI network was constructed by Cytoscape<sup>17</sup>. Disconnected nodes in the network were removed to achieve precise results.

#### MicroRNA (miRNA)-Transcription Factor (TFJ-mRNA (messenger RNA) Regulatory Network Analysis

Target miRNAs of CDEGs were predicted by the intersection of the result of miRTarbase (http://starbase.sysu.edu.cn/)<sup>18</sup> and StarBase (http://starbase.sysu.edu.cn/)<sup>19</sup> to improve the accuracy of prediction. The pairs of miRNAs and mRNAs were acquired. The CDEGs were subsequently uploaded to the Enrichr database (http://amp.pharm.mssm.edu/Enrichr/)<sup>20</sup>, and the TFs targeting the CDEGs were predicted. A *p*-value of <0.05 was selected to screen the predicted TFs. Finally, the miRNA-TF-mRNA regulatory relationships were visualized with Cytoscape.

#### Drug-Gene Network Analysis

The drug-gene interaction database (DGIdb, www.dgidb.org) is a web resource that consolidates, organizes, and presents drug-gene interactions and gene druggability information from papers, databases, and web resources<sup>21</sup>. With the help of the DGIdb database, drug-gene pairs were predicted for the CDEGs. Finally, the drug-gene network was built by Cytoscape.

#### Statistical Analysis

A value of p < 0.05 was considered significant.

#### Results

#### Identification of DEGs

A total of 201 DEGs (148 upregulated and 53 downregulated) and 741 DEGs (349 upregulated and 392 downregulated) were identified from the GSE6269 and GSE29161, respectively (Figures 1A and 1B). Venn diagrams showed that there were 36 co-regulated genes, including 30 co-up-regulated genes and six co-downregulated genes, in the two datasets (Figure 1C). The detailed information concerning CDEGs is listed in Table I. The heat map of the CDEGs is shown in Figure 2.

#### Functional Analyses of Common DEGs

According to a threshold of p < 0.05 and count  $\geq 2$ , we conducted GO functional enrichment analysis on the CDEGs. CDEGs were enriched in 12 Biological Process (BPs), including innate immune response, defense response to bacterium, antibacterial humoral response, inflammatory response, and immune response. For the Cell Component (CC), the CDEGs were enriched in extracellular exosome and integral component of the plasma membrane. Analysis of molecular function (MF) suggested that the CDEGs were mainly enriched in peptidoglycan receptor activity and RAGE receptor binding (Supplementary Table I). The KEGG pathway analysis showed that the CDEGs were significantly enriched in the B-cell receptor signaling, IL-17 signaling, NF-kappa B signaling, and cAMP signaling pathways (Figure 3 and (Supplementary Table II).



**Figure 1.** Volcano plots and Venn diagram of DEGs. **A**, and **B**, Volcano plots of GSE6269 and GSE29161. Red plot points represent up-regulated DEGs and blue plot points represent down-regulated DEGs. **C**, Venn diagram shows the common DEGs between the GSE6269 and GSE29161 databases. Abbreviations: DEGs, differentially expressed genes; FC, fold change.

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MXD11.4800581295.47E-051.06702850.004854455HP1.4687721610.0145902531.612787310.007905672VNN11.3876094260.0183229471.826146160.002860491DYSF1.380340250.0002408431.387661320.003343979MS4A4A1.3438422610.0363590471.592408820.000353233SLC22A41.3396794980.0001314621.579136847.25E-05SLC25A371.3116783160.0018765041.0939440.004596929HCAR31.2826702910.0175898791.400548340.006558044RAB201.2674570050.0005937881.06645150.014955308SLPI1.2167777830.0087328961.138784990.008929437PGLYRP11.2142961580.026330621.40919650.006967278SPI11.1736386340.0004481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1521945911.49E-051.252245680.0014674LILRA51.1426164149.05E-051.646942340.0014744LILRA51.142677070.0001641541.136358340.0107268TIMP11.165780070.001721741.12717950.010817801FOLR31.0479315110.0377036531.538888320.0004675327RNASE31.040919390.0191683761.269810370.006569719CCR11.00238190.00253237-1.254720540.012659851PTPRK-1.1401382	G0S2	1.646659387	0.017502448	1.24106167	0.038243077
HP1.4687721610.0145902531.612787310.007905672VNN11.3876094260.0183229471.826146160.002860491DYSF1.3803340250.0002408431.387661320.003343979MS4A4A1.3438422610.0363590471.592408820.000535323SLC22A41.3396794980.0001314621.579136847.25E-05SLC25A371.3116783160.0018765041.0939440.004596929HCAR31.2826702910.0175898791.400548340.00658044RAB201.2674570050.0005937881.06645150.014955308SLPI1.2167777830.0087328961.138784990.009829437PGLYRP11.2142961580.026330621.40919650.006967278SPI11.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1521945911.49E-051.25243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.123362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.53888320.004675327RNASE31.040919390.0116483761.269810370.00569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003	MXD1	1.480058129	5.47E-05	1.0670285	0.004854455
VNN11.3876094260.0183229471.826146160.002860491DYSF1.3803340250.0002804331.387661320.003343979MS4A4A1.3438422610.0363590471.592408820.000535323SLC22A41.3396794980.0001314621.579136847.25E-05SLC25A371.3116783160.0018765041.0939440.004596929HCAR31.2826702910.0175898791.400548340.006558044RAB201.2674570050.00087328961.138784990.009829437PGLYRP11.2142961580.026330621.40919650.006997278SPI11.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.000915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.000468437ZYX1.123362730.0001721741.12717950.010817801FOLR31.0479315110.0377036531.53888320.004675327RNASE31.040919390.0191683761.269810370.006569719CCR11.0099598250.011014181.031130990.01780198CD79A-1.100328190.000253237-1.254720540.012659851PTPRK-1.401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B <t< td=""><td>HP</td><td>1.468772161</td><td>0.014590253</td><td>1.61278731</td><td>0.007905672</td></t<>	HP	1.468772161	0.014590253	1.61278731	0.007905672
DYSF1.3803340250.0002408431.387661320.003343979MS4A4A1.3438422610.0363590471.592408820.00035323SLC22A41.3396794980.001314621.579136847.25E-05SLC25A371.3116783160.0018765041.0939440.004596929HCAR31.2826702910.0175898791.400548340.006558044RAB201.2674570050.0005937881.06645150.014955308SLPI1.2167777830.0067328961.138784990.009829437PGLYRP11.2142961580.026330621.40919650.006967278SPI11.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.0009915551.286438170.007457779S100A91.1522945911.49E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.123362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.040919390.0191683761.269810370.006569719CCR11.0099598250.0110144181.03130990.017080198CD79A-1.1003238190.00253237-1.254720540.012659851PTPRK-1.401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002594237CD79B-	VNN1	1.387609426	0.018322947	1.82614616	0.002860491
MS4A4A1.3438422610.0363590471.592408820.000535323SLC22A41.3396794980.0001314621.579136847.25E-05SLC25A371.3116783160.0018765041.0939440.004596929HCAR31.2826702910.0175898791.400548340.006558044RAB201.2674570050.0005937881.06645150.01495308SLPI1.2167777830.0087328961.138784990.009829437PGLYRP11.2142961580.026330621.40919650.006967278SPI11.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.000915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.1233362730.0001721741.12717950.010817801FOLR31.0479315110.0377036531.53888320.0004675327RNASE31.0400919390.0191683761.269810370.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.00253237-1.254720540.012659851PTPRK-1.4382670280.00254237-1.254720540.012659851PTPRK-1.4382670280.000254237-1.1302287670.000254237CD79B<	DYSF	1.380334025	0.000240843	1.38766132	0.003343979
SLC22A41.3396794980.0001314621.579136847.25E-05SLC25A371.3116783160.0018765041.0939440.004596929HCAR31.2826702910.0175898791.400548340.006558044RAB201.2674570050.0008732881.06645150.014955308SLPI1.2167777830.0087328961.138784990.009829437PGLYRP11.2142961580.026330621.40919650.006967278SPI11.1736386340.000441561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.009915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.138369290.000468437ZYX1.123362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.037036531.53888320.004675327RNASE31.040919390.011014181.031130990.017080198CD79A-1.1003238190.00253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.0025424291.027343510.019134191	MS4A4A	1.343842261	0.036359047	1.59240882	0.000535323
SLC25A371.3116783160.0018765041.0939440.004596929HCAR31.2826702910.0175898791.400548340.006558044RAB201.2674570050.0005937881.06645150.014955308SLPI1.2167777830.0087328961.138784990.009829437PGLYRP11.2142961580.026330621.40919650.006967278SP111.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.0009915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.123362730.0001641541.136358340.011079268TIMP11.1165780070.001721741.12717950.010817801FOLR31.0479315110.0377036531.53888320.004675327RNASE31.040919390.0191683761.269810370.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.00253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.0002542491.027343510.0134297	SLC22A4	1.339679498	0.000131462	1.57913684	7.25E-05
HCAR31.2826702910.0175898791.400548340.006558044RAB201.2674570050.0005937881.06645150.014955308SLPI1.2167777830.0087328961.138784990.009829437PGLYRP11.2142961580.026330621.40919650.006967278SP111.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.0009915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.1233362730.0001641541.136358340.011079268TIMP11.1165780070.001721741.12717950.010817801FOLR31.040919390.0191683761.269810370.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.00253237-1.254720540.012659851PTPRK-1.401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.002444291.027343510.019134191	SLC25A37	1.311678316	0.001876504	1.093944	0.004596929
RAB201.2674570050.0005937881.06645150.014955308SLPI1.2167777830.0087328961.138784990.009829437PGLYRP11.2142961580.026330621.40919650.006967278SP111.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.0009915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.123362730.0001641541.136358340.011079268TIMP11.1165780070.001721741.12717950.010817801FOLR31.04091390.0191683761.269810370.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.000253237-1.254720540.012659851PTPRK-1.401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.19281040.002954237CD79B-1.4382670280.0002444291.027343510.019134191TR AF5-1.5476178033.06E-05-1.302327670.00359203	HCAR3	1.282670291	0.017589879	1.40054834	0.006558044
SLPI1.2167777830.0087328961.138784990.009829437PGLYRP11.2142961580.026330621.40919650.006967278SP111.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.0009915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.123362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.53888320.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.0002444291.027343510.019134191TR AF5-1.5476128033.06E-05-1.30287670.003592083	RAB20	1.267457005	0.000593788	1.0664515	0.014955308
PGLYRP11.2142961580.026330621.40919650.006967278SPI11.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.0009915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.1233362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.538888320.004675327RNASE31.0400919390.0110144181.031130990.017080198CD79A-1.1003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.0002444291.027343510.019134191TR AF5-1.54720783.06E-05-1.302387-0.00258727	SLPI	1.216777783	0.008732896	1.13878499	0.009829437
SPI11.1736386340.0006481561.269805330.008991834CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.0009915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.1233362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.53888320.004675327RNASE31.0400919390.0191683761.269810370.006569719CCR11.003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.0002444291.027343510.019134191TR A F5-1.5476178033.06E-05-1.302287670.003592083	PGLYRP1	1.214296158	0.02633062	1.4091965	0.006967278
CD141.1600851840.000475281.040271660.00959378PGD1.1591036170.0009915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.1233362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.53888320.004675327RNASE31.0400919390.0191683761.269810370.006569719CCR11.003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.0002444291.027343510.019134191TR A F5-1.5476178033.06E-05-1.302287670.003592083	SPI1	1.173638634	0.000648156	1.26980533	0.008991834
PGD1.1591036170.0009915551.286438170.007457779S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.1233362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.538888320.004675327RNASE31.0400919390.0191683761.269810370.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.000244291.027343510.019134191TR A F5-1.5476178033.06E-05-1.302287670.0025829083	CD14	1.160085184	0.00047528	1.04027166	0.00959378
S100A91.1522945911.49E-051.252243680.00194674LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.1233362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.538888320.004675327RNASE31.0400919390.0191683761.269810370.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.000244291.027343510.019134191TR A F51.5476178033.06E-05-1.302287670.002872083	PGD	1.159103617	0.000991555	1.28643817	0.007457779
LILRA51.1426164149.05E-051.646942340.009424013PLAUR1.137045286.79E-051.138369290.000468437ZYX1.1233362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.538888320.004675327RNASE31.0400919390.0191683761.269810370.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.000244291.027343510.019134191TR A F51.5476178033.06E-05-1.302287670.002872983	S100A9	1.152294591	1.49E-05	1.25224368	0.00194674
PLAUR1.137045286.79E-051.138369290.000468437ZYX1.1233362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.538888320.004675327RNASE31.0400919390.0191683761.269810370.0006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.000244291.027343510.019134191TR A F5-1.5476178033.06E-05-1.302287670.0028729283	LILRA5	1.142616414	9.05E-05	1.64694234	0.009424013
ZYX1.1233362730.0001641541.136358340.011079268TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.538888320.004675327RNASE31.0400919390.0191683761.269810370.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.0002444291.027343510.019134191TR A F5-1.5476178033.06E-05-1.302287670.003592083	PLAUR	1.13704528	6.79E-05	1.13836929	0.000468437
TIMP11.1165780070.0001721741.12717950.010817801FOLR31.0479315110.0377036531.538888320.004675327RNASE31.0400919390.0191683761.269810370.006569719CCR11.0099598250.0110144181.031130990.017080198CD79A-1.1003238190.000253237-1.254720540.012659851PTPRK-1.1401382728.35E-06-1.061730.000467041KLRF1-1.3966823630.003592261-1.193281040.002954237CD79B-1.4382670280.0002444291.027343510.019134191TR A F5-1.5476178033.06E-05-1.302287670.003592083	ZYX	1.123336273	0.000164154	1.13635834	0.011079268
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TRAE5 _1547617803 3.06E-05 _130228767 0.002582083	CD79B	-1.438267028	0.000244429	1.02734351	0.019134191
1.34/01/003 $3.000-03$ $[-1.30220/0]$ $0.00302003$	TRAF5	-1.547617803	3.06E-05	-1.30228767	0.003582083
TCL1A -1.835177218 0.0002124 -1.13118967 0.02285283	TCL1A	-1.835177218	0.0002124	-1.13118967	0.02285283

Table I. The common differentially expressed genes screened from GSE6269 and GSE29161.

Abbreviations: FC, fold change.

#### **PPI Network Analysis of Common DEGs**

After eliminating the isolated nodes, the PPI network was constructed with 25 nodes and 39 edges, including 23 up-regulated genes and two down-regulated genes, as shown in Figure 4A. The genes with degree  $\geq$  3 were deemed as hub genes in the PPI network, including SPI1 connecting seven nodes, S100A12 connecting seven nodes, S100A9 connecting five nodes, CD79A connecting four nodes, and CD79B connecting three nodes (Figure 4B).

#### Construction of a MiRNA-TF-mRNA Regulatory Network

A miRNA-TF-mRNA regulatory network was constructed, which consisted of 111 nodes and

105 edges, including 81 target miRNAs, 18 transcription factors, and 12 mRNAs (Figure 5). The result showed that SPI1 could target miR-361-5p, miR-155-5p, and miR-339-5p in the progression of IE.

#### Drug-Gene Network Analysis

In the drug-gene network, 90 drug-gene pairs were acquired, including 18 CDEGs (including SLPI, CD79B, S100A9, S100A12, and ANPEP) and 72 drugs (Figure 6). S100A9 could interact with methyldopa (Matola, Ahmedabad, India) and S100A12 could interact with rimegepant (New Haven, CT, USA), which might be the target of treatment of IE, but the specific mechanism is still unclear.



**Figure 2.** Heat map of the common DEGs. Each row represents the DEGs, and each column represents one of the samples of normal, IE, or *S. aureus* infection. The red and blue color represent upregulated and downregulated DEGs, respectively. Abbreviations: DEGs, differentially expressed genes; FC, fold change.

#### Discussion

Infective endocarditis is the inflammation of the endocardium and valves of the heart chambers caused by different pathogens including various bacteria, fungi, and viruses<sup>22</sup>, among which, *S. aureus* is one of the most important causative agents<sup>23</sup>. However, the ability to diagnose *S. aureus*-induced IE in the early stage is still poor, and hence, it is urgent and essential to uncover specific genes and pathways in the progression of *S. aureus*-induced IE. Two independent datasets were chosen in the current study. As the GSE6269 dataset included multiple categories of infectious patients and normal samples, we selected *S. aureus*-infected patients from this dataset. The GSE29161 was a novel dataset that had not previously been explored and included five IE patients and five healthy controls. Overall, 201 and 741 DEGs were respectively identified from the GSE6269 and GSE29161 databases. With the intersection of the DEGs, we discovered 36 CDEGs (30 up-regulated and six down-regulated), which meant



**Figure 3.** GO and KEGG analyses of the common DEGs. The vertical and horizontal axes represent GO term and -log10 (*p*-value) of the corresponding GO term, respectively. Different colors present main categories of the GO terms – BP, CC, and MF – as well as the KEGG pathway. Abbreviations: DEGs, differentially expressed genes; GO, Gene Ontology; MF, molecular function; CC, cellular component; BP, biological process; KEGG, Kyoto Encyclopedia of Genes and Genomes.



Figure 4. PPI network and histograms of core proteins of common DEGs. A, The red nodes and green nodes represent up-regulated genes and down-regulated genes, respectively. B, Abscissa shows the gene name; ordinate indicates the number of contiguous genes; and height represents the number of gene connections. Abbreviations: PPI, protein-protein interaction; DEGs, differentially expressed genes.

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**Figure 5.** MiRNA-TF-mRNA regulatory network. Red circles, green circles, blue triangles, and brown diamonds represent upregulated genes, downregulated genes, miRNAs, and TFs, respectively. Abbreviations: miRNAs, microRNAs; TF, transcription factor; mRNA, messenger RNA.

that these genes were associated with IE patients infected with *S. aureus*. All these CDEGs were annotated subjected to functional enrichment analyses. With the construction of the PPI network, hub CDEGs including HP, S100A12, SPI1, CD14, CCR1, S100A9, CD79a, FOLR3, PGLYRP1, SLP1, CD79b, RNASE2, and TIMP1 were mapped (nodes  $\geq$  3).

Our functional enrichment analyses showed that the B-cell receptor signaling pathway played

a crucial role in *S. aureus*-infected IE. The pivotal molecule in this process included CD79a and CD79b. CD79 consists of CD79a and CD79b and plays an important role in initiating the signal transduction cascade triggered by antigen binding to the B-cell antigen receptor<sup>24</sup>. CD79a and CD79b were found to be vital in the progression of lymphoma<sup>25</sup> and endometriosis<sup>26</sup>. With the consideration of PPI network, we discovered that porcine PU.1 gene (SPI1) could interact



Figure 6. Drug-gene network. Red nodes and gray rectangles represent upregulated genes and drugs, respectively.

with CD79a and CD79b. Niu et al<sup>27</sup> showed that SPI1 may be a transcription factor to regulate genes in the development of heart failure from acute myocardial infarction (AMI). In addition, the miRNA-TF-mRNA network was established; miR361-5p, miR155-5p, and miR339-5p were predicted to be connected with SPI1. Researchers found that ischemia-reperfusion injury in the heart and brain could be alleviated by the up-regulation of miR361<sup>28,29</sup>. MiR339 was reported to inhibit cell proliferation and invasion in hepatocellular carcinoma<sup>30</sup>. Broad evidence showed that miR155 might work in the heart, including enhancing oxidative damage in endothelial cells preprocessed with H2O2<sup>31</sup>, promoting apoptosis after AMI<sup>32</sup>, and impairing cardiac function in patients with post-MI cardiac failure<sup>33</sup>. The relationship between miR155 and infection has also been reported. Shen et al<sup>34</sup> discovered that down-regulation of miR155 might inhibit inflammatory response in influenza A virus-affected human pulmonary microvascular endothelial cells. To our knowledge, this study was the first to reveal that CD79a, CD79b, and SPI1 could interact with each other, and that miR361-5p, miR155-5p, and miR339-5p might target SPI1 in the pathogenesis of *S. aureus*-induced IE.

Interestingly, we observed another two homologous molecules—S100 Calcium Binding Protein A9 (S100A9) and S100 Calcium Binding Protein A12 (S100A12)—with regard to the hub genes in the PPI network. They are both calcium- and zinc-binding proteins that belong to the family of S100 proteins. Their prominent roles in the regulation of inflammatory and immune response have been demonstrated by comprehensive data, which was consistent with our enrichment analyses. Banupriva et al<sup>35</sup> discovered zinc supplementation by targeting S100A9 expression could reduce inflammation in neonates with sepsis. Czapski et al<sup>36</sup> found that the level of S100A9 expression was higher in the brains of subjects with Alzheimer's disease, indicating that the immune response was activated. Müller et al<sup>37</sup> reported that serum alarmin S100A8/S100A9 levels could be potential biomarkers in myocarditis. The reviews of S100A12 showed that it was likely a potential biomarker of therapeutic efficacy and disease progression in coronary heart disease<sup>38</sup>. Shah et al<sup>39</sup> found that S100A9 and S100A12 played key immune response roles in inflammatory disorders of the cardiovascular system. Taking the drug-gene network into consideration, we speculated several drugs targeting S100A9 and S100A12 in treating S. aureus-induced IE, including methyldopa targeting S100A9, an antihypertensive drug, and rimegepant targeting S100A12, a migraine drug. However, more evidence is still required for confirming the function of these drugs in treating AF. Until now, few research studies have investigated the specific mechanisms of the S100 protein family and S. aureus-induced IE. Moreover, further laboratory studies are essential to confirm the observations of key genes and pathways in S. aureus-induced IE.

#### Conclusions

Five pivotal genes were hypothesized in IE caused by *S. aureus*, including CD79a, CD79b, SPI1, S100A9, and S100A12; of these, CD79a, CD79b, and SPI1 co-function by participating in the B-cell receptor signaling pathway, while S100A9 and S100A12 played crucial roles in the immune and inflammatory response. Our results have provided new perspectives for the early detection of *S. aureus*-induced IE.

#### **Conflict of Interest**

The Authors declare that they have no conflict of interests.

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