## **ORIGINAL ARTICLE**

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# Circulating microRNA signature of steroid-induced osteonecrosis of the femoral head

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#### Abstract

Objectives: Steroid-induced osteonecrosis of the femoral head (ONFH) is a common orthopaedic disease of which early detection remains clinically challenging. Accumulating evidences indicated that circulating microRNAs (miRNAs) plays vital roles in the development of several bone diseases. However, the association between circulating miRNAs and steroid-induced ONFH remains elusive.

Materials and methods: miRNA microarray was performed to identify the differentially abundant miRNAs in the serums of systemic lupus erythematosus (SLE) patients with steroid-induced ONFH as compared with SLE control and healthy control group. We predicted the potential functions of these differentially abundant miRNAs using Gene Ontology (GO) and Kyoto Encyclopedia of Genes and Genomes (KEGG) pathway analyses and reconstructed the regulatory networks of miRNA-mRNA interactions.

Results: Our data indicated that there were 11 differentially abundant miRNAs (2 upregulated and 9 downregulated) between SLE-ONFH group and healthy control group and 42 differentially abundant miRNAs (14 upregulated and 28 downregulated) between SLE-ONFH group and SLE control group. We also predicted the potential functions of these differentially abundant miRNAs using Gene Ontology (GO) and Kyoto Encyclopedia of Genes and Genomes (KEGG) pathway analyses and reconstructed the regulatory networks of miRNA-mRNA interactions.

Conclusions: These findings corroborated the idea that circulating miRNAs play significant roles in the development of ONFH and may serve as diagnostic markers and therapeutic targets.

# **1** | INTRODUCTION

Osteonecrosis of the femoral head (ONFH), which can be categorized as traumatic or non-traumatic, is characterized by progressive osteocyte and bone marrow necrosis as a result of interruption of blood supply to the femoral head, causing the associated structural changes and even collapse.<sup>1-4</sup> ONFH is a common orthopaedic condition, which afflicts more than 20 million of people worldwide.5-7 The use of corticosteroids alone accounts for approximately 24.1% of all ONFH cases.<sup>8,9</sup> The

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pathogenesis of steroid-associated ONFH is poorly understood, in which fat cell hypertrophy, fat embolization, intravascular coagulation and osteocyte apoptosis are believed to play significant role in the pathogenesis.<sup>9-11</sup> Several studies have shown that only a subset of patients would develop ONFH within a few weeks of steroid therapy, suggesting that genetic factors might dictate the susceptibility to steroid-associated ONFH.<sup>12-14</sup> Nevertheless, early detection of steroid-associated ONFH remains clinically challenging. Therefore, it is pivotal to identify biomarkers for early non-invasive diagnosis of this disabling condition.

MicroRNAs (miRNAs) are a group of non-coding, endogenous, small RNAs of ~23 nucleotides in length.<sup>15-18</sup> miRNAs are highly evolutionarily I F

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conserved and their expression is tissue-specific.<sup>19,20</sup> They play vital roles in different physiological and pathological processes via regulating gene expression post-transcriptionally.<sup>21-23</sup> Aberrant expression of miRNAs has been documented in the different orthopaedic conditions, such as intervertebral disc degeneration, osteoarthritis, osteoporosis and osteosarcoma.<sup>24-27</sup> Several recent studies also suggested that miRNAs might take part in the development of ONFH.<sup>28-30</sup> To date, alterations in circulating miRNAs in steroid-associated ONFH remain largely unknown.

In this study, we profiled differentially abundant miRNAs in serums of systemic lupus erythematosus (SLE) patients with steroidassociated ONFH as compared with SLE and healthy controls. We further inferred the potential functions of these differentially abundant miRNAs by Gene Ontology (GO) and Kyoto Encyclopedia of Genes and Genomes (KEGG) pathway analyses to reconstruct the regulatory networks among the deregulated miRNAs and their target mRNAs.

#### TABLE 1 Differentially abundant circulating miRNAs in SLE-ONFH patients as compared with healthy controls

Gene ID	Gene name	Gene location	log <sub>2</sub> (fold change)	P-value	Deregulation
MIMAT0018958	hsa-miR-4440	chr2:239990525-239990546 (-)	1.646161	.004331	Up
MIMAT0027526	hsa-miR-6813-5p	chr20:62708336-62708358 (-)	1.770415	.033599	Up
MIMAT0027474	hsa-miR-6787-5p	chr17:80194549-80194570 (+)	-3.8425	.002981	Down
MIMAT0003274	hsa-miR-606	chr10:77312276-77312296 (+)	-1.21348	.009628	Down
MIMAT0000077	hsa-miR-22-3p	chr17:1617208-1617229 (-)	-1.22175	.026513	Down
MIMAT0025846	hsa-miR-6717-5p	chr14:21491514-21491535 (-)	-1.88701	.028749	Down
MIMAT0002871	hsa-miR-500a-3p	chrX:49773090-49773111 (+)	-1.0331	.032831	Down
MIMAT0000425	hsa-miR-130a-3p	chr11:57408725-57408746 (+)	-2.12937	.038925	Down
MIMAT0018085	hsa-miR-3663-3p	chr10:118927206-118927228 (-)	-1.34975	.043827	Down
MIMAT0000279	hsa-miR-222-3p	chrX:45606442-45606462 (-)	-1.84502	.044527	Down
MIMAT0000762	hsa-miR-324-3p	chr17:7126627-7126646 (-)	-1.28867	.048921	Down

TABLE 2 Differentially abundant circulating miRNAs in SLE-ONFH patients as compared with SLE controls

Gene ID	Gene name	Gene location	log <sub>2</sub> (fold change)	P-value	Deregulation
MIMAT0004949	hsa-miR-877-5p	chr6:30552109-30552128 (+)	1.403665	.000171	Up
MIMAT0005939	hsa-miR-1281	chr22:41488549-41488565 (+)	1.88578	.002078	Up
MIMAT0018958	hsa-miR-4440	chr2:239990525-239990546 (-)	2.089196	.002646	Up
MIMAT0019069	hsa-miR-4530	chr19:39900269-39900286 (-)	1.695803	.004219	Up
MIMAT0019021	hsa-miR-4487	chr11:47422574-47422592 (+)	1.955596	.006841	Up
MIMAT0019027	hsa-miR-4492	chr11:118781474-118781490 (+)	1.361523	.009779	Up
MIMAT0006765	hsa-miR-1825	chr20:30825633-30825650 (+)	1.013609	.012637	Up
MIMAT0019044	hsa-miR-4507	chr14:106324294-106324313 (-)	1.221411	.013724	Up
MIMAT0026641	hsa-miR-1298-3p	chrX:113949721-113949741 (+)	1.697628	.01588	Up
MIMAT0027655	hsa-miR-6877-3p	chr9:135927422-135927442 (+)	2.656321	.016403	Up
MIMAT0009447	hsa-miR-1972	chr16:15104186-15104207 (-) /// chr16:70064296-70064317 (+)	1.539704	.01892	Up
MIMAT0003239	hsa-miR-574-3p	chr4:38869713-38869734 (+)	1.907779	.039479	Up
MIMAT0017990	hsa-miR-3613-5p	chr13:50570601-50570622 (-)	2.193916	.045219	Up
MIMAT0021021	hsa-miR-5001-5p	chr2:233415240-233415263 (-)	1.758833	.047778	Up
MIMAT0027474	hsa-miR-6787-5p	chr17:80194549-80194570 (+)	-3.6371	.000723	Down
MIMAT0030422	hsa-miR-7847-3p	chr11:1901335-1901355 (+)	-1.11224	.002968	Down
MIMAT0002871	hsa-miR-500a-3p	chrX:49773090-49773111 (+)	-1.46197	.006979	Down
MIMAT0000455	hsa-miR-185-5p	chr22:20020676-20020697 (+)	-1.73268	.011071	Down
MIMAT0018936	hsa-miR-4423-3p	chr1:85599525-85599545 (+)	-1.25316	.012616	Down

(Continues)

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# TABLE 2 (Continued)

Gene ID	Gene name	Gene location	log <sub>2</sub> (fold change)	P-value	Deregulation
MIMAT0000279	hsa-miR-222-3p	chrX:45606442-45606462 (-)	-2.34661	.013065	Down
MIMAT0016858	hsa-miR-4306	chr13:100295377-100295393 (+)	-1.91896	.017459	Down
MIMAT0000691	hsa-miR-130b-3p	chr22:22007643-22007664 (+)	-1.9629	.018315	Down
MIMAT0000425	hsa-miR-130a-3p	chr11:57408725-57408746 (+)	-2.4702	.018528	Down
MIMAT0018085	hsa-miR-3663-3p	chr10:118927206-118927228 (-)	-1.57788	.01914	Down
MIMAT0000765	hsa-miR-335-5p	chr7:130135967-130135989 (+)	-1.12202	.01966	Down
MIMAT0000078	hsa-miR-23a-3p	chr19:13947409-13947429 (-)	-3.85085	.019784	Down
MIMAT0025846	hsa-miR-6717-5p	chr14:21491514-21491535 (-)	-1.95966	.020968	Down
MIMAT000080	hsa-miR-24-3p	chr19:13947103-13947124 (-) /// chr9:97848346-97848367 (+)	-4.1226	.022312	Down
MIMAT0014991	hsa-miR-3128	chr2:178120712-178120734 (-)	-2.19444	.02537	Down
MIMAT0004775	hsa-miR-502-3p	chrX:49779257-49779278 (+)	-1.00727	.026379	Down
MIMAT0000104	hsa-miR-107	chr10:91352513-91352535 (-)	-2.41354	.031698	Down
MIMAT0000101	hsa-miR-103a-3p	chr20:3898188-3898210 (+) /// chr5:167987909-167987931 (-)	-2.07257	.034555	Down
MIMAT0000418	hsa-miR-23b-3p	chr9:97847547-97847567 (+)	-2.86383	.036149	Down
MIMAT0018976	hsa-miR-4454	chr4:164014759-164014778 (-)	-2.35459	.040317	Down
MIMAT0000278	hsa-miR-221-3p	chrX:45605608-45605630 (-)	-3.00149	.04083	Down
MIMAT0000075	hsa-miR-20a-5p	chr13:92003326-92003348 (+)	-2.01992	.040896	Down
MIMAT0000449	hsa-miR-146a-5p	chr5:159912379-159912400 (+)	-2.68623	.042199	Down
MIMAT0031011	hsa-miR-8084	chr8:94041989-94042011 (+)	-2.57342	.042858	Down
MIMAT0000256	hsa-miR-181a-5p	chr1:198828237-198828259 (-) /// chr9:127454759-127454781 (+)	-2.4832	.043138	Down
MIMAT0004945	hsa-miR-744-5p	chr17:11985226-11985247 (+)	-2.12729	.04388	Down
MIMAT0000440	hsa-miR-191-5p	chr3:49058105-49058127 (-)	-2.6033	.046884	Down
MIMAT000082	hsa-miR-26a-5p	chr12:58218441-58218462 (-) /// chr3:38010904-38010925 (+)	-2.99502	.047823	Down

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# **TABLE 3** Differentially abundant circulating miRNAs in SLE controls as compared with healthy controls

Gene ID	Gene name	Gene location	log <sub>2</sub> (fold change)	P-value	Deregulation
MIMAT0027526	hsa-miR-6813-5p	chr20:62708336-62708358 (-)	1.692362	.047435	Up
MIMAT0015072	hsa-miR-320e	chr19:47212551-47212568 (-)	-2.03805	.001062	Down
MIMAT0018352	hsa-miR-3937	chrX:39520530-39520552 (+)	-1.18781	.012754	Down
MIMAT0005929	hsa-miR-1275	chr6:33967795-33967811 (-)	-1.10311	.019332	Down
MIMAT0003251	hsa-miR-548a-3p	chr6:18572075-18572096 (+) /// chr6:135560358-135560379 (+) /// chr8:105496612-105496633 (-)	-1.2154	.021813	Down
MIMAT0027454	hsa-miR-6777-5p	chr17:17716832-17716854 (-)	-1.33424	.024055	Down
MIMAT0015081	hsa-miR-548x-3p	chr13:66540484-66540503 (-) /// chr21:20058418-20058437 (-)	-1.34711	.036122	Down
MIMAT0027393	hsa-miR-6746-3p	chr11:61645688-61645709 (-)	-1.03827	.04293	Down
MIMAT0028117	hsa-miR-7110-5p	chr3:122880646-122880666 (+)	-1.6558	.049989	Down



**FIGURE 1** Differentially abundant miRNAs in serums of SLE-ONFH patients. A, A heatmap representation of all differentially abundant miRNAs is shown. B, A heatmap of differentially abundant miRNAs between the SLE-ONFH group and healthy control group. C, A heatmap of differentially abundant miRNAs between SLE-ONFH group and the SLE control group. D, The heatmap of differentially abundant miRNAs between the SLE and healthy control groups was shown. 1, 2 and 3 denote samples in the SLE-ONFH group; 112, 114 and 201 denote samples in the SLE control group; 111, 202 and 203 denote healthy control samples

# 2 | MATERIALS AND METHODS

#### 2.1 | Serum collection

Blood samples were collected from 3 patients with ONFH secondary to application of corticosteroids for the treatment of SLE. Three SLE patients that underwent similar corticosteroid treatment but without ONFH together with 3 matched healthy subjects were used as controls. Subject information is provided in Table S1. This study had been approved by the Clinical Research Ethics Committee of the Peking Union Medical College Hospital (PUMCH) with a fully informed

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written consent obtained from each participated patient. Serum was separated from the blood sample immediately after blood collection and was stored at  $-80^{\circ}$ C.

## 2.2 | RNA extraction

Total RNA from the serum was extracted using the MiRNeasy Mini kit (217004; Qiagen, Hilden, Germany) according to the manufacturers' instructions. Total RNA was dissolved in 300  $\mu$ L elution buffers and measured by the NanoDrop 2000 (Thermo Fisher Scientific, Waltham, MA, USA). The total RNA was concentrated following centrifugation.

#### 2.3 | MicroRNA microarray

Affymetrix microRNA 4.0 array was performed to analyse serum microRNAs according to the manufacturer's instructions. For each sample, a total of 100 ng of RNA was dephosphorylated, the 3'-end labelled with the Cy3-pCp, purified, dried and hybridized to the array. Average values of the replicate spots of each miRNA were back-ground subtracted, normalized and subject to further analysis. The expressed result was normalized by using median normalization assay, after which differentially expressed miRNA was identified through the volcano plot filtering. Hierarchical clustering was performed by using MEV software. Normalization was performed using the signal of U6 small nuclear RNA on the chip.

#### 2.4 | KEGG pathway and Go annotation analyses

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Kyoto Encyclopedia of Genes and Genomes pathways and GO annotations were used to infer the functional roles of differentially abundant circulating miRNAs. KEGG pathway analysis was applied to identify the significant signalling pathways (http://www.genome.jp/ kegg/). GO analysis was performed to determine genetic regulatory networks of interest through forming hierarchical categories in BP (biological process), CC (cellular component) and MF (molecular function) fields (http://www.geneontology.org).

## 2.5 | Analysis of miRNA regulatory network

To delineate the role and interactions among miRNAs and mRNAs in steroid-associated ONFH pathogenesis, we constructed a miRNA regulatory network. The interaction network was established and visually displayed using the Cytoscape software. miRNA-mRNA interactions were predicted with the miRNA and PsRobot software.

# 2.6 | Statistical analysis

Results were presented as the mean  $\pm$  SD (standard deviation). The difference between 2 groups was analysed by Student's *t* test. One-way or two-way analysis of variance (ANOVA) was performed to measure the significant difference between 3 or more groups. *P* < .05 was considered to be statistically significant.



**FIGURE 2** Volcano plots of differentially abundant miRNAs in serums of ONFH patients. A, Volcano plots showing differentially abundant miRNAs between the SLE-ONFH group and healthy control group. B, Volcano plots showing differentially abundant miRNAs between SLE-ONFH group and the SLE control group. C, Volcano plots showing differentially abundant miRNAs between the SLE and healthy control groups. Blue and red dots indicate downregulated and upregulated miRNAs, respectively

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# 3 | RESULTS

# 3.1 | Differentially abundant miRNAs in serums of SLE-ONFH patients

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To investigate if circulating miRNAs could be used to differentiate steroid-associated SLE-ONFH patients from SLE and healthy controls, microRNA microarray was performed. We analysed differentially abundant miRNAs by the significance analysis of microarrays (SAM) method with the Cuffdiff software following the criteria of q < 0.05. Differentially abundant miRNAs between different groups

were visualized using heatmap and Volcano plot. Serum miRNAs with increased or decreased levels in the SLE-ONFH group compared with SLE or healthy controls are listed in Tables 1-3, respectively. All differentially abundant miRNAs are shown in Figure 1A as a heatmap. Figure 1B shows the heatmap of differentially abundant miRNAs between the SLE-ONFH group and healthy control group, while Figure 1C shows the heatmap of differentially abundant miRNAs between SLE-ONFH group and the SLE control group. The heatmap of differentially abundant miRNAs between the SLE and healthy control groups was shown in Figure 1D. Figure 2 shows volcano plots, which



**FIGURE 3** Functional predictions of differentially abundant miRNAs in SLE-ONFH vs healthy control. A-C, Molecular functions, biological processes and cellular components were predicted to be altered by mRNAs targeted by differentially abundant miRNAs in ONFH. Directed Acyclic Graph (DAG) is the graphical display of GO enrichment results with candidate target genes. D, The number of genes in GO term was shown in histograph. E-G, Enriched biological processes, cellular components and molecular functions in ONFH were shown. H, Scatterplot of enriched KEGG pathway showing statistics of pathway enrichment in ONFH

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depict significance vs fold change on the y- and x-axes, respectively, of differentially abundant miRNAs between groups. Details of differentially abundant miRNAs are as follows: 11 differentially abundant miRNAs (2 upregulated and 9 downregulated), 42 differentially abundant miRNAs (14 upregulated and 28 downregulated) and 9 differentially abundant miRNAs (1 upregulated and 8 downregulated) between SLE-ONFH group and healthy control group, SLE-ONFH group and SLE control group, and SLE control group and healthy control group, respectively. In particular, we observed consistent increased levels ofmiR-4440 and decreased levels of 6 miRNAs, namely miR-6787-5p, 6717-5p, miR-500a-3p, miR-130a-3p, miR-3663-3p and miR-222-3p, in SLE-ONFH patients as compared with both control groups.



FIGURE 4 Functional predictions of differentially abundant miRNAs in SLE-ONFH vs SLE control. A-C, Molecular functions, biological processes and cellular components were predicted to be altered by mRNAs targeted by differentially abundant miRNAs in ONFH. Directed Acyclic Graph (DAG) is the graphical display of GO enrichment results with candidate target genes. D, The number of genes in GO term was shown in histograph. E-G, Enriched biological processes, cellular components and molecular functions in ONFH were shown. H, Scatterplot of enriched KEGG pathway showing statistics of pathway enrichment in ONFH

# 3.2 | Functional prediction of differentially abundant miRNAs in ONFH

To infer the biological functions of differentially abundant circulating miRNAs in the pathogenesis of ONFH, genes with absolute value of correlation of>0.95 were chosen to predict the function of miR-NAs by using the GO and KEGG pathway assay. GO is the standard classification system of gene function, whereas directed acyclic graph (DAG) is a graphical display of differentially expressed GO enrichment results. The branch shows the relationship of the inclusion, which indicates the scope from top to bottom. The top data of GO enrichment were selected as the master node of DAG and were shown together through GO term by including the relationship. Systematic GO terms are shown together, where the colour depth represents the enrichment degree. The DAGs of the BP, CC and MF, whose GO enrichment by the colocalization and co-expression of



**FIGURE 5** Functional predictions of differentially abundant miRNAs in SLE vs healthy controls. A-C, Molecular functions, biological processes and cellular components were predicted to be altered by mRNAs targeted by differentially abundant miRNAs in SLE. Directed Acyclic Graph (DAG) is the graphical display of GO enrichment results with candidate target genes. D, The number of genes in GO term was shown in histograph. E-G, Enriched biological processes, cellular components and molecular functions were shown. H, Scatterplot of enriched KEGG pathway showing statistics of pathway enrichment in SLE



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genes of differentially abundant miRNAs, are shown in Figures 3A-G between SLE-ONFH group and healthy control group. The DAGs of BP, CC and MF, whose GO enrichment through target genes of differentially abundant miRNAs between SLE-ONFH group and SLE group, are shown in Figure 4A-G. Figure 5A-G shows the DAG of BP, CC and MF, all of which GO enrichment analysis through target genes of differentially expressed miRNAs between SLE group and healthy control group. In particular, SNARE complex that consists of a large protein superfamily involved in vesicle fusion and transport was significantly enriched in the SLE-ONFH groups as compared with both control groups.

Different genes interact with each other to exert their biological functions in the tissue. The main signal transduction pathways and biochemical pathways engaged by candidate target genes can be identified by pathway enrichment analysis. KEGG is a major public database of cellular signalling pathways. KEGG pathway was adopted as a unit, and when using the hyper-geometric test, and significantly enriched pathways engaged by candidate target genes compared with the entire genome background can be identified. Herein, we combined KEGG analysis with intersection of co-expression and co-localization of genes of differentially abundant miRNAs, target genes of differentially expressed miRNAs and predicted mRNAs; the most significantly involved pathways in ONFH pathogenesis were shown in Panel H of Figures 3-5 for comparison between SLE-ONFH group and control group (Figure 3H), SLE-ONFH group and SLE control group (Figure 4H), and SLE control group and healthy control group (Figure 5H). In particular, hypertrophic cardiomyopathy was significantly enriched in the SLE-ONFH groups as compared with both control groups, suggesting that hypertrophic cardiomyopathy and steroid-associated ONFN might share an overlapped molecular pathogenic pathway.



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#### 3.3 | Regulatory network of miRNAs and mRNAs

To analyse the molecular mechanism of the differentially abundant miR-NAs in ONFH pathogenesis, we constructed the regulatory network of the involved miRNAs and the predicted target mRNAs. Figure 6 shows miRNA-mRNA regulatory network, involving deregulated (down/up) miRNAs and their deregulated target genes (fold change: >2.0;  $P \le .05$ ) between SLE-ONFH group and healthy control group. Figures 7 and 8 show miRNA-mRNA regulatory network, involving deregulated (down/ up) miRNAs and their deregulated target genes (fold change: >2.0;  $P \le .05$ ) between SLE-ONFH group and SLE control group and between SLE control group and healthy control group, respectively. These data explained the regulatory relationship between miRNA and mRNA in the pathogenesis of steroid-associated ONFH.

# 4 | DISCUSSION

Multiple lines of evidences have suggested that miRNAs could play active and crucial roles in the development of ONFH.<sup>8,31-34</sup> In this study, we performed miRNA microarray to identify the differentially abundant miRNAs in the serums of SLE patients with steroid-induced ONFH as compared with SLE control and healthy control groups. Our data indicated that miR-4440 was commonly increased,



FIGURE 7 Regulatory networks of miRNAs and mRNAs between SLE-ONFH group and the SLE control group

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while miR-6787-5p, 6717-5p, miR-500a-3p, miR-130a-3p, miR-3663-3p and miR-222-3p were consistently decreased in SLE-ONFH patients as compared with both control groups. We also predicted the potential functions of differentially abundant miR-NAs using GO and KEGG pathway analyses and reconstructed the regulatory networks of miRNA-mRNA interactions. These findings corroborated the idea that miRNAs play significant roles in the development of ONFH and may serve as diagnostic markers and therapeutic targets.

Previous studies indicated that miRNAs played important roles in the development of ONFH. For example, Wu et al<sup>32</sup> used the miRNA microarray to investigate miRNA expression in the femoral head from cases with ONFH and femoral neck fracture. Their data revealed that 17 miRNAs were downregulated while 22 miRNAs were upregulated. Wei et al<sup>35</sup> used miRNA microarray to profile miRNA expression in the serum of hormone non-traumatic ONFH and the serum of healthy volunteers. There were 3 miRNAs downregulated and 9 miRNAs upregulated in the hormone non-traumatic ONFH group compared with healthy control. Our previous study also showed that there were 27 miRNAs deregulated in the steroid-induced ONFH patients. Some miRNAs were involved in the modulation of cell differentiation, proliferation and apoptosis of stem cells. However, miRNAs deregulated in these studies were not consistent.

In this study, we found that there were 11 differentially abundant miRNAs (2 upregulated, miR-4440 and miR-6813-5p; and 9 down-regulated: miR-6787-5p, miR-606, miR-22-3p, miR-6717-5p, miR-500a-3p, miR-130a-3p, miR-3663-3p, miR-222-3p and miR-324-3p) between ONFH group and healthy control group. Forty-two differentially abundant miRNAs (14 upregulated and 28 downregulated) were found between ONFH group and SLE control group. These microarray results offered a starting point for explaining the potential roles of miRNAs in the ONFH. Among these differentially abundant miRNAs identified in study, the consistently deregulated miRNAs, namely miR-4440, miR-6787-5p, 6717-5p, miR-500a-3p, miR-130a-3p,



FIGURE 8 Regulatory networks of miRNAs and mRNAs between SLE and healthy control groups

miR-3663-3p and miR-222-3p, might be key regulators for non-traumatic steroid-induced ONFH.

Although we identified the differentially abundant miRNAs in steroid-induced ONFH, the mechanism underlying such alterations is still poorly understood. The GO is a powerful bioinformatic tool, which unifies the representation of genes and their attributes across all species.<sup>36-38</sup> GO annotations and GO terms were good predictors for function and trend of gene.<sup>39,40</sup> KEGG pathway databases conserved the higher useful order functional information for systematic assignment of gene functions and were widely used in the enrichment analysis.<sup>38,41,42</sup> Thus, we determined the miRNArelated functions and the relevance of corresponding pathways in the steroid-associated ONFH with KEGG term and GO enrichment analyses in this study. Our results showed that the most involved pathways in ONFH pathogenesis were signalling pathways regulating pluripotential cell, endocytosis and axon guidance. We also found that SNARE complex plays a key role in vesicle transport and fusion was significantly enriched. In this connection, vesicle trafficking is fundamental to the normal functions of osteoclasts and osteoblasts in bone remodelling and homeostasis [43]. However, the function and mechanisms of miRNAs as predicted by KEGG and GO analyses should be experimentally verified and studied in-depth in the future work. The molecular mechanism underlying the interaction of miR-NAs and mRNAs in ONFH remains largely unclear. Therefore, for the first time, the miRNA-mRNA network of ONFH was reconstructed based on our second sequencing data. These pioneering discoveries might enrich our understanding on the mechanisms underlying the role of miRNAs in ONFH pathogenesis.

In conclusion, our study indicated that several miRNAs were differentially abundant in the serums of steroid-induced ONFH with SLE, as compared with SLE patients without ONFH and healthy subjects. Our bioinformatic analyses also predicted the signalling pathways and target genes of these miRNAs, which may provide potential understanding of the involvement of miRNAs in the initiation and development of ONFH. These data may provide new targets for the early diagnosis and treatment of ONFH. However, large-scale validation studies in different populations are still required to fully realize the potential of circulating miRNAs as diagnostic markers for ONFH.

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#### SUPPORTING INFORMATION

Additional Supporting Information may be found online in the supporting information tab for this article.

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