A Prognostic Autophagy-Related Long Non-coding RNA (ARlncRNA) Signature in Acute Myeloid Leukemia (AML)

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Background: Some studies have proven that autophagy and lncRNA play important roles in AML. Several autophagy related lncRNA signatures have been shown to affect the survival of patients in some other cancers. However, the role of autophagy related lncRNA in AML has not been explored yet. Hence, this study aims to find an autophagy related lncRNA signature that can affect survival for AML patients.

Method: A Pearson correlation analysis, a Kaplan–Meier survival curve, a univariate cox regression, and a multivariate cox regression were performed to establish an autophagy related lncRNA signature. A univariate cox regression, a multivariate cox regression, a Kaplan–Meier survival curve, and a ROC curve were applied to confirm if the signature is an independent prognosis for AML patients. The relationship between the signature and the clinical features was explored by using a T test. Gene Set Enrichment Analysis (GSEA) was used to investigate the potential tumor related pathways.

Results: A four-autophagy related lncRNA (MIR133A1HG, AL359715.1, MIRLET7BHG, and AL356752.1) signature was established. The high risk score based on signature was related to the short survival time of AML patients. The signature was an independent factor for the prognosis for AML patients (HR = 1.684, 95% CI = 1.324–2.142, P < 0.001). The signature was correlated with age, leukocyte numbers, and FAB (M3 or non-M3). The P53, IL6/JAK/STAT3, TNF-α, INF-γ, and IL2/STAT5 pathways might contribute to the differences between the risk groups based on signature in AML.

Conclusion: The four autophagy related lncRNAs and their signature might be novel biomarkers for predicting the survival of AML patients. Some biological pathways might be the potential mechanisms of the signature for the survival of AML patients.

Keywords: lncRNAs, autophagy, cancer genome atlas, Kyoto encyclopedia of genes and genomes, prognosis, signature, acute myeloid leukemia

Abbreviations: SD, Standard deviation; FDR, false discovery rate; GSEA, gene set enrichment analysis; AML, acute myeloid leukemia; HR, hazard ratio; KEGG, Kyoto encyclopedia of genes and genomes; NES, normalized enrichment score; OS, overall survival; TCGA, the cancer genome atlas; lncRNA, long non-coding RNA.
INTRODUCTION

Acute myeloid leukemia (AML) accounts for 65.7% of all acute leukemia (AL) cases and has a higher incidence in male patients (Dores et al., 2012). The incidence rate of AML is 4.3 per 100,000 cases annually and a survival rate of 5 years is achieved by 24% of the patients in the United States (US) (Shallis et al., 2019). This high incidence is related to increasing age and the median age at diagnosis is 68 years (Shallis et al., 2019). Many gene mutations including signaling and kinase pathways (FLT3, KRAS, NRAS, KIT, PTPN11, and NFI), epigenetic modifiers (DNA methylation and chromatin modification), neleophosmin (NPM1), transcription factors (CEBPB, RUNX1, and GATA2), tumor suppressors (TP53), spliceosome complex (SRSF2, U2AF1, SF3B1, and ZRSR2), and cohesin complex (RAD21, STAG1, STAG2, SMC1A, and SMC3) play important roles in pathogenesis, prognosis, and therapy (DiNardo and Cortes, 2016). However, to date, no more than 3% of the lncRNAs have been proven to regulate the growth of AML cells. Thus, further studies are needed to find the lncRNAs that might regulate the growth of AML cells.

MATERIALS AND METHODS

TCGA Data of AML Patients

The TCGA gene expression data (workflow type: HTSeq – FPKM) of the AML patients and the related TCGA clinical data were acquired from UCSC Xena1. We selected the cohort named GDC TCGA Acute Myeloid Leukemia (LAML), which contained 151 samples from 151 patients as research subjects. The name of the autophagy gene was taken from the human autophagy database (HADb)2.

TABLE 1 | Results of 21 lncRNAs from Kaplan–Meier survival curve and Univariate Cox regression in AML patients.

| Autophagy gene related lncRNA | Kaplan–Meier survival curve | Univariate Cox regression |
|------------------------------|-----------------------------|---------------------------|
|                              | P value | HR | P value | Adjusted P value |
| AC004492.1                   | 0.000   | 0.544 | 0.001 | 0.016 |
| LINC00099                    | 0.002   | 1.406 | 0.000 | 0.000 |
| AC005070.3                   | 0.007   | 0.646 | 0.001 | 0.016 |
| AC0025563.2                  | 0.005   | 0.510 | 0.003 | 0.027 |
| AC007000.3                   | 0.005   | 0.605 | 0.007 | 0.030 |
| HOXA10-AS                    | 0.009   | 1.329 | 0.001 | 0.016 |
| AC127498.5                   | 0.006   | 0.634 | 0.009 | 0.030 |
| MIR133A1HG                   | 0.001   | 0.392 | 0.000 | 0.000 |
| AL121672.3                   | 0.001   | 1.464 | 0.009 | 0.030 |
| ITGB2-AS1                    | 0.000   | 1.318 | 0.001 | 0.016 |
| AL591848.4                   | 0.005   | 0.654 | 0.000 | 0.000 |
| NADK2-AS1                    | 0.000   | 0.520 | 0.000 | 0.000 |
| AL356752.1                   | 0.003   | 0.619 | 0.005 | 0.030 |
| MIRLET7BHG                   | 0.000   | 1.364 | 0.003 | 0.027 |
| AC110792.3                   | 0.000   | 0.509 | 0.001 | 0.016 |
| LINCO2175                    | 0.002   | 0.651 | 0.001 | 0.016 |
| AC078860.1                   | 0.005   | 0.637 | 0.003 | 0.027 |
| AC027018.1                   | 0.001   | 0.574 | 0.001 | 0.016 |
| AC022726.1                   | 0.010   | 0.691 | 0.005 | 0.030 |
| AL359715.1                   | 0.000   | 0.465 | 0.000 | 0.000 |
| LINCO1503                    | 0.003   | 1.462 | 0.007 | 0.030 |

1https://xenabrowser.net/datapages/
2http://autophagy.lu/clustering/index.html

TABLE 2 | Information for four lncRNAs from multivariate Cox regression.

| LncRNA           | coef  | HR  | HR.95L | HR.95H | P value | Adjusted P value |
|------------------|-------|-----|--------|--------|---------|-----------------|
| MIR133A1HG       | -0.556| 0.573| 0.356  | 0.922  | 0.022   | 0.088           |
| AL359715.1       | -0.440| 0.644| 0.395  | 1.050  | 0.077   | 0.088           |
| MIRLET7BHG       | 0.264 | 1.302| 1.030  | 1.644  | 0.027   | 0.088           |
| AL356752.1       | -0.381| 0.683| 0.472  | 0.990  | 0.044   | 0.088           |
Autophagy Related lncRNA

Autophagy related lncRNAs were identified by using a Pearson correlation analysis between lncRNAs and autophagy-related genes. The results were considered significant when they meet the criterion (the correlation coefficients |R| > 0.6 and p-values < 0.05).

Construction of the Autophagy Related lncRNA Signature

A Kaplan–Meier survival curve and a univariate cox regression were performed with a statistical significance p value of less than 0.01. According to the criterion mentioned above, most autophagy-related lncRNAs were excluded and the 21 remaining autophagy-related lncRNAs were related to the survival of AML patients.

The best autophagy related lncRNA prognostic signature was selected according to the lowest Akaike information criterion (AIC) value. The risk scores of the signature were calculated by using the following formula: (coefficient 1 × expression 1) + (coefficient 2 × expression 2) + ... + (coefficient n × expression n). Herein, expression represents the expression of lncRNA. Coefficient represents the value of the correlation coefficients in the multivariate cox regression analysis for the lncRNAs. Then, an autophagy-related lncRNA signature was finally established. The cutoff value of the high risk group and the low risk group was the median value of the risk score. A Cox regression, a Kaplan–Meier survival curve, and a ROC curve for the signature were performed to confirm that the signature is an independent factor for the prediction of the survival time of AML patients.

Gene Set Enrichment Analysis

Gene Set Enrichment Analysis (GSEA) is a computational method that determines whether a priori defined set of genes shows statistically significant, concordant differences between two biological states (e.g., phenotypes). Patients were divided into a high and a low risk group based on the risk score in the signature and the cutoff is the median value. Then GSEA was performed to explore the pathways according to their differentially expressed genes in the different groups. And the pathways were selected based on the condition [p < 0.05 and false discovery rate (FDR) < 0.25].

RESULTS

A Four-Autophagy Gene Related lncRNAs Signature in AML Patients

The data of the lncRNA and autophagy gene expression of AML patients was extracted from the TCGA database. A total of 151 samples from 151 patients was included in the current study. Firstly, the Pearson correlation method was applied and 866 lncRNAs that were related to the autophagy gene were...
found based on $|R| > 0.6$ and $p$-value < 0.05. Then Kaplan–Meier survival curves and univariate Cox regression analysis were performed at the same time to assess gene expression and clinical survival data. 21 lncRNAs were found to be statistically significant as shown in Table 1. A Multivariate cox regression analysis was performed afterward to select the best lncRNA signature. According to the lowest Akaike information criterion (AIC) value, a four-autophagy gene related lncRNA signature was chosen (see Table 2). In Figure 1A, Cytoscape 3.8.2 software was used to visualize the co-expression of the four
TABLE 3 | The relationship between the signature and clinical features.

| Clinical feature       | Group         | n  | Mean  | SD   | t     | P value | Adjusted P value |
|------------------------|---------------|----|-------|------|-------|---------|------------------|
| Age                    | ≥60           | 54 | 1.489 | 1.152| 2.054 | 0.043*  | 0.258            |
|                        | <60           | 73 | 1.113 | 0.809|       |         |                  |
| Gender                 | Female        | 57 | 1.25  | 1.05 | −0.226| 0.821   | 1.000            |
|                        | Male          | 70 | 1.291 | 0.933|       |         |                  |
| Blast cell             | High          | 65 | 1.312 | 0.902| 0.453 | 0.652   | 1.000            |
|                        | Low           | 62 | 1.232 | 1.068|       |         |                  |
| Bone marrow blast cell | High          | 64 | 1.351 | 1.094| 0.907 | 0.366   | 1.000            |
|                        | Low           | 63 | 1.193 | 0.858|       |         |                  |
| Hemoglobin             | High          | 102| 1.229 | 0.882| −0.794| 0.434   | 1.000            |
|                        | Low           | 25 | 1.451 | 1.326|       |         |                  |
| Leukocyte              | High          | 64 | 1.47  | 1.16 | 2.326 | 0.022*  | 0.154            |
|                        | Low           | 63 | 1.072 | 0.718|       |         |                  |
| FAB                    | M3            | 13 | 0.457 | 0.341| −6.863| 0.000***| 0.000            |
|                        | non-M3        | 114| 1.386 | 0.99 |       |         |                  |
| Cytogenetics risk      | Favorable + Normal | 100| 1.266 | 1.015| −0.164| 0.870   | 1.000            |
|                        | Poor          | 27 | 1.298 | 0.874|       |         |                  |

*p < 0.05, ***p < 0.001.

TABLE 4 | The results of Gene set enrichment analysis.

| Pathway                                      | NES | P value | FDR |
|----------------------------------------------|-----|---------|-----|
| HALLMARK_REACTIVE_OXYGEN_SPECIES_PATHWAY     | 2.27| 0.000   | 0.012|
| HALLMARK_ADIPogenesis                       | 1.99| 0.006   | 0.064|
| HALLMARK_UV_RESPONSE_UP                     | 1.93| 0.004   | 0.066|
| HALLMARK_OXIDATIVE_PHOSPHORYLATION          | 1.91| 0.041   | 0.054|
| HALLMARK_PS3_PATHWAY                        | 1.90| 0.002   | 0.047|
| HALLMARK_FATTY_ACID_METABOLISM              | 1.86| 0.008   | 0.053|
| HALLMARK_IL6_JAK_STAT3_SIGNALING            | 1.86| 0.014   | 0.048|
| HALLMARK_TNFA_SIGNALING_VIA_NFkB            | 1.85| 0.006   | 0.043|
| HALLMARK_INTERFERON_GAMMA_RESPONSE          | 1.84| 0.027   | 0.043|
| HALLMARK_DNA_REPAIR                         | 1.83| 0.032   | 0.039|
| HALLMARK_COMPLEMENT                         | 1.83| 0.012   | 0.036|
| HALLMARK_CHOLESTEROL_HOMEOSTASIS            | 1.80| 0.008   | 0.039|
| HALLMARK_PEROXISOME                        | 1.76| 0.010   | 0.049|
| HALLMARK_COAGULATION                       | 1.75| 0.012   | 0.046|
| HALLMARK_APOPTOSIS                         | 1.70| 0.017   | 0.066|
| HALLMARK_ALLOGRAFT_REJECTION                | 1.70| 0.041   | 0.057|
| HALLMARK_INFLAMMATORY_RESPONSE              | 1.67| 0.031   | 0.057|
| HALLMARK_IL2_STATS_SIGNALING               | 1.65| 0.031   | 0.064|
| HALLMARK_XENOBIOTIC_METABOLISM             | 1.62| 0.025   | 0.072|
| HALLMARK_MYOGENESIS                        | 1.56| 0.026   | 0.090|

IncRNAs and autophagy-related genes of AML patients. The Sankey diagram in Figure 1B shows the correlation between the autophagy gene and the IncRNAs and the relationship between the IncRNAs and the risk types. The Impact of the IncRNAs on the patient's survival was analyzed with the Kaplan–Meier method (see Figure 1C). Figures 1B,C show that MIR133A1HG, AL359715.1, and AL356752.1 are favorable factors associated with a longer survival time for high expression patients than for low expression patients. On the other hand, the left IncRNA (MIR177BH) is associated with a poorer probability of survival for high expression patients compared to the probability for low expression patients, indicating that it is a poor risk factor. According to these results, the four IncRNAs were used to form a signature which might be a risk factor predicting the survival of AML patients from the TCGA database.

The Prognosis Function of the Autophagy-Related IncRNA Signature for the AML Patients' Survival

Several methods were performed to assess the survival predicting ability of the four autophagy related gene IncRNAs signature. Firstly, the patients were divided into a low and a high risk group based on their risk scores of the signature, which were calculated by using the formula mentioned in the methods part. The cut off is the median value of the risk score. As shown in Figure 2A, high risk score patients show a higher death rate and a shorter survival time than the low risk score patients. The heat map indicates the different expression of the four IncRNAs in AML patients, decreasing IncRNAs (MIR133A1HG, AL359715.1, and AL356752.1) and increasing IncRNA (MIR177BH) gene expression in the high risk group. Furthermore, a Kaplan–Meier survival curve was used to investigate the signature in relation to the OS time. The high risk group had a shorter OS time than the low risk group (see Figure 2B). Then, in Figure 2C, univariable and multivariable cox regressions were applied. In univariable cox regression analysis, p values less than 0.05 were found in some clinical features, including age, cytogenetic risk, and risk score. Therefore, age, cytogenetic risk, and risk score are prognosis factors. Meanwhile, the same results were predicted in the multivariable cox regression. Thus, age, cytogenetic risk, and risk score are independent prognosis factors. In addition, the ROC curve shows that AUC values were 0.767, 0.706, and 0.824 for 1 year, 3 years, and 5 years, respectively (Figure 2D). Herein, this signature was a reliable independent prognosis factor for AML patients. In conclusion, the signature might predict the survival time of AML patients.
Correlation Between the Signature and the Clinical Features

To explore the relationship between the signature and the clinical features, a $T$ test was applied to compare the risk score of signature in each group. We divided each clinical feature (blast cell, bone marrow blast cell, hemoglobin, and leukocyte) into a high and a low group based on their median value. We set patients whose value is less than their cut off values as the low group and the remaining patients were assigned to the high group. The FAB was grouped into the M3 group and the non-M3 group. Due to the absence of some clinical information, only 127 patients were included here. As shown in Table 3, age, leukocyte, and FAB group had a significant difference ($p$ value < 0.05). High age and high leukocyte numbers were related to the high risk score of the signature. The M3 group showed a lower risk score than the non-M3 group.

**Potentially Related Pathway Analysis for the Signature**

The enrichment of differentially expressed genes in two groups (high risk and low risk) was assessed using GSEA to investigate the potentially related pathways of the signature. 20 related pathways based on $p$ value < 0.05 and FDR < 0.25 are listed in Table 4. The top 10 pathways are shown in Figure 3.

**DISCUSSION**

Several autophagy related lncRNA signatures predicting the survival of patients have been proven in several cancers, including ovarian cancer, colorectal cancer, hepatocellular carcinoma, bladder urothelial carcinoma, breast cancer, colon adenocarcinoma, and glioma (Luan et al., 2019; Meng et al., 2020; Sun et al., 2020; Wei et al., 2020; Wu et al., 2020; Zhou et al., 2020; Li et al., 2021). However, autophagy related lncRNA prognostic signature has not been investigated in AML. This study aimed to establish an autophagy related lncRNA signature that might affect the survival of AML patients.

At first, a total of 866 lncRNAs were identified as autophagy related lncRNAs. 21 lncRNAs were confirmed to affect the survival time of AML patients. Four of them were the best candidates for the construction of a prognostic signature. Among the four lncRNAs, three of them (MIR133A1HG, AL359715.1, and AL356752.1) have a good prognosis of survival, while the other lncRNA (MIRLET7BHG) shows a poor prognosis of survival. To date, these four lncRNAs have not been investigated in AML. Further studies are needed to confirm the prognostic function for AML patients. The construction of a prognostic signature is based on these four autophagy related lncRNAs. Patients were divided into a low and a high risk group according to the risk score in signature. The results showed that the high risk group had a worse probability of survival than the low risk group. Furthermore, the Cox regression and the ROC curve confirmed that this signature potentially is an independent prognostic factor for AML patients.

The GSEA results shows that 20 pathways might be related to the differences between the risk groups based on signature in AML. Some pathways such as P53, IL6/JAK/STAT3, TNFα, and IL2/STAT5 have been proven to be related to AML or other tumors (Rucker et al., 2012; Binder et al., 2018; Ni et al., 2020;
Wang et al., 2020). Thus, this signature might affect the survival of AML patients by regulating these pathways.

**CONCLUSION**

The signature containing four autophagy related IncRNAs is an independent prognostic factor for AML patient's survival time. These IncRNAs and their signature might be novel biomarkers for prognosis. Some tumor related pathways might be the potential mechanisms of the signature for the survival of AML patients. However, further investigations in AML are necessary to know the performance and the exact mechanism of IncRNAs in the signature in a clinical setting.

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**DATA AVAILABILITY STATEMENT**

Publicly available dataset was analyzed in this study. The data was downloaded from in TCGA database.

**AUTHOR CONTRIBUTIONS**

YW, CZ, and ZW designed the article. YW and CZ collected and evaluated the data and wrote the first draft of the manuscript. ZW, SZ, XY, JL, FT, and JZ reviewed the manuscript. All authors contributed to the interpretation of the results, wrote the final draft of the manuscript, and read and approved the final version of the manuscript.

**CONFLICT OF INTEREST**

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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