Research Paper

Identifying miRNA-mRNA Pairs and Novel miRNAs from Hepatocellular Carcinoma miRNomes and TCGA Database

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Abstract

Increasing evidence shows microRNAs (miRNAs) are engaged in hepatocellular carcinoma (HCC). To identify novel feasible miRNA/mRNA pairs involved in hepatocarcinogenesis, an in-depth analysis of miRNomes in human non-tumor liver and HCC samples was carried out in this study. Firstly, differentially expressed miRNAs were obtained from deep sequencing of 15 liver samples, and verified in an independent data from The Cancer Genome Atlas (TCGA) database. Then, differentially expressed mRNA targets were selected from TCGA, and the differential miRNA/mRNA pairs with negative correlations were screened out. Finally, functional enrichment analysis was used to predict the functions of miRNA/mRNA pairs in HCC. In our study, 81 miRNA/mRNA pairs and 7 novel miRNAs were found. We constructed a hub interaction model with 9 miRNA/mRNA pairs to further investigate molecular mechanism of HCC. Survival analysis identified nine genes (hsa-miR-137, hsa-miR-490, BIRC5, TOP2A, CDC25C, IGF2BP1, IQGAP3, NCAPG and VIPR1) with significant influence on prognosis of HCC patients. In conclusion, the miRNA/mRNA pairs identified in our study may have some potential values to be further studied in progression, diagnosis and prognosis of HCC.

Introduction

As one of the most frequently diagnosed cancers, Hepatocellular carcinoma (HCC) is a highly lethal malignancy. According to the newest statistics of estimated new cancer deaths, HCC is the fourth leading cause of cancer death in United States [1]. MicroRNA (miRNA) is a vital class of conserved noncoding RNAs. Although mature miRNA is very short, only 20-22 nucleotides (nt), it plays important regulatory roles by targeting to mRNAs for cleavage or translational repression. Abnormal miRNAs expression can affect biological behaviour of cancer, including cell proliferation, cell death, angiogenesis, invasion and migration [2]. It is now generally accepted that both of 5'-untranslational region (5'-UTR) and 3'-untranslational region (3'-UTR) of mRNAs can be targets of miRNAs. Complementary base pairing of miRNAs’ seed region and 5'-UTR of mRNAs can enhance the stability of mRNAs [3]. If the base pairing occurs to miRNAs and 3'-UTR of mRNAs, it will lead to mRNA-destabilization and promote degradation of mRNAs [4]. A large amount of researches found that this molecular mechanism has profound influence on carcinogenesis and development in HCC [5-6]. Until now, at least 16 miRNAs and 6 clusters of miRNAs were regarded as circulating biomarkers for HCC diagnosis or for prediction of prognosis [7]. Meanwhile, nucleic acid-based drugs such as small interfering RNA (siRNA) and miRNAs can also be used for the HCC treatment [8].

Although tremendous progress has been made in this research field, novel feasible miRNA/mRNA
pairs are still required to reveal molecular mechanism of carcinogenesis and development in HCC, especially to find more therapeutic strategies for HCC. Bioinformatics analysis of miRNA and mRNA expression profile can help to find key regulatory miRNA/mRNA pairs. Recently, with the development of high-throughput sequencing technology and bioinformatics analytic method, more and more miRNA/mRNA pairs were discovered to play a vital role in cancer. Xile Zhou et al. found a total of 372 pairs of miRNA-mRNA were found and 108 target genes of miRNA in colorectal cancer, among which miR-149 was less known in colorectal cancer before [9]. Through an in-depth analysis of miRNomes in human normal liver, hepatitis liver, and HCC, Jin Hou et al. found that miR-199a/b-3p can act as a tumor suppressor, inhibits HCC growth via target to PAK4 [10]. Finding more novel miRNAs related to HCC is still necessary. It can provide more possibility approaches for research on HCC.

To discover novel feasible miRNA/mRNA pairs, we screened the differentially expressed miRNAs and novel miRNAs from small RNAs deep sequencing of 15 human liver samples. The differentially expressed miRNAs were verified in expression profile of miRNAs downloaded from The Cancer Genome Atlas (TCGA) database to improve the credibility of it. Then, through analyzing the verified differentially expressed miRNAs and mRNA expression profile downloaded from TCGA, 81 miRNA/mRNA pairs were screened out. A part of them are less known in HCC still now, hoping them will contribute to diagnosis, prognosis or treatment of HCC. In addition, 7 novel miRNAs expressed differentially in HCC are worthy of being studied.

**Materials and Methods**

**Clinical specimens and cell lines.**

The collection of human liver tissue was approved by the Ethics Committee in Zhongnan Hospital of Wuhan University. Informed consent was obtained from each patient. The methods were performed in accordance with the relevant guidelines and regulations. The 6 HCC tissues and 6 ANTs were obtained from 6 HCC patients; the 3 non-tumor tissues were collected from 3 hepatic hemangioma patients. These 9 patients were operated in Zhongnan Hospital of Wuhan University. All the liver samples were immersed in RNAlater™ Stabilization Solution (Invitrogen, USA) and stored at -80 °C before total RNA was extracted.

**miRNomes of 15 liver tissues.**

The small RNAs of 15 liver tissues were extracted by trizol reagent and purified by the polycrylamide gel electrophoresis (PAGE) gel. Briefly, after PAGE purification of small RNA molecules (under 30 bases) and ligation of a pair of adaptors to their 3’ and 5’ ends, the small RNAs were amplified using the adaptor primers to get DNA fragment. Then, the DNA fragments around 80 bp were purified by agarose gels to get cDNA libraries. Quality of the cDNA libraries was checked and sequenced by Agilent 2100 Bioanalyzer and Illumina HiSeq 2000 technology. Finally, miRNomes of 15 liver tissues were obtained.

**miRNAseq and RNAseq of TCGA data.**

The data downloaded from TCGA was accordance with relevant laws, and any necessary approvals and informed consent documents [11]. The miRNAseq and RNAseq level 3 data of HCC were downloaded from TCGA database. Data platforms for miRNAseq and RNAseq were BCGSC-IlluminaHiSeq_miRNAseq and UNC_IlluminaHiSeq_RNAseq. There were 417 samples including 367 HCC samples and 50 non-tumor samples.

**Screening of differential miRNAs from miRNAseq.**

The expression level of miRNAs in miRNAseq was presented using reads of exon model per million mapped reads (RPM), and analysed by limma algorithms to screen differentially expressed miRNAs of group HCC/non-tumor samples [12]. The threshold of differentially expressed miRNAs was set at fold change > 2, adjusted p-value < 0.05.

**Identified the differential miRNAs from miRNAseq using miRNomes.**

The 15 liver samples were divided into two groups, HCC/ANT and HCC/non-tumor. The expression level of miRNAs in miRNomes was presented using reads count and analysed by DEGseq package in R software to screen differentially expressed miRNAs [13]. The threshold of differentially expressed miRNAs was set at fold change > 2, p-value and q-value < 0.05. Then, through comparing the differential miRNAs screened from miRNAseq and miRNomes, the miRNAs changed consistently were selected.

**Screening of differential mRNAs from RNAseq.**

The expression level of mRNAs in RNAseq was presented using fragments per kilobase of exon model per kilobase of exon model per million mapped fragments (FPKM). The FPKM was normalized to transcripts per kilobase of exon model per million mapped reads (TPM) and analysed by limma algorithms for screening differentially expressed mRNAs in group of HCC/non-tumor.
samples. The threshold of differentially expressed mRNAs was set at fold change > 2, adjusted p-value < 0.05.

**Screening of miRNA/mRNA pairs.**

First, the target mRNAs of differentially expressed miRNAs were predicted and analysed comparatively by 10 prediction programs of miRwalk 2.0 database, respectively DIANA-mT, miRanda, miRDB, miRWalk, RNAmhybrid, PICTAR4, PICTAR5, PITA, RNA22 and TargetScan [14]. The mRNAs predicted by 5 prediction programs or more were selected as target mRNAs. In addition, the target mRNAs of novel miRNAs were predicted by TargetScan, miRanda, PITA and RNAhybrid all together. Then, Pearson correlation tests of the differentially expressed miRNAs and mRNAs were calculated respectively. Finally, the miRNA/mRNA pairs with negatively regulated and targeted relationship were obtained.

**Analysis of the function of miRNA/mRNA pairs.**

To find the function of miRNAs-mRNAs pairs, we mapped the mRNAs into the DAVID database and subjected them to functional enrichment analysis [15]. GO terms and KEGG pathways with p-value < 0.05 were chosen to be analyzed [16]. String online database was used to evaluate the PPI relationships and find hub gene of the differentially expressed mRNAs [17]. According to clinic data of liver cancer downloaded from TCGA database, the miRNAs and mRNAs with negatively regulated and targeted relationship were selected for survival analysis by Kaplan-Meier method. The genes with log rank value < 0.05 had significant influence on prognosis of HCC.

**Identification of novel miRNA.**

The sequence tags length in 49 nt from deep sequencing will go through the data cleaning analysis to get credible clean tags. Then the length distribution of the clean tags and common and specific sequences between samples will be summarized. Then the standard analysis will annotate the clean tags into different categories and take those which cannot be annotated to any category to predict the novel miRNA and seed edit of potential known miRNA. The miRdeep 2.0.0.5 software was used to discover miRNAs [18]. The miRdeep score and true positive rate were selected to evaluate miRNAs’ quality.

**Results**

**miRNomes of 15 liver tissues.**

The flowcharts for screening miRNA/mRNA pairs were shown in Figure 1A. A total of 42,220,814 reads were generated by deep sequencing on average. After low-quality reads, poly A, adapters and contaminated sequences were eliminated, 40,150,896 (95.10 %) clean reads length in 18-30 nt remained for further analysis (Figure 1B). The peak of small RNA length distribution was 22 nt, followed by 23 nt (Figure 1C). As shown in Figure 1D, 52 % unique reads were remained unannotated, 18 %, 11 %, 9 % and 1 % unique reads were annotated to intron and exon, rRNA, tRNA and miRNA respectively. On the other hand, there were 53 %, 26 %, 16 % and 2 % total reads classified to miRNA, unannotated sequence, tRNA and rRNA respectively (Figure 1D). The read counts of known miRNAs and novel miRNAs in miRNomes of 15 liver tissues were shown in Supplementary Table S1 and Supplementary Table S2.

**Differentially expressed miRNAs of miRNomes and miRNAseq.**

There were 1883 miRNAs included in 417 samples of TCGA miRNAseq microarray. Having screened differentially expressed miRNAs by limma algorithms, 157 differentially expressed miRNAs with fold change > 2 and adjusted p-value < 0.05 were selected for further analysis. The 100 top differentially expressed miRNAs were shown in Supplementary Figure S1. In miRNomes of the 15 liver samples, a total of 1887 miRNAs had been detected. 555 miRNAs expressed differentially in group HCC/ANTs, and 734 miRNAs expressed differentially in group HCC/non-tumor with fold change > 2 and adjusted p-value < 0.05. After the miRNAs which didn’t change consistently in deep sequencing of miRNomes and miRNAseq, 38 differentially expressed miRNAs were chosen from miRNAseq for further analysis, among which 22 miRNAs were up-regulated while 16 miRNAs were down-regulated in HCC samples (Figure 2).

**Differentially expressed mRNAs from RNAseq.**

According to the human liver cancer RNAseq level 3 data downloaded from TCGA database, there were 60484 mRNAs available for screening differentially expressed mRNAs by limma algorithms. 7843 mRNAs were expressed differentially in group HCC/ANTs, and 734 miRNAs expressed differentially in group HCC/non-tumor with fold change > 2 and adjusted p-value < 0.05. After the miRNAs which didn’t change consistently in deep sequencing of miRNomes and miRNAseq, 38 differentially expressed miRNAs were chosen from miRNAseq for further analysis, among which 50 mRNAs were up-regulated while 50 mRNAs were down-regulated in HCC samples (Supplementary Figure S2).

**The miRNA/mRNA pairs.**

The 38 differentially expressed miRNA and the 100 top differentially expressed mRNAs were
subjected to perform Pearson correlation tests. The 38 miRNAs were subjected to predict target mRNAs in miRwalk 2.0 database. The miRNA/mRNA pairs with negatively regulated and targeted relationship were obtained. As a result, 81 miRNA/mRNA pairs including 38 miRNAs and 36 mRNAs were remained (Figure 2). The regulation network of miRNA/mRNA pairs was shown in Figure 3.

![Diagram](image1.png)

**Figure 1. The characteristics of miRNomes.** (A) Flowcharts for identification of the miRNA/mRNA pairs. (B) The reads quality of 15 liver samples’ cDNA libraries. (C) The frequency percent of small RNA length distribution. (D) The frequency percent of unique and total reads annotation.

![Heatmap](image2.png)

**Figure 2. Heat map of the differential miRNAs and mRNAs that were identified to be miRNA/mRNA pairs.** The names of miRNA and mRNA were shown on the right longitudinal axis; The information of samples was shown on the upper abscissa axis.
Function analysis of the differentially expressed genes.

The 36 differentially expressed mRNAs of miRNA/mRNA pairs were mapped into the DAVID database and subjected to functional enrichment analysis, 23 genes were enriched in 31 GO Ontology (GO) term including 24 Biological Process process, 7 Molecular Function process (Supplementary Figure S3). The top 20 of GO term were shown in Supplementary Figure S4. 17 genes were included in Kyoto Encyclopedia of Genes and Genomes (KEGG) pathway, among which 5 genes participated in cancer pathways, while 5 genes were associated with 6 signaling pathway. CYP1A2 and CYP3A4 were mainly related to metabolism and chemical carcinogenesis pathways (Supplementary Figure S5). A protein-protein interaction (PPI) interaction model was constructed using the 100 top differentially expressed mRNAs. In this model, a hub interaction model with 9 miRNA/mRNA pairs was found (Figure 4).

Survival analysis of the miRNAs and mRNAs.

367 HCC samples were shared by 3 kinds of data (miRNAseq, RNAseq and clinic data of liver cancer) downloaded from TCGA database. The 38 miRNAs and 36 mRNAs of miRNA/mRNA pairs were chosen for survival analysis by Kaplan-Meier method. As a result, 9 genes (miR-137, miR-490, BIRC5, TOP2A, CDC25C, IGF2BP1, IQGAP3, NCAPG and VIPR1) had significant influence on prognosis (Figure 5). 7 genes (miR-137, CDC25C, IGF2BP1, IQGAP3, TOP2A, BIRC5 and NCAPG) were up-regulated in HCC, and high expression of them was correlated with shorter survival periods of HCC patients. 2 genes (miR-490 and VIPR1) were down-regulated in HCC and low expression of them was correlated with shorter survival periods of HCC patients.
Identification of 7 novel miRNAs.

In total of 526 unique reads accounted for 25204 reads were annotated to novel miRNAs. After the low reads sequences (< 100 reads) were eliminated, 33 unique reads were remained to blast in miRbase. 5 novel miRNAs were down regulated and 2 novel miRNAs were up regulated in HCC (p-value and q-value < 0.05). All of the 7 novel miRNAs didn’t match with any miRNA in miRbase, as shown in Table 1.

Discussion

According to statistic of reads, the quality of small RNA deep sequencing in 15 liver samples was qualified to analyse expression of small RNAs in each sample. The peak of small RNAs length distribution was 22 nt, followed by 23 nt. This feature is consistent with small RNA deep sequencing in animals such as Chinese rare minnow and zebrafish [19-20]. The first largest category of total reads is miRNA and the second largest classification was unannotated. There were more than half of unique reads remained unknown. It suggests that miRNAs are the major member of small RNAs and there is still much space to discover novel small RNAs. A regulatory network made of 81 miRNA/mRNA pairs including 38 miRNAs and 36 mRNAs was found in this study. A number of such miRNA/mRNA pairs showed they may play key roles in regulation of tumor formation and development. For example, the let-7 family was demonstrated it can inhibit tumor cell migration, growth and self-renewal by suppressing expression of IGF2BP1 [21]. In our study, 555 differentia expressed miRNAs were found in 15 liver samples from the patients in Zhongnan Hospital of Wuhan University, while only 157 differentia expressed miRNAs in TCGA miRNAseq containing 417 liver samples. This result are largely due to sampling error. To decrease the sampling error, we selected the intersection of

<table>
<thead>
<tr>
<th>Name</th>
<th>miRdeep Score</th>
<th>Total reads count</th>
<th>Mature miRNA sequence</th>
<th>Precursor position</th>
<th>log2(HCC/Normal)</th>
<th>log2(HCC/Adjacent tumor)</th>
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<tr>
<td>chr2:10125</td>
<td>1.4</td>
<td>468</td>
<td>UAGGAGGGCUGAGAGGGC</td>
<td>chr3:16587967-165879714+</td>
<td>-2.8</td>
<td>-4.75</td>
</tr>
<tr>
<td>chr7:20757</td>
<td>2.7</td>
<td>354</td>
<td>UAGGAGGGCUGAGAGGGC</td>
<td>chr7:66884155-66884216-</td>
<td>-3.43</td>
<td>-4.31</td>
</tr>
<tr>
<td>chr8:95005</td>
<td>1.7</td>
<td>210</td>
<td>GUGUGUGUGUGUGUAA</td>
<td>chr8:10003296-10003356-</td>
<td>-8.24</td>
<td>-10.12</td>
</tr>
<tr>
<td>chr10:1351</td>
<td>1.10E+01</td>
<td>156</td>
<td>UAGGAGGAAGGGAUAGUAGUCAU</td>
<td>chr10:107803675-107803737-</td>
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<td>-3.44</td>
</tr>
<tr>
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<tr>
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<td>138</td>
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<td>4.59</td>
<td>6.52</td>
</tr>
</tbody>
</table>

Table 1. Information of the 7 novel miRNAs. The log2Ratio of novel miRNAs was calculated by DEGseq in R software (p-value and q-value < 0.05).
them. So, the final 38 differential miRNAs selected have higher reliability.

In order to find the hub genes in the 81 miRNA-mRNA pairs, the top 500, 200 and 100 differentially expressed genes were subjected to perform PPI network analysis on string online database respectively. It was found that 6 genes (CDKN2A, TERT, TOP2A, BIRC5, CDC25C and NCPAG) related to cell cycle process were always located in the center of PPI network, and had nearly the highest combined scores and degree of nodes. Furthermore, 4 of them (TOP2A, BIRC5, CDC25C and NCPAG) were up regulated in HCC samples and negatively correlated to survival periods of HCC patients. These results indicated that the 6 genes might be the hub regulatory genes in HCC growth. Furthermore, our study suggested that they were negatively regulated and targeted by 6 miRNAs (miR-139, miR-142, miR-144, miR-145, miR-424 and miR-483), making up 9 hub miRNA/mRNA pairs.

The 9 hub miRNA/mRNA pairs were selected to emphatically discuss. The influences of miR-139/TOP2A, miR-142/CDC25C and miR-145/BIRC5 in cancer were verified by some researches. MiR-142 is down-regulated in breast, lung and cervical cancer, and over-expression of miR-142 can lead to cell cycle arrest at G2/M and inhibit cancer cell proliferation by directly regulating CDC25C expression [22]; miR-139 as a tumor suppressor gene affects cell proliferation of cancer by target TOP2A, and high expression of TOP2A is significantly related to shorter survival periods in the luminal type breast cancer patients [23]. BIRC5 is one of the miR-145 target genes. miR-145 can break the cervical epithelial barrier via dysregulation of cell adhesion, apoptosis and proliferation [24]. Although 3 miRNA/mRNA pairs as above mentioned have been reported, their molecular mechanisms are still less known in HCC. Also the influences of miR-142/miR-144/TOP2A, miR-424/BIRC5 and miR-142/NCPAG in HCC remained unknown. In our study, miR-142, miR-144 and miR-424 were all down regulated in HCC patients, and it had been identified by a number of researches [25-27]. Function of TOP2A and BIRC5 in HCC were as mentioned above. Overexpression of NCPAG was associated with poor survival of HCC patients, and knockdown of NCPAG will inhibit cell growth [28]. In conclusion, the 9 hub miRNA/mRNA pairs were all less known in HCC, and the expression trends of these miRNAs and mRNAs were supported by our study and others’. These evidences indicated that the 9 hub miRNA/mRNA pairs may have certain influence on the survival periods of HCC patients together.

According to the statistics of the read positions and frequencies of the reads within the stable hairpin, 526 unique reads were strikingly similar to miRNA and scored by miRdeep. Considered to reliability and research value of novel miRNAs, 33 novel miRNAs with total reads count > 100 were selected. 7 novel miRNAs were changed consistently in group HCC/non-tumor and HCC/ANTs. In terms of the reads, 1887 known miRNA were found in 15 liver samples, but only 767 known miRNAs were counted to meet total reads count > 100. The total reads count of the 7 novel miRNAs were between 130 and 468 respectively. Furthermore, their fold p-values of hairpin were significant, and the length of them also met characteristics of miRNA. These evidences suggest that the 7 novel miRNAs are expressed stably in liver tissues rather than randomly and worthy of being studied.

In a word, this study may provide a number of genes for revealing the miRNA/mRNA regulatory network in development and prognosis of HCC.

Abbreviations

ANT: adjacent tumor; BGI: Beijing Genomics Institute; FPKM: fragments per kilobase of exon model per Million mapped fragments; GO: GO Ontology; HCC: hepatocelluar carcinoma; KEGG: Kyoto Encyclopedia of Genes and Genomes; miRNA: microRNA; nt: nucleotides; PAGE: polyacrylamide gel electrophoresis; PPI: protein-protein interaction; RPM: reads of exon model per million mapped reads; siRNA: small interfering RNA; TCGA: The Cancer Genome Atlas; TPM: transcripts per kilobase of exon model per million mapped reads; 5'-UTR: 5'-untranslational region; 3'-UTR: 3'-untranslational region.

Supplementary Material

Supplementary figures and tables.
http://www.jcancer.org/v10p2552s1.pdf

Acknowledgements

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Competing Interests

The authors have declared that no competing interest exists.

References