

Genome-scale analysis to identify prognostic microRNA biomarkers in patients with early stage pancreatic ductal adenocarcinoma after pancreaticoduodenectomy

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Background: The aim of the study was to investigate potential prognostic microRNA (miRNA) biomarkers for patients with early stage pancreatic ductal adenocarcinoma (PDAC) after pancreaticoduodenectomy using a miRNA-sequencing (miRNA-seq) data set from The Cancer Genome Atlas (TCGA). A miRNA expression-based prognostic signature was generated, and the potential role of target genes in overall survival (OS) in patients with PDAC was examined.

Methods: A miRNA-seq data set of 112 PDAC patients who underwent pancreaticoduodenectomy was obtained from TCGA. Survival analysis was performed to identify potential prognostic biomarkers.

Results: Eleven miRNAs (hsa-mir-501, hsa-mir-4521, hsa-mir-5091, hsa-mir-24-1, hsa-mir-126, hsa-mir-30e, hsa-mir-3157, hsa-let-7a-3, hsa-mir-133a-1, hsa-mir-4709, and hsa-mir-421) were used to construct a prognostic signature using the step function. The 11-miRNA prognostic signature showed good performance for prognosis prediction (adjusted $P < 0.0001$, adjusted hazard ratio = 4.285, 95% confidence interval = 2.146–8.554), and the time-dependent receiver operating characteristic analysis showed an area under the curve of 0.864, 0.877, and 0.787 for 1-, 2-, and 3-year PDAC OS predictions, respectively. Comprehensive survival analysis suggested that the prognostic signature could serve as an independent prognostic factor for PDAC OS and performs better in prognosis prediction than other traditional clinical indicators. Functional assessment of the target genes of the miRNAs indicated that they were significantly enriched in multiple biological processes and pathways, including cell proliferation, cell cycle biological processes, the forkhead box O, mitogen-activated protein kinase, Janus kinase/signal transducers and activators of transcription signaling pathways, pathways in cancer, and the ErbB signaling pathway. Several target genes of these miRNAs were also associated with PDAC OS.

Conclusion: The present study identified a novel miRNA expression signature that showed potential as a prognostic biomarker for PDAC after pancreaticoduodenectomy.

Keywords: microRNA, prognosis, pancreatic ductal adenocarcinoma, TCGA, pancreaticoduodenectomy

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Introduction

Pancreatic cancer (PC) is a highly aggressive malignant tumor of the digestive tract that is difficult to diagnose and treat. In >80% of PC cases, the histological type is pancreatic ductal adenocarcinoma (PDAC).^{1–3} According to Chinese National Cancer Center statistics, the morbidity and mortality of PC increased significantly in recent years, and ~90,100 newly diagnosed PC cases and 79,400 deaths were reported in People's Republic

of China in 2015.⁴ The age-standardized 5-year survival rate of PC in People's Republic of China is 11.7%, whereas the overall 5-year survival rate of PC in the United States is <7%.^{5,6} In addition to the highly malignant characteristics of PC, it is associated with a low rate of early diagnosis and high surgical mortality; the efficacy of existing treatments is limited and the cure rate is very low. Therefore, novel reliable biomarkers and molecular targets are urgently needed to combat this highly malignant and deadly cancer.

Despite improvements in our understanding of the pathogenesis of PC, currently there are no effective strategies for the early diagnosis and clinical treatment of PC. MicroRNAs (miRNAs) are closely related to tumorigenesis, and miRNAs associated with PC are being identified.⁷⁻⁹ Differentially expressed miRNAs are tissue-specific and disease-specific. These characteristics are helpful for designing new diagnostic methods, and identifying treatment targets and strategies for the differential diagnosis and treatment of PC.^{7,9} Clinical and pathological biomarkers of prognosis have not successfully guided clinicians in selecting adjuvant therapies for PDAC patients after surgical resection. Growing evidence suggests that the whole genome miRNA sequencing data sets provide potential tumor-specific prognostic information to assist clinicians in appropriately selecting patients for adjuvant therapy.¹⁰ These potential molecules are often dysregulated and play oncogenic and/or tumor suppressor functions in PDAC. The government of United States has initiated a project The Cancer Genome Atlas (TCGA) to map out the genome variations of human cancers by applying genomic analysis techniques, especially using large-scale genome sequencing. The aim of this project was to systematically analyze all cancer-causing and inhibitory, small variations in oncogenes to understand the mechanism of cancer cell tumorigenesis and development and to help designing cancer prevention strategies.^{11,12} TCGA has yielded single-nucleotide variation data, RNA-seq data, copy number variation data, methylation data, clinical data, miRNA-sequencing (miRNA-seq) data, and biological sample data. These genome-wide data sets are open access and allow researchers to conduct comprehensive cancer studies.

In our previous study, we identified genes related to prognosis in patients with early stage PDAC after pancreaticoduodenectomy based on RNA-seq data from TCGA and proposed a risk score model for PDAC prognosis prediction.¹³ In addition, we also used TCGA RNA-seq data set to investigate the potential prognostic value of the alcohol dehydrogenase genes in PC.¹⁴ The aim of the present study was to identify potential prognostic miRNA biomarkers for

patients with early stage PDAC after pancreaticoduodenectomy using the miRNA-seq data set from TCGA. An miRNA expression-based prognostic signature was generated, and the potential role of the miRNA target genes in the overall survival (OS) in patients with PDAC was investigated.

Materials and methods

Data source and pre-processing

TCGA PDAC level 3 miRNA expression data set was downloaded from TCGA data portal (<https://portal.gdc.cancer.gov/>, accessed January 30, 2018).¹⁵ The corresponding clinical information was obtained from the University of California Santa Cruz Xena browser (UCSC Xena: <http://xena.ucsc.edu/>, accessed April 20, 2017). The raw miRNA data set of PDAC was normalized using the *DESeq* package in the R platform, and miRNAs with a mean value of >0 were included in the subsequent analysis.¹⁶ The inclusion criteria for patients were listed in our previous study which are as follows: 1) complete survival data available; 2) the histology type was PDAC; 3) American Joint Committee on Cancer (AJCC 7th) pathological stage I or II; and 4) patients who underwent pancreaticoduodenectomy.¹³ PDAC patients with pathological stage III or IV disease and who underwent other types of surgery were excluded.¹³ Additional approval by an ethics committee was not necessary because the data set used in the current study was downloaded from TCGA, and data acquisition and application were performed according to TCGA publication guidelines and data access policies.

Identification of prognosis-related miRNAs

The prognostic value of miRNAs was first assessed using the univariate Cox proportional hazards regression model, and the evaluation was performed using a survival package. A *P*-value of <0.05 in the survival analysis was considered statistically significant, and prognosis-related miRNAs regarding PDAC OS were identified.

Construction of the prognostic model and receiver operating characteristic (ROC) curve

Prognosis-related miRNAs that were included in the prognostic signature combination screening were assessed by a "step" function to select the optimal combination. Then, the combination leading to the most significant *P*-value was used for the construction of the prognostic model. The relative

contribution of these prognostic miRNAs to PDAC survival prediction was assessed by fitting the selected miRNAs to a multivariate Cox regression analysis with OS as the dependent variable. The miRNA expression-based prognostic risk score model was constructed by the linear combination of the expression levels of miRNAs with the multivariate Cox regression coefficient (β) as the weight. The risk score formula was as follows: risk score = expression of miRNA₁ $\times \beta_1$ miRNA₁ + expression of miRNA₂ $\times \beta_2$ miRNA₂ + ... expression of miRNA_n $\times \beta_n$ miRNA_n.^{13,17,18} High- and low-risk patients were grouped by the median value of the risk score. The predictive accuracy of the miRNA expression-based prognostic signature for PDAC OS was assessed using the survivalROC package in the R platform.^{13,17}

Stratified and joint effect survival analysis

A stratified and joint effect survival analysis was performed to investigate the association between the risk score and clinical characteristics of patients with PDAC with respect to the miRNA expression-based prognostic signature. A nomogram was constructed to assess the individualized prognosis prediction model based on the clinical characteristics and risk score.

Functional assessment

The TargetScan (<http://www.targetscan.org/>, accessed February 28, 2018),^{19,20} miRDB (<http://www.mirdb.org/>, accessed February 28, 2018),^{21,22} and miRTarBase (<http://mirtarbase.mbc.nctu.edu.tw/>, accessed February 28, 2018)^{23,24} algorithms were used to predict the target genes of these prognostic miRNAs. The overlapping target genes in these three databases were identified as miRNA target genes and used for further enrichment analysis. The miRNA target genes interaction networks were constructed using Cytoscape v3.4.0. The functional enrichment of these miRNA target genes was performed using the Database for Annotation, Visualization and Integrated Discovery v6.8 (DAVID v6.8; <https://david.ncifcrf.gov/home.jsp>, accessed February 28, 2018)^{25,26} and visualized using the ggplot2 package.

Statistical analysis

False discovery rate (FDR) in DESeq was adjusted for multiple testing using the Benjamini–Hochberg procedure.^{27–29} Univariate analysis of clinical features and OS was performed using the log-rank test; clinical features with a *P*-value <0.05 were entered into the multivariate Cox proportional hazards regression model for adjustment. A *P*-value <0.05 was considered statistically significant. All statistical analyses were performed using SPSS version 20.0 and R 3.3.0.

Results

Study population

A total of 178 cases in the miRNA-seq data set were downloaded from TCGA, and the corresponding survival profiles were obtained from the UCSC Xena browser. A total of 112 early stage PDAC patients met the inclusion and exclusion criteria and were further analyzed. Most of the early stage PDAC patients were at stage II, whereas eight patients were at stage I. Survival analysis showed no significant difference in OS between stage I and stage II patients in the current study (log-rank, *P*=0.943; hazard ratio [HR] =1.038; 95% CI =0.375–2.872; Table 1); because of the reason that only eight patients with stage I were included in the survival analysis. Univariate analysis identified the following clinical features as significantly associated with PDAC OS: histological grade (log-rank *P*=0.01, HR =1.919, 95% CI =1.156–3.185; Table 1), radical resection (log-rank *P*=0.009, HR =0.514, 95% CI =0.310–0.852; Table 1), radiation therapy (log-rank *P*=0.029, HR =0.527, 95% CI =0.293–0.947; Table 1), and targeted molecular therapy (log-rank *P*<0.0001, HR =0.168, 95% CI =0.095–0.296; Table 1). These features were included in the multivariate Cox proportional hazard regression model.

Prognosis-related miRNA screening

After normalization by the DESeq package in the R platform, 1457 miRNAs met the criterion of mean expression values >0. The normalized data were used for univariate Cox regression survival analysis using the survival package in the R platform. There were 83 miRNAs significantly associated with PDAC OS (Table S1). Further analysis of these prognostic miRNAs showed low expression in PDAC tumor tissues, and prognostic miRNAs with expression values of 0, are present in more than half of the samples or mean expression values of <1 were excluded. Finally, 26 prognostic miRNAs were included in the prognostic signature combination screening using the “step” function.

Prognostic model construction and ROC curve analysis

After investigation of the “step” function for these prognostic miRNAs, the most significant candidate combinations based on the expression of these candidate prognostic miRNAs were selected. The following 11 prognostic miRNAs were used for the construction of the prognostic signature: hsa-mir-501, hsa-mir-4521, hsa-mir-5091, hsa-mir-24-1, hsa-mir-126, hsa-mir-30e, hsa-mir-3157, hsa-let-7a-3, hsa-mir-133a-1,

Table 1 [†]Association between OS and clinicopathologic features of PDAC patients

Variables	Events/total (n=112)	MST (days)	HR (95% CI)	Log-rank P
Age (years)				0.066
≤60	20/38	593	1	
>60	49/74	485	1.636 (0.962–2.780)	
Gender				0.523
Female	36/53	511	1	
Male	33/59	592	0.855 (0.529–1.382)	
Alcohol history [§]				0.349
No	25/43	592	1	
Yes	38/61	511	1.276 (0.765–2.128)	
Pathological stage				0.943
Stage I	4/8	236	1	
Stage II	65/104	518	1.038 (0.375–2.872)	
Pathological T				0.466
T1/T2	7/14	498	1	
T3	62/98	518	1.340 (0.608–2.949)	
Pathological N				0.091
N0	9/21	634	1	
N1	60/91	511	1.818 (0.899–3.678)	
Pathological M				0.319
M0	31/55	593	1	
Mx	38/57	485	1.278 (0.787–2.075)	
Histological grade				0.01
G1/G2	45/80	596	1	
G3/G4	24/32	470	1.919 (1.156–3.185)	
Radical resection [¶]				0.009
R1/RX	29/44	381	1	
R0	39/66	603	0.514 (0.310–0.852)	
Radiation therapy [*]				0.029
No	48/70	473	1	
Yes	15/30	691	0.527 (0.293–0.947)	
Targeted molecular therapy [‡]				<0.0001
No	24/29	224	1	
Yes	41/73	634	0.168 (0.095–0.296)	
Risk Score				<0.0001
Low	29/56	695	1	
High	40/56	308	5.777 (3.251–10.264)	

Notes: "Events" means the numbers of patients who had died. [†]The data in this table have also been shown in our previous publication. Adapted with permission from Liao X, Huang K, Huang R, et al. Genome-scale analysis to identify prognostic markers in patients with early-stage pancreatic ductal adenocarcinoma after pancreaticoduodenectomy. *Onco Targets Ther.* 2017;10:4493–4506.¹³ [§]Alcohol history information is unavailable in eight patients. [¶]Radical resection information is unavailable in two patients. ^{*}Radiation therapy information is unavailable in 12 patients. [‡]Targeted molecular therapy information is unavailable in 10 patients.

Abbreviations: OS, overall survival; PDAC, pancreatic ductal adenocarcinoma; MST, median survival time; HR, hazard ratio; 95% CI, 95% confidence interval.

hsa-mir-4709, and hsa-mir-421. The results of the Kaplan–Meier analysis of these prognostic-related miRNAs are shown in Figure 1A–K. The relative contribution of these prognostic miRNAs was assessed by multivariate Cox regression, with the multivariate Cox regression coefficient (β) as the weight. The risk score formula was as follows: risk score = hsa-mir-501 \times (−0.554) + hsa-mir-4521 \times (0.594) + hsa-mir-5091 \times (0.440) + hsa-mir-24-1 \times (0.511) + hsa-mir-126 \times (0.670) + hsa-mir-30e \times (−0.562) + hsa-mir-3157 \times (−0.575) + hsa-let-7a-3 \times (0.439) + hsa-mir-133a-1 \times (−0.477) + hsa-mir-4709 \times (−0.532) + hsa-mir-421 \times (0.590). Patients were divided into low- and high-risk groups according to the median risk

scores, and the survival analysis indicated that patients with high risk scores were significantly associated with a poor clinical outcome (median survival time, high risk vs low risk: 308 vs 695 days) and increased risk of death (adjusted $P < 0.0001$; adjusted HR = 4.285; 95% CI = 2.146–8.554; Figure 2A and B). Time-dependent ROC curve analysis was used to evaluate the predictive accuracy of this prognostic signature, and the results suggested that the prognostic signature constructed in the current study performed well in 1-, 2-, and 3-year survival predictions. The area under the curve for 1-, 2-, and 3-year survival was 0.864, 0.877, and 0.787 (Figure 2C), respectively. The distribution of the

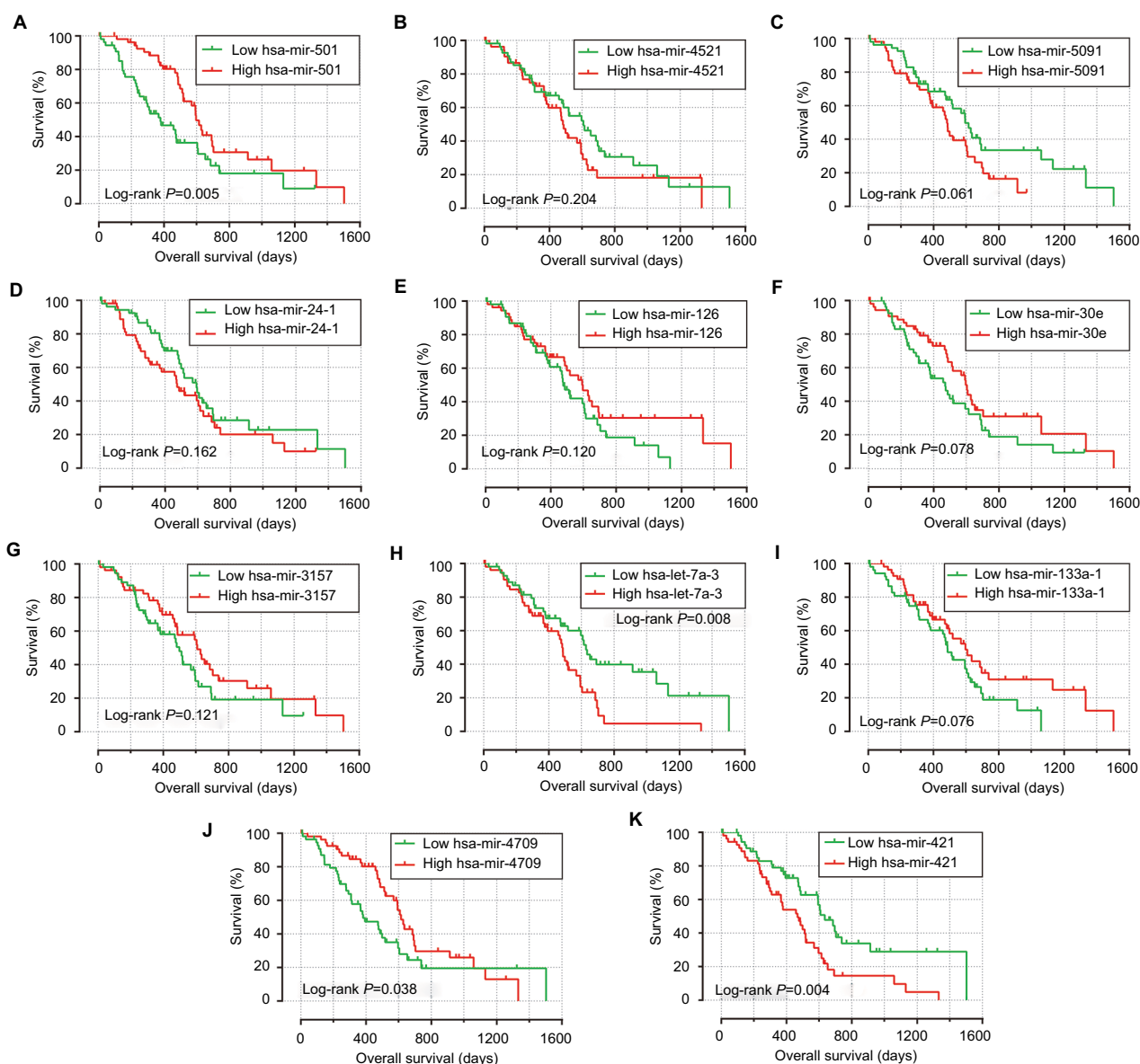


Figure 1 The Kaplan–Meier curves of 11 prognostic miRNAs in PDAC.

Notes: The order of Kaplan–Meier curves of 11 prognostic miRNAs were as follows: hsa-mir-501 (A), hsa-mir-4521 (B), hsa-mir-5091 (C), hsa-mir-24-1 (D), hsa-mir-126 (E), hsa-mir-30e (F), hsa-mir-3157 (G), hsa-let-7a-3 (H), hsa-mir-133a-1 (I), hsa-mir-4709 (J), and hsa-mir-421 (K).

Abbreviations: miRNA, microRNA; PDAC, pancreatic ductal adenocarcinoma.

expression of the miRNAs in the high- and low-risk groups is shown in Figure 3.

Stratified and joint effect analysis

Further investigation of the relation between the prognostic signature and the clinical characteristics associated with PDAC OS was performed by a comprehensive analysis of the nomogram and stratified and joint effect survival analysis. The stratified analysis indicated that patients with a high risk score showed a significantly increased risk of death in all favorable strata except in patients at stage I and in those

younger than 60 years, and in all adverse strata except grade G3/G4 and patients who did not receive targeted molecular therapy (Figure 4A). A nomogram was visualized by rms and its auxiliary packages based on the clinical characteristics of PDAC and risk scores, and it demonstrated that the 11-miRNA prognostic signature contributed the most risk points, whereas the other clinical characteristics contributed much less (Figure 4B).

Joint effect survival analysis between the 11-miRNA prognostic signature and clinical parameters suggested that this prognostic signature performed well in PDAC

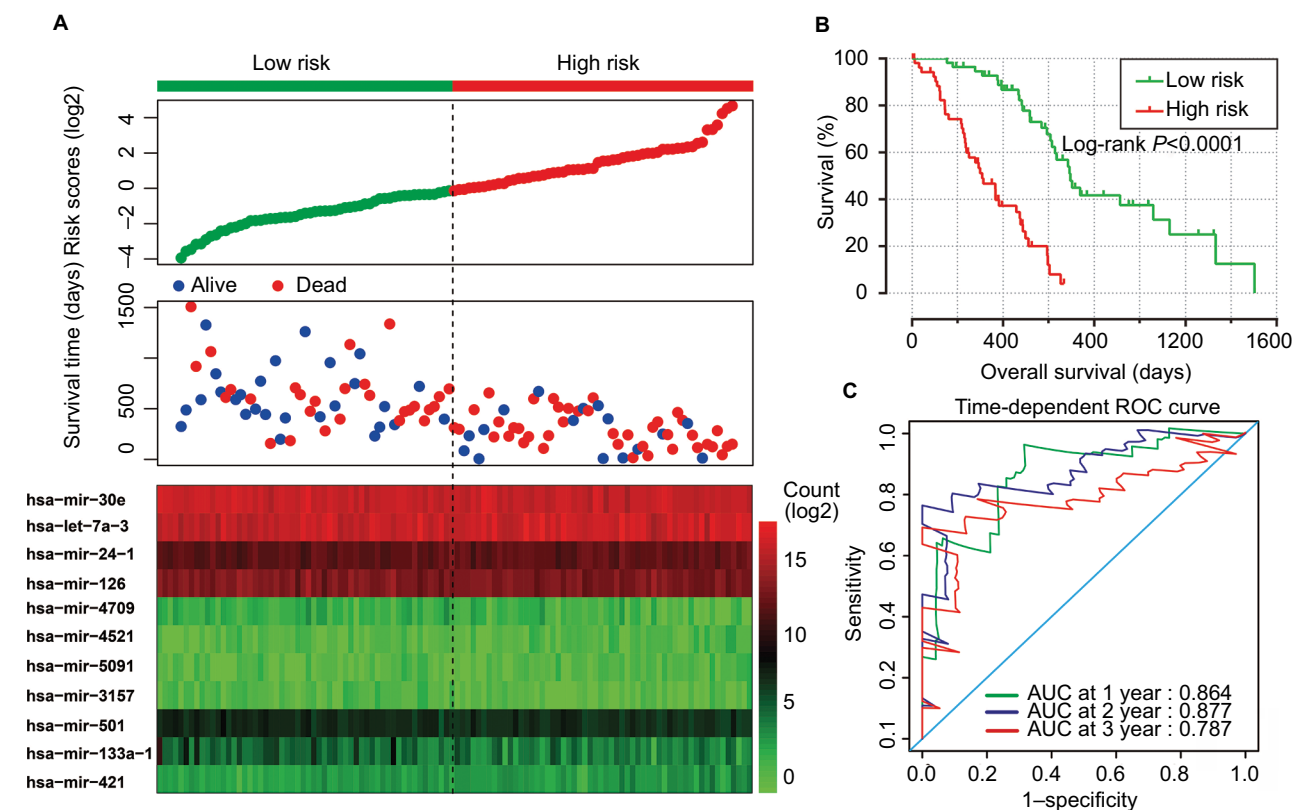


Figure 2 Prognostic risk score model analysis of 11 prognostic miRNAs in PDAC patients.

Notes: (A) From top to bottom are the risk score, patients' survival status distribution, and 11 prognostic miRNA expression heat maps for low- and high-risk groups. (B) Kaplan-Meier curves for low- and high-risk groups. (C) ROC curve for predicting survival in PDAC patients by the risk score.

Abbreviations: miRNA, microRNA; PDAC, pancreatic ductal adenocarcinoma; ROC, receiver operating characteristic; AUC, area under curve.

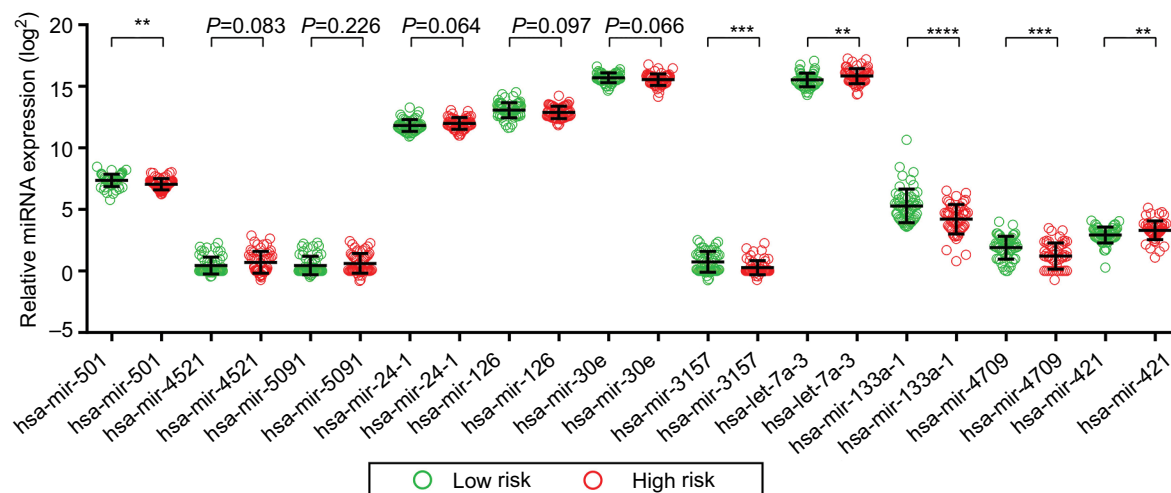


Figure 3 Expression level of 11 prognostic miRNAs in low- and high-risk groups.

Notes: Scatter plot of 11 prognostic miRNA expression level between low- and high-risk groups. $**P < 0.01$, $***P < 0.001$, $****P < 0.0001$.

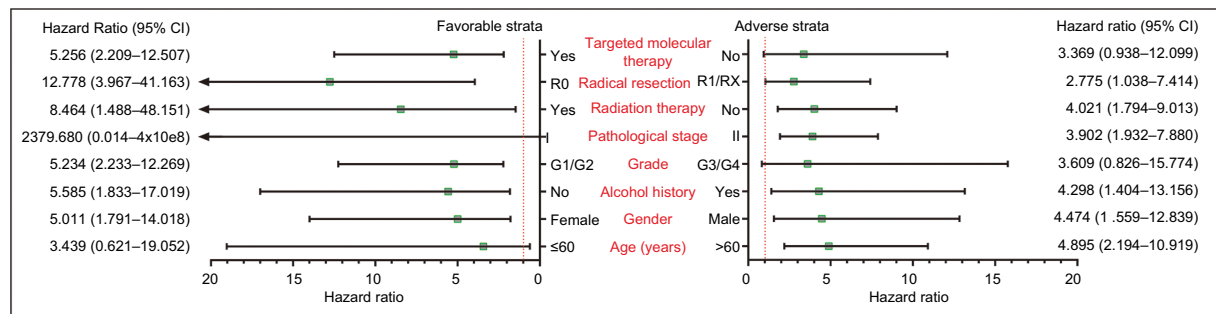
Abbreviations: miRNA, microRNA; PDAC, pancreatic ductal adenocarcinoma.

OS predictions, and combination with clinical parameters significantly associated with PDAC OS showed more significant predictive values for PDAC OS (Figure 5A–D; Table 2).

Functional assessment

The target genes of these 11 miRNAs were analyzed using three independent miRNA target gene prediction websites: TargetScan, miRDB, and miRTarBase. Target genes

A



B

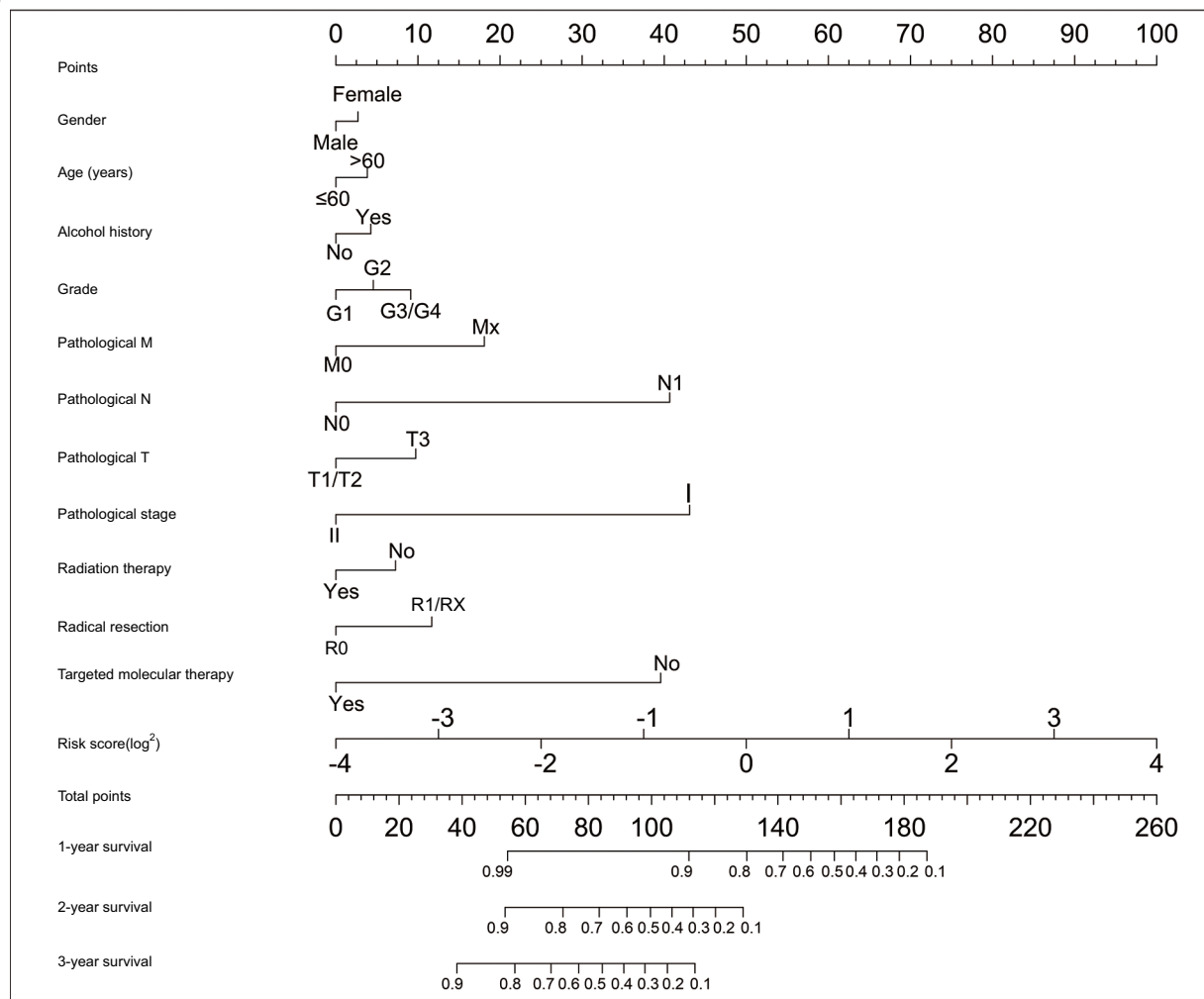


Figure 4 The relationship between risk score and clinical information.

Notes: (A) Stratified analysis of association between risk score and OS in PDAC. (B) Nomogram for predicting the 1-, 2-, and 3-year event (death) with risk score and clinical information.

Abbreviations: PDAC, pancreatic ductal adenocarcinoma; OS, overall survival.

overlapping in the three websites were identified as miRNA target genes. Among the 11 miRNAs, hsa-mir-4709, hsa-mir-501, hsa-mir-30e, hsa-mir-126, and hsa-mir-3157 had overlapping target genes in the three websites (Figure 6). Enrichment analysis of these target genes was performed

using DAVID v6.8. Gene Ontology term enrichment results, which suggested that these target genes were significantly enriched in cell division, positive regulation of autophagy, G1/S transition of mitotic cell cycle, cell proliferation, and cell–cell adhesion mediated by integrin biological processes

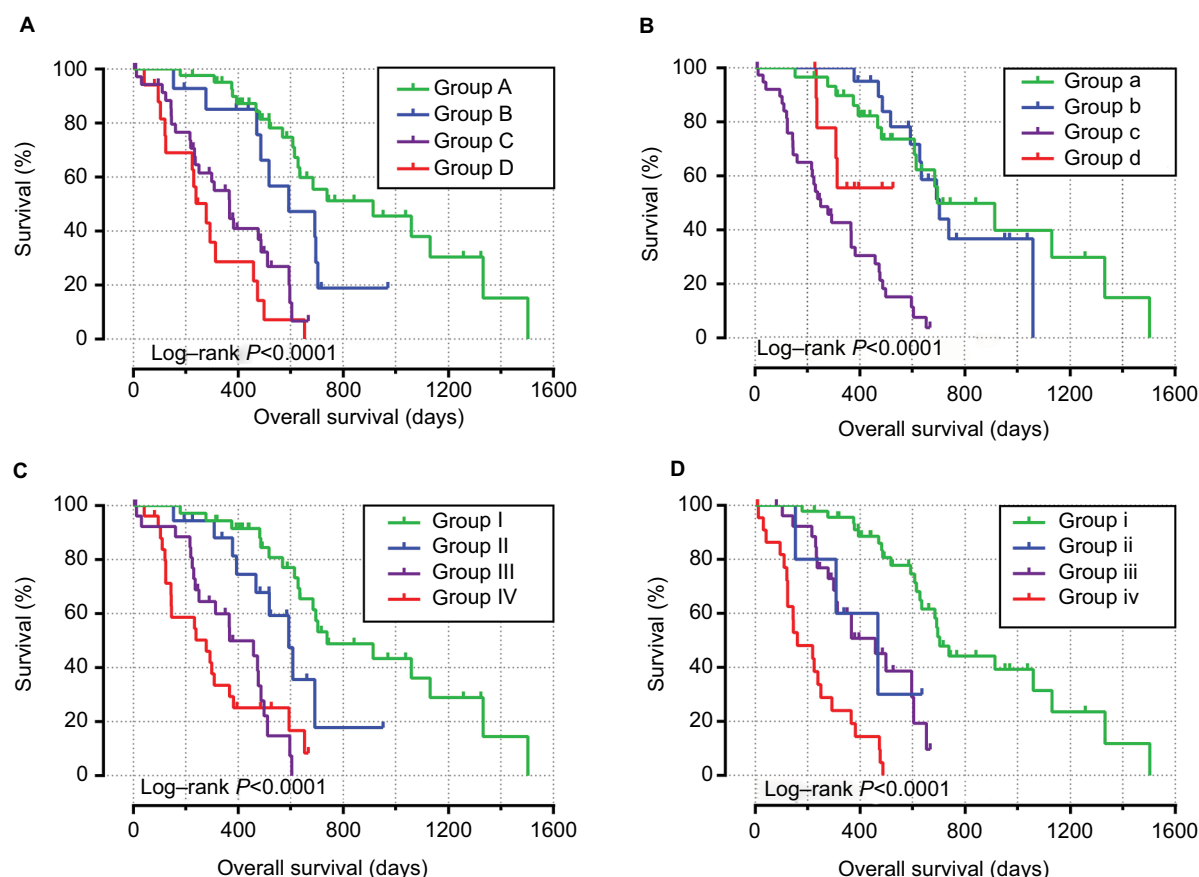


Figure 5 Joint effect analysis of OS stratified by risk score and PDAC clinical parameters.

Notes: Joint effect analysis stratified by risk score and following clinical parameters: histological grade (A), radiation therapy (B), radical resection (C), and targeted molecular therapy (D).

Abbreviations: PDAC, pancreatic ductal adenocarcinoma; OS, overall survival.

(Figure 7A). Kyoto Encyclopedia of Genes and Genomes (KEGG) enrichment analysis indicated that these target genes were significantly correlated with the forkhead box O (FOXO), mitogen-activated protein kinase (MAPK), Janus kinase/signal transducers and activators of transcription (JAK/STAT), pathways in cancer, ErbB, cell cycle, and PC (hsa05212, [Figure S1](#)) signaling pathways (Figure 7B). To further investigate the role of these target genes in PDAC OS, we performed a survival analysis of these target genes using the survival package. The mRNA expression data set of PDAC patients, which was the same as that in the present study, was generated from our previous studies of TCGA PDAC mRNA data analysis, and the data set was also normalized using the DESeq package in the R platform.¹³ Among the 223 target genes, 28 were significantly correlated with PDAC OS in univariate analysis (Table S2), and the Kaplan–Meier curves of the top five significant target genes ranked by the *P*-values are shown in Figure 8A–E.

Discussion

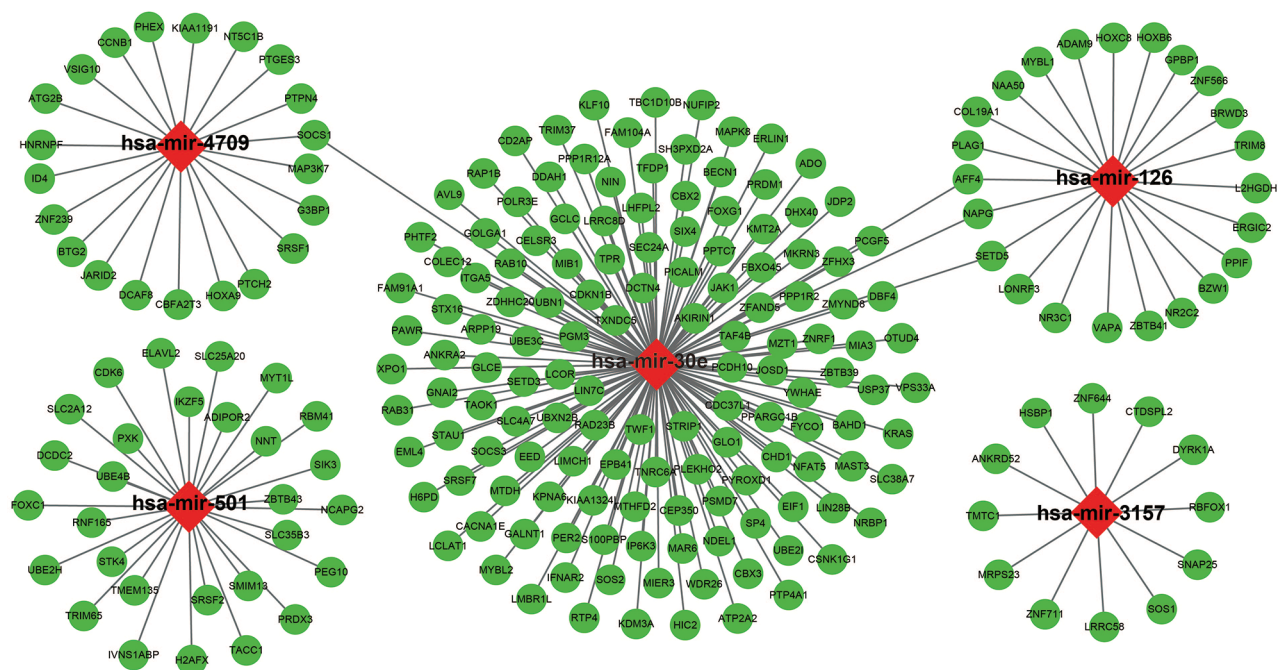
Genome-wide data filtering is one of the most promising tools for the identification of biomarkers and therapeutic targets. The notion that miRNAs are closely related to the prognosis of cancers is increasingly recognized. Many cancer miRNA-seq data sets with complete clinical information has been shared on TCGA for researchers to download and investigate. The miRNAs of TCGA PC miRNA-seq data set were analyzed in previous studies. Zhou et al investigated a 13-miRNA expression-based prognostic signature for PC survival prediction including 167 PC patients from TCGA.³⁰ Liang et al identified 10 miRNAs as potential prognostic biomarkers using 175 pancreatic adenocarcinoma patients from TCGA.³¹ However, the PC patients in TCGA included several histological types of PC other than PDAC, such as poorly differentiated pancreatic adenocarcinoma and pancreas-colloid (mucinous non-cystic) carcinoma. In addition, the surgical procedures of these patients included distal pancreatectomy,

Table 2 Joint effect survival analysis of clinical factors and the risk score with OS in PDAC patients

Group	Risk score	Variables	Events/total (n=112)	MST (days)	Crude HR (95% CI)	Crude P	Adjusted HR (95% CI)	Adjusted P ^c
Histological grade								
A	Low risk	G1+G2	20/42	913	1		1	
B	Low risk	G3+G4	9/14	592	2.068 (0.907–4.714)	0.084	2.431 (0.961–6.151)	0.061
C	High risk	G1+G2	25/38	366	6.105 (3.047–12.230)	<0.0001	5.012 (2.286–10.987)	<0.0001
D	High risk	G3+G4	15/18	278	10.088 (4.689–21.703)	<0.0001	7.276 (3.071–17.236)	<0.0001
Radiation therapy ^a								
a	Low risk	No	15/30	695	1		1	
b	Low risk	Yes	11/20	702	1.164 (0.511–2.653)	0.717	1.190 (0.491–2.885)	0.701
c	High risk	No	33/40	250	7.696 (3.680–16.092)	<0.0001	4.661 (2.084–10.424)	0.0002
d	High risk	Yes	4/10	NA	3.127 (0.947–10.327)	0.061	4.536 (1.279–16.093)	0.019
Radical resection ^b								
I	Low risk	R0	19/36	738	1		1	
II	Low risk	R1/RX	9/18	592	2.302 (0.978–5.417)	0.056	2.271 (0.885–5.828)	0.088
III	High risk	R0	20/30	366	7.464 (3.416–16.310)	<0.0001	5.651 (2.291–13.937)	<0.0001
IV	High risk	R1/RX	20/26	278	8.453 (3.973–17.984)	<0.0001	7.654 (3.188–18.374)	<0.0001
Targeted molecular therapy [‡]								
i	Low risk	Yes	24/46	702	1		1	
ii	Low risk	No	3/5	467	3.819 (1.087–13.420)	0.037	4.781 (1.209–18.910)	0.026
iii	High risk	Yes	17/27	458	4.489 (2.160–9.328)	<0.0001	4.431 (1.951–10.062)	<0.0001
iv	High risk	No	21/24	160	17.254 (8.015–37.145)	<0.0001	20.942 (8.089–54.217)	<0.0001

Notes: “Events” means the numbers of patients who had died. ^aAdjusted for histologic grade, radiation therapy, radical resection, and targeted molecular therapy. ^bRadiation therapy information is unavailable in 12 patients. ^cRadical resection information is unavailable in two patients. [‡]Targeted molecular therapy information is unavailable in 10 patients.

Abbreviations: OS, overall survival; PDAC, pancreatic ductal adenocarcinoma; MST, median survival time; HR, hazard ratio; 95% CI, 95% confidence interval; NA, not available.

**Figure 6** Interaction networks of the prognostic miRNAs and their target genes.

Notes: Red diamonds represent miRNAs, green circles represent target genes, and the link in black indicates a miRNA target genes relationship.

Abbreviation: miRNA, microRNA.

total pancreatectomy, and pancreaticoduodenectomy. The histological types and surgical procedures were important prognostic factors that may affect the survival outcome

of PC patients.^{32–34} However, the studies by Zhou et al and Liang et al did not include these prognostic factors in the multivariate Cox proportional hazards model or stratified

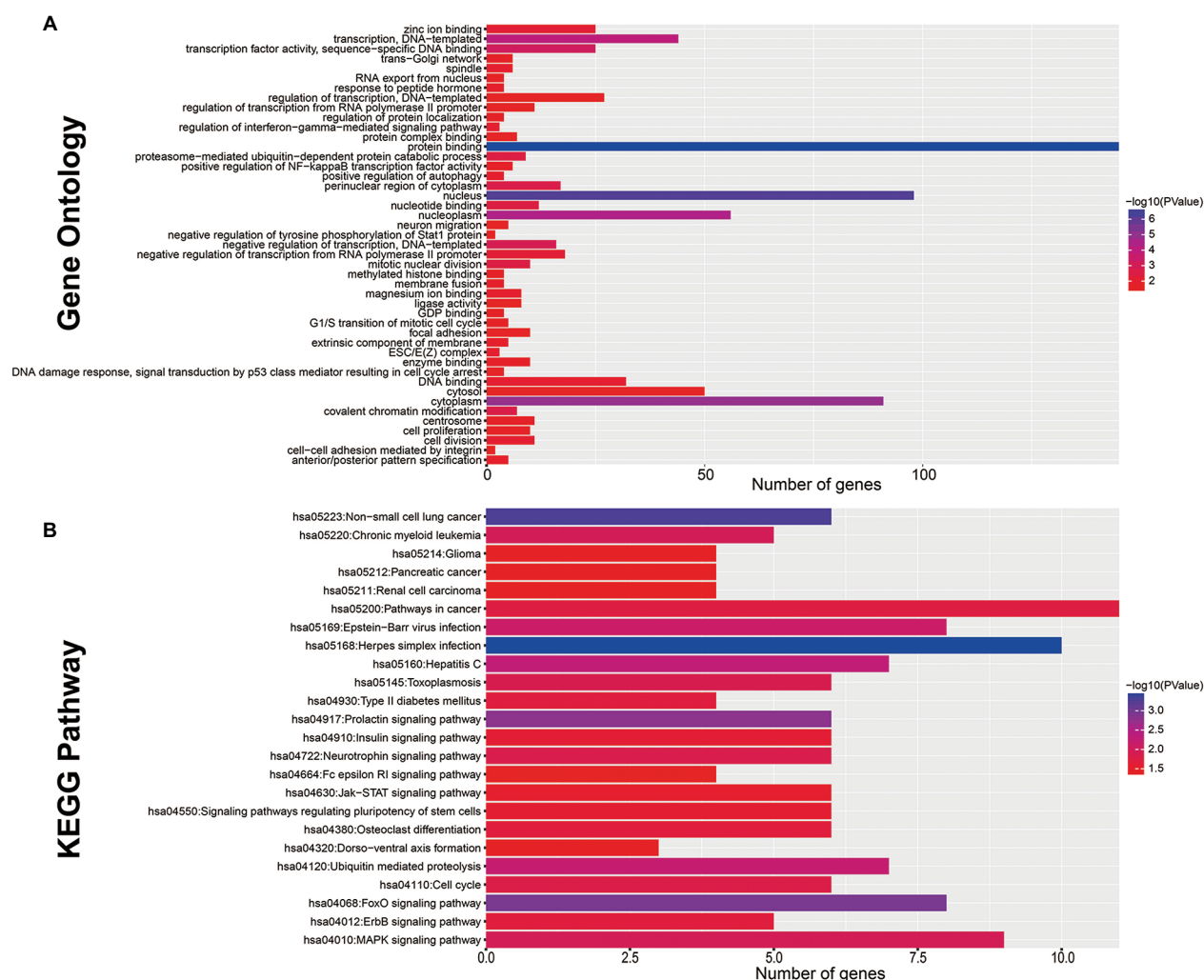


Figure 7 Functional assessment of the target genes of these 11 prognostic related miRNAs.

Notes: (A) GO term enrichment results of target genes; (B) KEGG enrichment results of target genes.

Abbreviations: GO, Gene Ontology; KEGG, Kyoto Encyclopedia of Genes and Genomes.

analysis.^{30,31} Therefore, the prognostic miRNAs identified in their studies may be unreliable. In the present study, we included only patients at early stage of PDAC who underwent pancreaticoduodenectomy and excluded patients at advanced pathological stages.

In the current study, we identified 83 potential prognostic miRNAs, and 11 miRNAs were used for the construction of the prognostic signature. The 11-miRNA expression-based prognostic signature constructed in the present study classified the patients into high- and low-risk groups, and it performed well in 1-, 2-, and 3-year survival predictions. The nomogram and stratified and joint effect survival analysis also indicated that this prognostic signature performed better in PDAC OS prediction than other clinical parameters.

Among these 11 prognostic miRNAs, five (hsa-mir-4521, hsa-mir-5091, hsa-mir-3157, hsa-mir-133a-1 and

hsa-mir-4709) had not been previously investigated for their functional roles in cancer, whereas the remaining six miRNAs (hsa-mir-501, hsa-mir-24-1, hsa-mir-126, hsa-mir-30e, hsa-let-7a-3 and hsa-mir-421) had been previously reported to be associated to cancer. Ling et al reported that miR-501-3p was highly expressed in PDAC tumor tissues, and low expression of miR-501-3p was significantly associated with a low risk of tumor recurrence based on a cohort of 64 PDAC patients.³⁵ Similar results were reported in hepatocellular carcinoma (HCC) and gastric cancer (GC), indicating that miR-501-5p was markedly upregulated in HCC and GC tumor tissues, and high expression of miR-501-5p had significantly increased the risk of death in patients with GC.^{36,37} However, comparing with the previous studies, the result of hsa-mir-501 in the current study obtained an opposite prognosis results, because both the current study and study by Ling et al³⁵ in PDAC prognosis

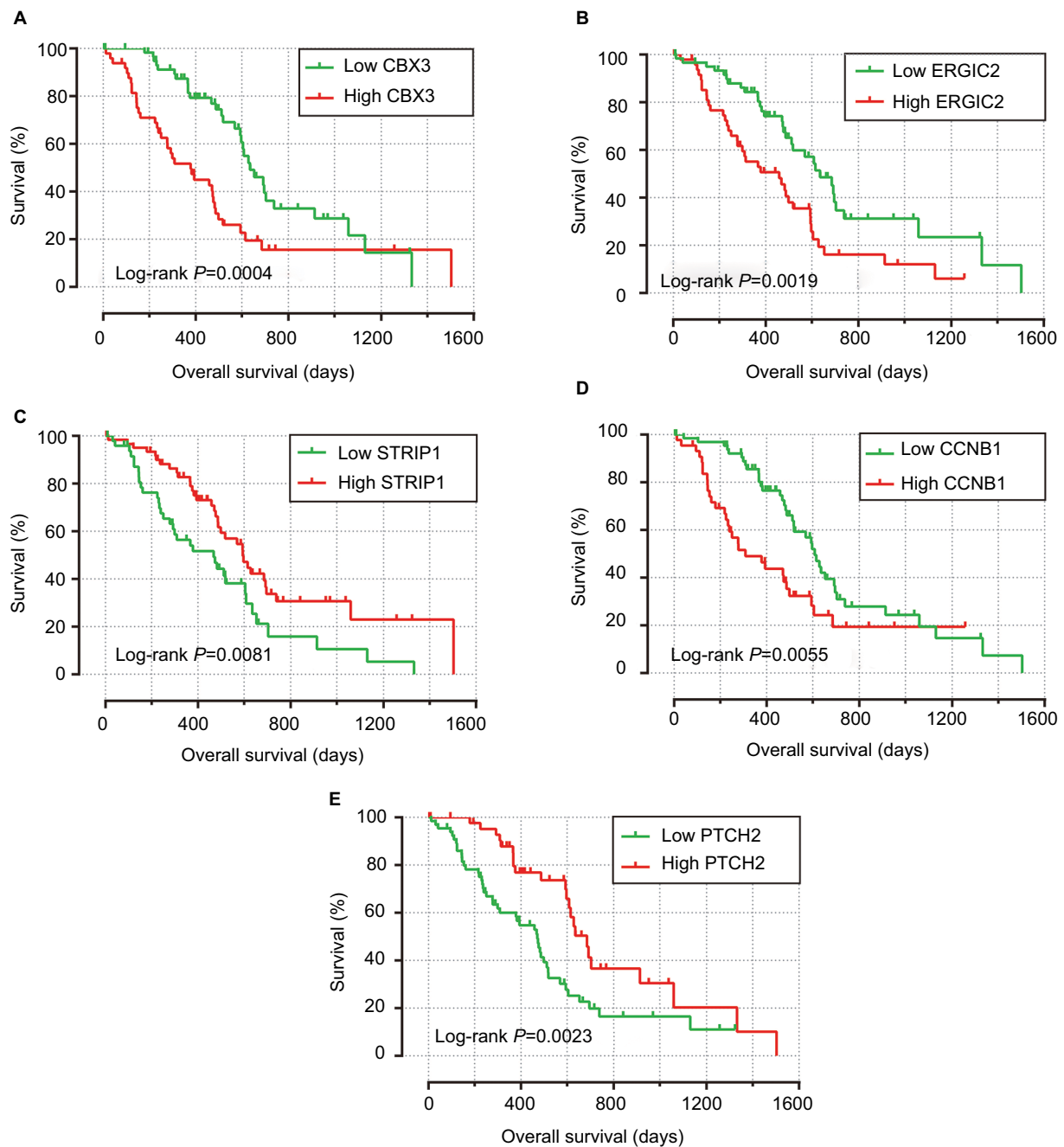


Figure 8 Survival analysis of the top five significant target genes.

Notes: The order of Kaplan-Meier curves of the top five significant target genes were as follows: CBX3 (A), ERGIC2 (B), STRIP1 (C), CCNB1 (D), and PTCH2 (E).

Abbreviations: CBX3, chromobox 3; ERGIC2, ERGIC and golgi 2; STRIP1, striatin interacting protein 1; CCNB1, cyclin B1; PTCH2, patched 2.

were with a small sample size; therefore, further verification cohort is needed to verify our results. Another miRNA, hsa-mir-24-1, was shown to be downregulated in cutaneous malignant melanoma tumor tissues.³⁸ Regarding the third miRNA, hsa-mir-126, a study by Feng et al observed that the combined overexpression of miR-126 and miR-34a exerts a more effective antitumor effect than a single miRNA and may be a promising system for PC targeted therapy.³⁹ MiR-

126 is downregulated in thyroid cancer cells and esophageal cancer tissues and suggested to play a tumor suppressor role in renal cell carcinoma and thyroid cancer by targeting specific genes.⁴⁰⁻⁴² Debernardi et al reported that miR-30e is significantly upregulated in urine samples in stage I PDAC patients compared with healthy subjects and performed well in discriminating these patients, as determined by ROC analysis.⁴³ However, miR-30e is downregulated in the sera of HCC and

non-small cell lung cancer (NSCLC) patients compared with healthy volunteers.^{44,45} In terms of clinical outcome prediction and low serum levels of miR-30e-3p were significantly associated with poor disease-free survival (DFS), whereas high serum levels of miR-30e-5p were markedly correlated to a shorter OS in NSCLC.^{45,46} In other cancers, the potential prognostic role of miR-30e is complex. High expression of miR-30e showed a protective effect regarding the clinical outcomes of patients with ovarian carcinoma and breast cancer, which were consistent with our results in PDAC, whereas it served as a risk factor for esophageal cancer OS and DFS.⁴⁷⁻⁴⁹ Dysregulation of hsa-let-7a-3 is associated with the prognosis of cancers and regulated by DNA methylation.⁵⁰⁻⁵² Hypermethylation of let-7a-3 in acute myeloid leukemia (AML) patients with hypomethylated CCAAT enhancer-binding protein alpha (CEBPA) is significantly correlated with better OS, and overexpression of let-7a-3 is associated with poor OS in AML, which are consistent with our results in PDAC.^{50,53} Lu et al showed that methylation of let-7a-3 is inversely correlated with insulin-like growth factor-II (IGFII) expression, and let-7a-3 hypermethylation significantly reduces the risk of death in ovarian cancer.⁵² However, a similar study by Lu et al in breast cancer demonstrated that epigenetic regulation of let-7a-3 may affect the activity of IGFs, whereas it is not associated with DFS or OS in patients with breast cancer.⁵¹ MiR-421 is markedly upregulated in GC,⁵⁴⁻⁵⁶ HCC,^{57,58} PC,⁵⁹ biliary tract cancer,⁶⁰ osteosarcoma,⁶¹ and nasopharyngeal carcinoma tumor tissues,⁶² and high expression of miR421 is significantly associated with poor clinical outcomes in patients with GC,^{55,63} HCC,⁵⁸ and osteosarcoma.⁶¹ MiR421 acts as an oncomiRNA in GC,⁵⁵ HCC,⁵⁷ PC,⁵⁹ and nasopharyngeal carcinoma,⁶² and overexpression of miR421 in these cancer cells promotes cell proliferation. However, miR421 may play a tumor-suppressor role in prostate cancer cells, as overexpression of miR-421 significantly suppressed prostate cancer cell growth, and knockdown of miR-421 improved proliferation.⁶⁴ Despite the opposite roles of miR-421 in previous studies, the current study indicated that high expression of hsa-mir-421 significantly increased the risk of death in PDAC, which was consistent with previous PC studies and several cancer studies.

In function enrichment analysis, these prognostic miRNA target genes were significantly enriched in the cell cycle, cell proliferation biological processes, and several signaling pathways such as FOXO, MAPK, JAK-STAT, and ErbB signaling pathways. Cell cycle and cell proliferation involve in maintaining the basic state of cells, and dysregulation of cell cycle components may lead to tumor formation.⁶⁵ These prognostic miRNAs may play a role in maintaining

the stability of cellular states through the regulation of target genes. Roy et al demonstrated that inhibition of the PI3K/AKT and MAPK/ERK pathways in PC induces the activation of FOXO transcription factor, leading to cell cycle arrest and apoptosis.⁶⁶ The MAPK pathway is not only involved in the formation and development of PC but also mediates the sensitivity of PC cells to chemotherapy drugs.^{67,68} A similar function of ErbB signaling was reported in previous studies, and targeting the regulation of the ErbB pathway by sex-determining region Y-related high mobility group box 9 was involved in pancreatic tumorigenesis; dual targeting of ErbB-2 and ErbB-3 increases the therapeutic efficacy of trastuzumab.^{69,70} Similar anti-tumor drugs in PC target the JAK-STAT pathway and may have a potential application in chemotherapy and immunotherapy.^{71,72} Therefore, we can hypothesize that these prognostic miRNAs are involved in biological processes and signaling pathways by regulating their target genes and affecting PC tumorigenesis and treatment. Regarding the top five significant target genes, the present study is the first to identify a significant association between these mRNA expression levels and PDAC OS. The prognostic values for these miRNAs and most of their putative target genes seem to be in good agreement. Among the 28 target genes, which were significantly correlated with PDAC OS, only one target gene of hsa-mir-3157 and two target genes of hsa-mir-126 were significantly associated with PDAC OS, and the prognostic values between these miRNAs and target genes showed an opposite trend and in good agreement. In addition, three in six prognostic target genes of hsa-mir-4709, three in six prognostic target genes of hsa-mir-501, and five in 13 prognostic target genes of hsa-mir-30e also show the opposite trend in PDAC prognosis, which were in a good agreement with the miRNA-target gene regulation relationship. In one way, these results also support the validity of the prediction of presented miRNA-target genes interaction.

The present study had several limitations. First, the clinical information from TCGA database was not comprehensive, and we were unable to perform an accurate evaluation of the risk score model using the multivariate Cox proportional hazards model or stratified analysis. Second, because of the strict inclusion and exclusion criteria, the sample size in our study was relatively small, and a larger sample size with well-designed validation cohorts is needed to validate our results. Third, because of the relatively small sample size, patients with long-term survival of more than 3 years were rare; therefore, we were unable to assess the 5-year survival prediction accuracy or other long-term survival.

Despite these limitations, the present study identified an 11-miRNA expression-based prognostic signature for PDAC OS prediction, and it performed better than other clinical parameters. We also investigated the functions and potential prognostic roles of the target genes of these miRNAs in PDAC. These findings may provide insight into the roles of miRNAs in PDAC prognosis and have potential clinical application value in PDAC prognosis prediction, targeted therapy, and decision-making regarding treatment strategy and management.

Conclusion

Through an integrative analysis of the genome-wide miRNA-seq and clinical data of PDAC generated by TCGA, we found a miRNA expression-based signature including 11 miRNAs, which may serve as a potential biomarker for PDAC prognosis prediction. However, these results need further verification and investigation.

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Disclosure

The authors report no conflicts of interest in this work.

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