Identification of Biomarkers Associated With Alzheimer's Disease by Bioinformatics Analysis

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Abstract

Background: This study aimed to explore the biomarkers of Alzheimer's disease (AD). **Methods:** The microarray data of GSE16759 were from the expression profile samples of 4 parietal lobe tissues from patients with AD and 4 ones from agematched control participants. The differentially expressed micro RNAs (miRNAs) and genes (DEGs) underwent hierarchical clustering and function analysis followed by target genes prediction. Finally, DEGs were mapped to the target genes to construct miRNA-regulated networks. **Results:** A total of 427 DEGs were obtained and clustered into 5 functions. After DEGs were mapped to the predicted target genes, 313 regulatory pairs were established. The target genes SEC22 vesicle trafficking protein homolog B (SEC22B) and SEC63 homolog (SEC63) regulated by miRNA-206, RAB10, member RAS oncogene family (RAB10) regulated by miRNA-655, and fms-related tyrosine kinase I (FLT1) regulated by miRNA-30e-3p and miRNA-369-3p were involved in the biological processes of protein transport and regulation of cell motion. **Conclusion:** The target genes SEC22B, RAB10, and FLT1 may be potential biomarkers of AD.

Keywords

Alzheimer's disease, micro RNA, differentially expressed genes, functional cluster, target genes, regulatory network

Introduction

Alzheimer's disease (AD) is a progressive and ultimately fatal neurodegenerative disease affecting around 35 million people worldwide. Neuropathology results in premature neuronal loss. Due to the nature of the primarily affected neuronal circuits, the clinical symptoms of AD are progressive impairment in memory, judgment, decision making, distorted language, and orientation to physical surroundings. This illness is the leading cause of dementia in older people. At present, there is no definitive diagnostic test or therapy for this disease, and its pathogenesis is still debated and may be heterogeneous. 4,5

For the pathogenetic mechanisms of AD, 1 mechanism centers on the "amyloid cascade" hypothesis that the origins of AD involve an imbalance between production and clearance of β-amyloid (Aβ) initiating pathogenesis. Other hypotheses for AD initiation include pathogen infection and epigenetic modifications caused by environmental insults. Recently, an identified class of nonprotein-coding small RNAs, micro RNAs (miRNAs), may provide new insights into AD research. Micro RNAs are small regulatory RNAs that participate in posttranscriptional gene regulation in a sequence-specific manner. They bind complementary sequences in target messenger RNAs (mRNAs) and can thus lead to their selective degradation or selective inhibition of translation. Meta-analysis of 100 public microarray data sets has suggested that AD progresses with

changes in functional gene groups, miRNA, and epigenetic changes.⁵ Genome-wide association study indicates that AD-specific miRNA expression patterns can be identified in the brain, cerebral spinal fluid, and blood.^{8,9} Hébert et al showed that the decreased levels of miRNA-29a/b in AD caused the increased levels of Aβ cleaving enzyme 1 (BACE1) in vitro. The BACE1 is an essential protein in the generation of Aβ from amyloid precursor protein (APP).¹⁰ The deposition of APP in plaques in brain tissue may lead to AD.⁶ Wang et al found that decreased levels of miRNA-107 in AD also targeted BACE1.¹¹ In addition, studies have confirmed that some miRNAs, such as miRNA-29, miRNA-15, and miRNA-107, are specifically altered in the AD brain.^{12,13} However, the present knowledge about the molecular mechanism of AD seems to be insufficient.

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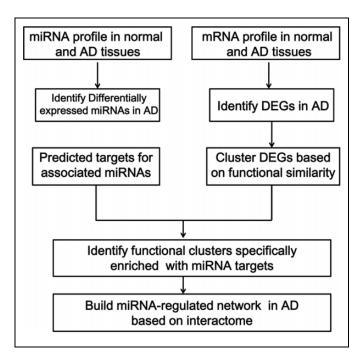


Figure 1. Analysis process of this study.

In the present study, we aimed to extend our understanding of the mechanisms of AD. We downloaded the microarray data of miRNA and mRNA in the parietal lobe cortex of patients with AD and age-matched controls from Gene Expression Omnibus (GEO) database and analyzed the differentially expressed miRNAs and genes (DEGs). Then, we analyzed the functional similarity of DEGs and miRNA target prediction. Besides, we constructed interaction networks to study and identify the potential target genes for diagnosis and treatment of AD. Figure 1 outlines the detailed workflow of the entire procedure.

Materials and Methods

Affymetrix Microarray Data

Alzheimer's disease miRNA and mRNA expression profile data were accessible at National Center for Biotechnology Information GEO (http://www.ncbi.nlm.nih.gov/geo/) database using the series accession number GSE16759.8 The base data are based on the platform of GPL570 [HG-U133_Plus_2] Affymetrix Human Genome and U133 Plus 2.0 Array and of GPL8757 USC/XJZ Human 0.9 K miRNA-940-v1.0. Eight samples including 4 parietal lobe tissues from patients with AD and 4 ones from agematched control participants were available for every platform. The average age of patients with AD was 85 years (range 75-92 years) and 91.8 years (90-96 years) for controls. The raw data and the annotation files were downloaded for further study.

Data Preprocessing and Analysis of Differentially Expressed miRNAs and DEGs

The original Simple Omnibus Format in Text-formatted expression data were first converted into identifiable expression form.

The miRNAs were corresponded to genes to remove the empty probes. Then, the expression levels of the data were log2-transformed. The limma package (Linear Models for Microarray Data) in R language was used to identify differentially expressed miRNAs and DEGs between patients with AD and healthy controls. The multiple testing correction was performed using a Beniamini-Hochberg false discovery rate (HB FDR). Only miRNAs and DEGs with FDR < 0.05 and |log fold change (FC)| > 1 were selected.

Comparison of Differential Expression Values

Hierarchical clustering ^{17,18} is a common analytical tool used to determine the closest associations among specimens under evaluation and gene profiles in multidimensional spaces. According to the corresponding probe information of DEGs and differentially expressed miRNAs, the expression values of genes with significant characteristics of expression differences in each samples were extracted from the expression values file. Two-way hierarchical clustering ¹⁸ based on the Euclidean distance ¹⁹ was performed using the Pretty Heatmaps package ²⁰ in R language. Two separate heatmaps of differentially expressed miRNA and DEGs were generated.

Functional Similarity Analysis of DEGs

Ground-Operation Simulation (GOSim)²¹ package is used to measure the functional similarity of genes based on a variety of information-theoretic similarity concepts for Gene Ontology (GO) terms. In this article, GOSim package in R language was used to cluster DEGs according to their biological process, with respect to the GO annotation. This method was based on calculating the distance between genes and ancestor nodes. Genes with similar function were located on the same nodes, and P value < 0.05 was chosen as the threshold.

Micro RNA Target Prediction

Identification of the predicted target mRNA genes of miRNAs provides the basis for understanding the miRNA functions. miRDB²² is used for miRNA target prediction and functional annotation of animals. MicroRNA.org (http://www.microrna.org)²³ that is exploited by Memorial Sloan-Kettering Cancer Center is a comprehensive resource of miRNA target predictions and expression profiles. In this article, the intersection of target genes in both of the databases mentioned earlier was selected as predictive target genes. Then, the DEGs were mapped to the intersection of target genes to select the genes that were both predicted target genes and DEGs. Finally, the selected genes and their corresponding miRNAs were retained to perform functional clusters analysis.

Regulatory Interaction Analysis and Network Construction

Search Tool for the Retrieval of Interacting Genes (STRING)²⁴ is an online database that has been designed as a comprehensive

Zhao et al

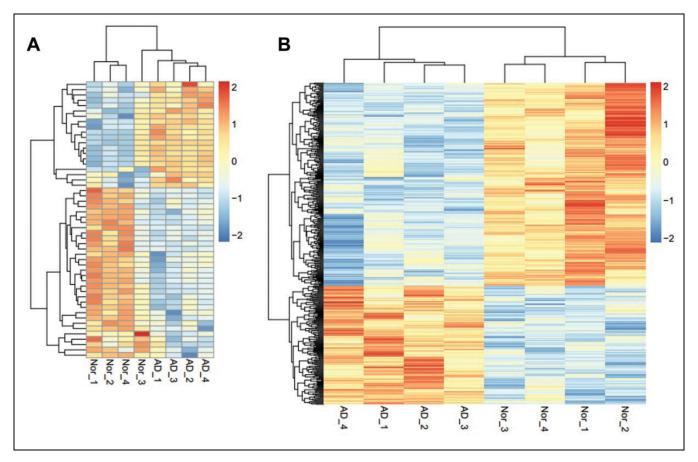


Figure 2. The cluster heat map of differentially expressed microRNAs (miRNAs; A) and differentially expressed genes (DEGs; B). Red stands for high expression value and blue stands for low expression value. The changes of color from blue to red stands for the changes in expression value from low to high.

perspective to evaluate interaction information of proteins. In this article, the STRING online tool was applied to analyze the interaction information of DEGs, and only the experimentally validated interactions with a confidence score > 0.6 were considered to be significant. The miRNA regulatory networks were then constructed using the Cytoscape²⁵ software based on the interactome.

Results

Identification of Differentially Expressed miRNAs and DEGs

A total of 52 differentially expressed miRNAs including 20 upregulated and 32 downregulated miRNAs and 427 DEGs including 158 upregulated and 269 downregulated DEGs were selected. This set of differentially expressed miRNAs and DEGs was used for hierarchical clustering analysis.

Comparison of Differential Expression Values

After hierarchical clustering analysis of differentially expressed miRNAs and DEGs, significant differences were found in both differentially expressed miRNAs and DEGs between the AD and

the control groups (Figure 2). Simultaneously, hierarchical clustering distinguished AD and normal tissues according to the expressing values.

Functional Similarity Analysis of DEGs

According to functional similarity clustering, the 427 DEGs were clustered into 5 functions including protein transport, RNA splicing, intracellular protein transport, regulation of cell motion, and protein complex assembly with a P value of < 0.05 (Table 1).

Micro RNA Target Prediction

A total of 8609 regulatory pairs between the differentially expressed miRNA and their predictive target genes were obtained. After DEGs were mapped to the predicted target genes, 313 regulatory pairs were established between 52 differentially expressed miRNAs and 427 DEGs. The miRNA target genes in 313 regulatory pairs were then clustered into 2 function classifications, C1 and C2 (Table 2) that were related to protein transport and regulation of cell motion, respectively.

Table 1. Functional Classification of Differentially Expressed Genes.^a

Cluster Name	Count	Enrichment P value	Biological Function
CI	112	2.71 × 10 ⁴	GO:0015031 protein transport GO:0045184 establishment of protein localization
C2	33	1.7×10^3	GO:0008104 protein localization GO:0000375 RNA splicing via transesterification reactions
			GO:0000377 RNA splicing via transesterification reactions with bulged adenosine as nucleophile GO:0000398 nuclear mRNA splicing via spliceosome
C3	54	6.19×10^3	GO:0006886 intracellular protein transport GO:0034613 cellular protein localization GO:0070727 cellular macromolecule
C4	32	1.22×10^2	localization GO:0051270 regulation of cell motion GO:00303334 regulation of cell migration
C5	60	3.27×10^2	GO:0040012 regulation of locomotion GO:0070271 protein complex biogenesis GO:0006461 protein complex assembly GO:0065003 macromolecular complex assembly

Abbreviation: mRNA, messenger RNA.

Table 2. Functional Classification of Differentially Expressed Target Genes.^a

Cluster Name		Enrichment <i>P</i> value	Biological Function
CI	55	1.58 × 10 ³	GO:0015031 protein transport GO:0045184 establishment of protein localization GO:0008104 protein localization
C2	19	2.55×10^2	GO:0051270 regulation of cell motion GO:0030334 regulation of cell migration GO:0040012 regulation of locomotion

^aCount stands for the number of enriched differentially expressed target genes.

Regulatory Interaction Analysis and Network Construction

After the interaction association of DEGs in C1 and C2 was analyzed using STRING online tool, only 55 DEGs in C1 had interaction association. Combining the biological processes and interaction association of DEGs in C1 and C2, 2 regulatory networks were constructed using Cytoscape software. The network of C1 contained 34 nodes and 12 miRNAs, and the network of C2 contained 19 nodes and 9 miRNAs (Figure 3). The target genes SEC22 vesicle trafficking protein homolog B (SEC22B) and SEC63 homolog (SEC63) regulated by miRNA-206; RAB10, member RAS oncogene family (RAB10) regulated by miRNA-369-3p, miRNA-30e-5p, miRNA-30e-5p, miRNA-30e-5p,

and miRNA-655; and fms-related tyrosine kinase 1 (*FLT1*) regulated by miRNA-30e-3p and miRNA-369-3p were involved in the biological processes of protein transport and regulation of cell motion.

Discussion

This study aimed to explore the potential role of miRNAs in pathogenesis of AD. Combined with miRNA and mRNA expression profile information, we further screened the miRNA target genes. A total of 52 differentially expressed miRNAs and 427 DEGs were obtained, and 313 pairs of regulatory association were constructed. The miRNA-206 participated in the biological processes of both protein transport and regulation of cell motion. The target genes such as *RAB10* and *FLT1* regulated by miRNA-369-3p and miRNA-30e-3p were also involved in the biological processes of protein transport and regulation of cell motion.

Micro RNAs are believed to suppress target gene expression through the binding of miRNA "seed" regions to complementary sequences of 3'-untranslated regions of target genes.²⁶ In the central nervous system, balanced expression of miRNA plays an important role in preventing neurodegeneration. In this study, miRNA-206 was overexpressed in AD. Interestingly, miRNA-206 appears to be present at a very low level in normal brains but at an aberrantly high levels in diseased brains, such as in AD.27 The miRNA-206 has also been found upregulated in cerebral ischemia and neurotoxicant exposure models.²⁸ Lee et al found that miRNA-206 participated in the pathogenesis of AD by suppressing the expression of brainderived neurotrophic factor. ²⁷ Additionally, the current study showed that target genes, SEC22B and SEC63, regulated by miRNA-206 participated in the biological processes of protein transport and regulation of cell motion. SEC22B and SEC63 have been found to be associated with protein trafficking and translocation and downregulation in the hippocampus of aging and AD brains. 29,30 In patients with AD, a disequilibrium of proteostasis in the brain leads to the accumulation of AB. 1,31 There's a growing theme that defects in transport are closely associated with neurodegeneration. Krohn et al have determined that transport protein has a central role in clearing AB from the brain of mice.³² Thus, miRNA-206 and its target genes SEC22B and SEC63 may be key regulators underlying the development of AD.

Our results also revealed that miRNA-655 was another significant miRNA enriched with DEGs such as RAB10. AB proteins have been found to be responsible for controlling the level of A β which are generated from APP by β - and γ -secretases. The accumulation of A β in the brain is central to the pathogenesis of AD. RAB10 has been confirmed to decrease A β that may be realized by affecting γ -secretase cleavage or the fate of A β . RAB11, one of the RAB proteins, has high homology with RAB10. Udayar et al showed that RAB11 controlled β -secretase endosomal recycling to the plasma membrane and thus affected A β production. Study suggests that miRNA-655 participates in the process of neuronal

^aCount stands for the number of enriched differentially expressed genes.

Zhao et al 5

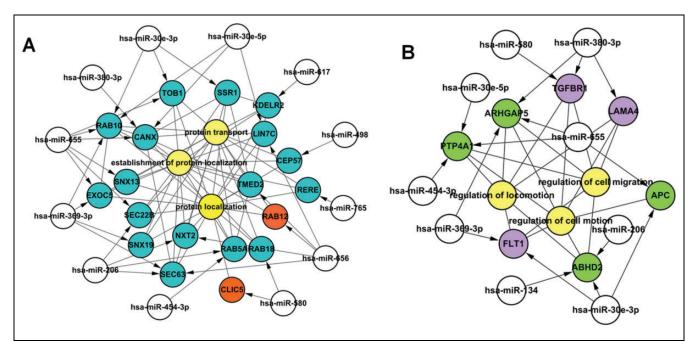


Figure 3. The constructed regulatory networks of microRNAs (miRNAs). A, The regulatory network of miRNAs was constructed based on function of protein transport. B, The regulatory network of miRNAs was constructed based on function of regulation of cell motion. Yellow nodes: Gene Ontology biological process terms; white nodes: differentially expressed genes (DEGs); orange and purple nodes: upregulated target genes; blue and green nodes: downregulated target genes.

differentiation,³⁶ which may be related to the pathophysiology of AD. In addition, from the regulatory network, we found that *RAB10* was also the target gene of miRNA-369-3p, -30e-3p, and -30e-5p. Satoh who analyzed molecular network of AD miRNA also extracted differentially expressed miRNAs of miRNA-655, -30e-3p, and -30e-5p in AD brains versus normal brains.³⁷ Although the present evidence of direct association between miRNA-655, -369-3p, -30e-3p, -30e-5p, and *RAB10* progression are rare, miRNA-655, -369-3p, -30e-3p, -30e-5p, and its target gene *RAB10* may be critical for progression of AD based on our results.

In addition, except for target gene RAB10, miRNA-369-3p and miRNA-30e-3p were also found to regulate FLT1. Ryu et al reported that the expression of FLT1 was significantly increased in the tissue of patients with AD. The enhanced FLT1 expression contributes to Aβ deposits and microglial autocrine or paracrine processes.³⁸ Chronic inflammation is integral to AD pathology.³⁹ A critical component of inflammatory response is an increased microglial mobility and chemotactic activity to A\beta deposition in the AD brain. FLT1 can mobilize microglia and cellular chemotactic to serve critical response functions in the AD brain.³⁸ The regulatory network suggested that FLT1 was regulated by miRNA-369-3p and miRNA-30e-3p, but there were few studies about the relationship between AD and miRNA of miRNA-369-3p and miRNA-30e-3p. Therefore, we speculate that these miRNAs and the target genes related to the key biological processes may be the therapeutic target for AD.

In summary, the target genes SEC22B and SEC63 regulated by miRNA-206; RAB10 regulated by miRNA-369-3p,

miRNA-30e-5p, miRNA-30e-3p, and miRNA-655; and *FLT1* regulated by miRNA-30e-3p and miRNA-369-3p may play key roles in the progression and development of AD. These significant miRNAs showed potential perspective in the treatment of AD. The miRNAs identified in our work may be potential therapeutic targets for AD.

However, there were a few limitations in our preliminary study. The sample size for microarray analysis was small which may cause a high rate of false-positive result. Besides, further studies are necessary for verifying the clinical applications of these miRNAs as biological targets for treatment of AD.

Declaration of Conflicting Interests

The authors declared no potential conflicts of interest with respect to the research, authorship, and/or publication of this article.

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