

Research Article

Analysis of Micro-RNAs Profile Identifies miR-3065-3p, miR-4650-3p, miR-29b-2-5p, and miR-3915 as Novel Biomarkers in Gestational Diabetes Mellitus

Bhushan R¹, Gupta D², Rani A³, Upadhyay S¹, Tripathi A⁴ and Dubey PK^{1*}

¹Banaras Hindu University, Centre for Genetic Disorders, Institute of Science, India

²Department of Obstetrics and Gynecology, Ashirwad Hospital, India

³Department of Obstetrics and Gynecology, Banaras Hindu University, India

⁴Department of Zoology, MMV, Banaras Hindu University, India

*Corresponding author: Pawan K Dubey, Banaras Hindu University, Centre for Genetic Disorders, Institute of Science, Varanasi-221005, India

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Abstract

Background: Gestational Diabetes Mellitus (GDM) is a metabolic disorder characterized by carbohydrate intolerance. Complete mechanisms involved in pathophysiology of GDM are still not well known and hence makes its early diagnosis and treatment a difficult task. Micro-RNAs are non-coding RNAs and have been found to be associated with many diseases including GDM. Methods: Here, we analyzed the transcriptomic datasets (GSE98043) to unravel the role of miRNAs in GDM. We processed and analyzed the microarray datasets to find differentially expressed miRNAs followed by miRNA-mRNA gene regulatory module to have a better understanding of its regulation.

Results: We identified a total of 128 Differentially Expressed (DE) miRNAs, of which the top 20 were selected for downstream processing. Four potential GDM miRNAs biomarkers namely miR-3065-3p, miR-4650-3p, miR-29b-2-5p and miR-3915 were significantly altered in GDM. The micro-RNAs were linked to carbohydrate metabolism, insulin signaling, and cell proliferation and apoptosis. The pathways enrichment analysis shows that they are involved in insulin signaling and pathways related to cancer.

Conclusions: Our study lead to the identification of four potential GDM miRNAs biomarkers namely miR-3065-3p, miR-4650-3p, miR-29b-2-5p and miR-3915 were significantly altered in GDM and can be used as diagnostic as well as therapeutic purpose.

Keywords: Gestational diabetes mellitus; Micro-RNAs; Bio-markers; Genes; Gene ontology

Background

Gestational Diabetes Mellitus (GDM) is defined as any degree of carbohydrate intolerance, with onset or first recognition during the second or third trimester of pregnancy [1]. GDM complicates around 7% of all pregnancies while it comprises 90-95 % of all cases of diabetes in pregnancy. It is a major cause of perinatal morbidity and mortality, as well as maternal long term morbidity. The pathophysiology of GDM is still not fully characterized. Gestational diabetes mellitus is a metabolic disorder characterized by insulin resistance accompanied by low/absent beta-cell compensatory adaptation to the increased insulin demands [2].

MicroRNAs (miRNAs) are endogenous ~19-24 nt small non-coding RNAs that modulate gene expression by inducing the translational arrest and degradation of messenger RNAs. Micro-RNA is highly versatile as a single miRNA can potentially modulate multiple genes, whereas a single gene can be regulated by several miRNAs [3]. Such complex nature of miRNAs justifies its role in virtually every cellular process, as well as in development or differentiation, regulation of cell cycle [4], and immune system homeostasis [5]. Recently, several studies have reported the role of miRNAs in multiple sides of beta-cell function and differentiation [6], both in normal and

diabetic conditions, as well as in beta-cell compensatory processes during pregnancy. Therefore a deep understanding of microRNA functions and genes and pathways related to it could improve the knowledge on the etiology and pathophysiology of GDM and its complications. Furthermore, due to their high stability in body fluids and their accessibility from maternal blood throughout gestation, they could serve as biomarkers for the early diagnosis and treatment of GDM.

This study aims to find altered miRNAs in GDM and their potential validated target genes, the determination of the most important miRNAs, and their related genes and pathways in Gestational Diabetes Mellitus. Here we investigated and identified GDM related Differentially Expressed miRNAs (DEmiRNAs), validated GDM related target genes, miRNA-mRNA interactions, and signaling pathways. Our results showed 128 DEmiRNAs of which the top 20 was considered for further analysis. Target genes were predicted and a consensus-based approach leads to the identification of validated GDM related target genes. Of the 128miRNAs, miR-3065-3p, miR-4650-3p, miR-29b-2-5p, and miR-3915 are the most novel promising biomarker. Besides, Functional and pathways enrichment showed that these miRNA and their target genes have important roles in GDM and insulin metabolism.

Methods

Microarray data

Micro-RNA expression profile (GSE ID: GSE98043) datasets of human GDM have been selected that are available in the public repository: NCBI Gene Expression Omnibus (GEO) (<http://www.ncbi.nlm.nih.gov/geo/>) [7]. In this study, plasma from 4 pregnant women (2 from normal controls and 2 from GDM patients) were used. The Subjects were of Asian (Chinese) ethnicity and this microarray study was earlier approved by local Chinese ethics committee and participants; here we are just accessing the data from NCBI and analyzing them.

Data preprocessing and differentially expressed miRNA in GDM

The Series matrix file was downloaded and processed. The probe-level symbols were converted into gene-level symbols by using GEO2R [8]. Analyzing GDM has been done in two groups NGT (Normal Glucose Tolerant) control and GDM patients using the GEO2R tool, to detect the differentially expressed miRNAs. Top 20 differentially expressed miRNAs have been selected, of which 10 were highly up-regulated while 10 were highly down-regulated. The selection of miRNA was based on fold change value. All miRNA selected have P-values less than 0.05.

Identification of miRNA-target gene

Target genes of DE miRNAs, were identified from two databases namely Target scan [9] and miRDB [10]. Common target genes in both databases and having a target score >90 were selected and uploaded in STRING [11] for further analysis. Further CS>0.9 were taken as criteria for gene selection. Genes with TS>90 and CS>0.9 were selected.

Construction of miRNAs and mRNAs regulatory module (MMRM)

Target genes with a combined score >0.9 were then uploaded in Cytoscape 3.2.1 [12] and MicroRNA-mRNA Regulatory Module (MMRM) were constructed for up-miRNA and down-miRNA jointly. The network was analyzed and edge between ness was taken as criteria for network construction. Color and node size were attributed on the miRNA-target genes network to identify miRNA, mRNA, and GDM specific genes.

Enriched Gene Ontology and pathway analysis

Biological processes, molecular function, cellular component, and their related pathways in GDM related miRNA-target gene were identified using DAVID 7.6 [13]. Based on hypergeometric distribution, DAVID takes the genes with similar or related functions as a whole set. Significant functions were plotted against $-\log_{10}$ of the p-value for up and down miRNA-target genes separately. In this analysis p-value<0.05 was set as the criterion.

Results

Micro-RNA expression profile

Micro-RNA data sets were normalized and preprocessed to get expression profiles (Figure 1). Based on, A total of 128 differentially expressed miRNAs, 63 Up-regulated, and 65 Down-regulated miRNAs (p-value<0.005; fold change value ≥ 1.5) were identified in GDM. Out of these 128, top 20 differentially expressed miRNAs: 10

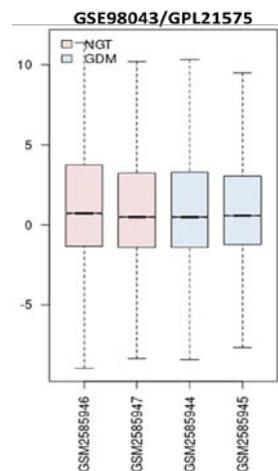


Figure 1: Microarray data normalization. Box plot showing the distribution of values data for the selected samples. The lines in the box are coincident, indicating that these chips have been highly normalized.

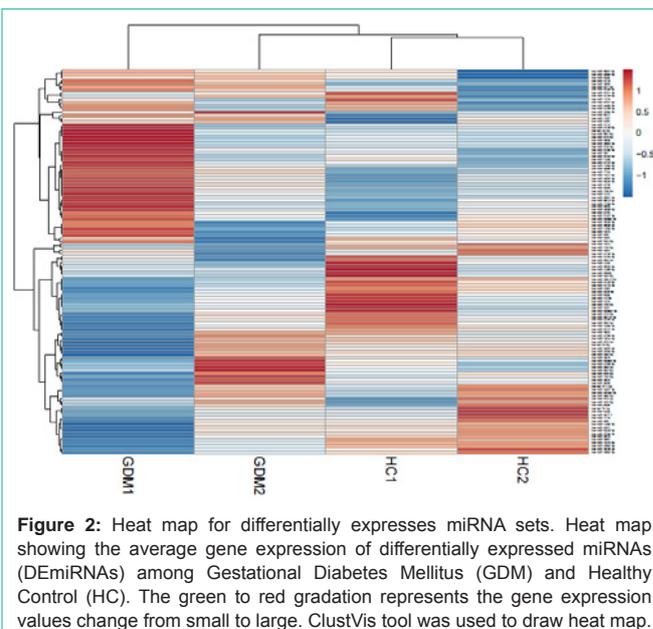


Figure 2: Heat map for differentially expresses miRNA sets. Heat map showing the average gene expression of differentially expressed miRNAs (DEmiRNAs) among Gestational Diabetes Mellitus (GDM) and Healthy Control (HC). The green to red gradation represents the gene expression values change from small to large. ClustVis tool was used to draw heat map.

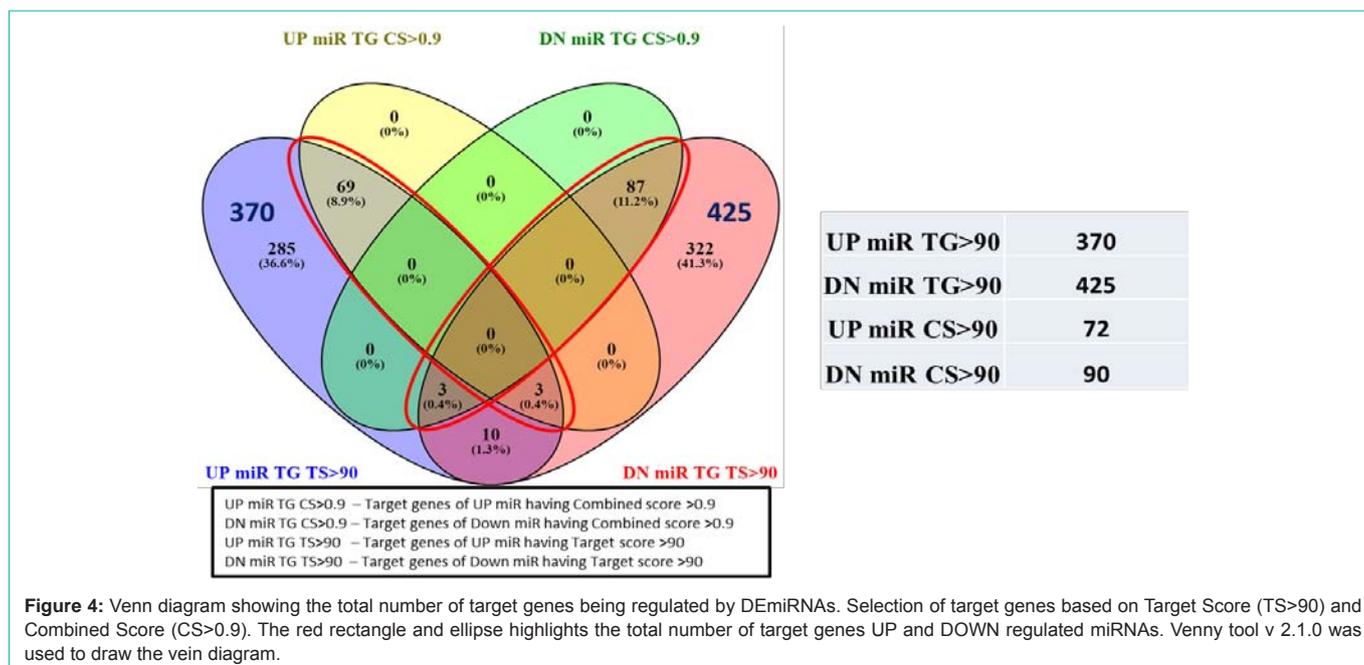
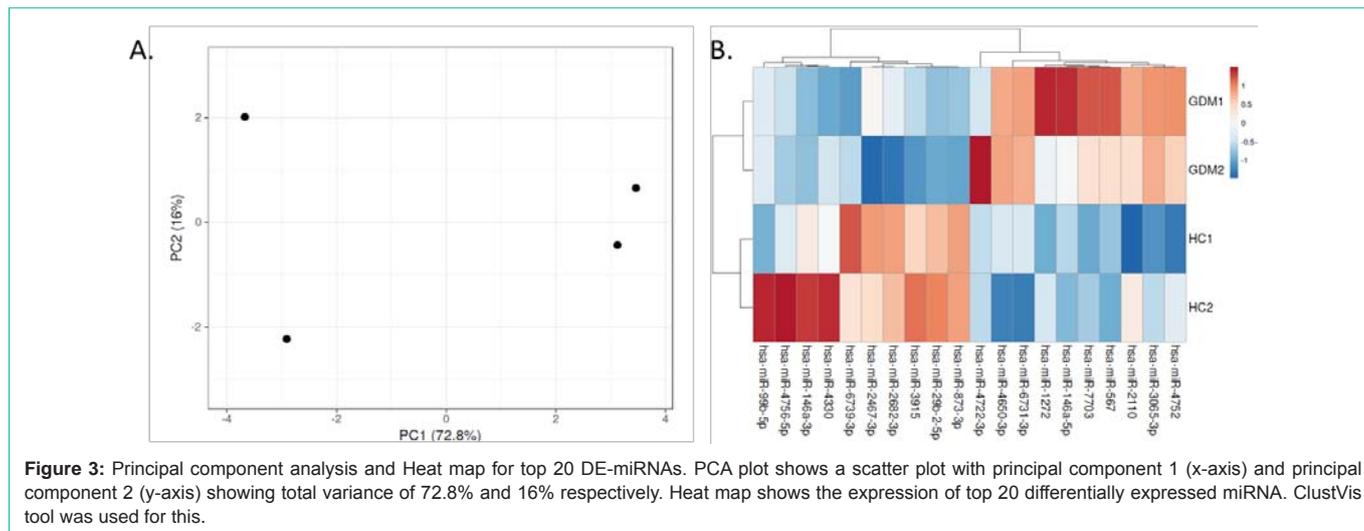
Up-miRs and 10 Down-miRs were selected for further study (Figure 2).

Principal component and hierarchical gene clustering analysis

PCA scatter plot reveals data clustering with axes corresponding to the two different principal components- principal component 1 (16%) and principal component 2 (72.8%) (Figure 3A). Heat-map shows a data matrix where coloring gives an overview of the numeric differences. Heat map was constructed for differentially expressed genes (Figure 3B).

Enrichment of target genes

Target genes search from two databases i.e. Target scan and miRDB, resulted in a total of 41,685 target genes for Up- and 50,831 genes for Down-regulated miRNAs. Sorting of the target genes



based on target score >90 and combined score >0.9, we get a total of 162 target genes, 72 for Up-miRNAs, and 90 for Down-regulated miRNAs. In this study, novel potential genes involved in GDM were identified by comparing our computationally predicted target gene list with genes obtained from the Gene Cards database, containing experimentally validated GDM related gene Thus the result showed a total of 49 target genes, 22 for Up-miRNAs and 27 for Down-miRNAs as potential GDM specific target genes which are experimentally validated (Figure 4).

miRNA-mRNA Regulatory Module (MMRM) in GDM

Target genes (combined score >0.9) along with their respective miRNAs were used to construct the MMRM network. The MMRM for Up-miRs included a total of 114 genes (Figure 5A), 10 Up-miRs, and 257 edges (Figure 4) while MMRM for Down-miRs included total 166 genes (Figure 5B), 10 Down-miRs and 350 edges.

GO and KEGG pathway enrichment analysis

Gene ontology enrichment analysis lead to identification of significantly (p-value<0.05) enriched major processes like response to insulin stimulus, lipid and carbohydrate metabolism, tyrosine kinase and Wnt receptor signaling being regulated by these DE miRNAs (Figure 6). KEGG pathway analysis demonstrated total ten significant pathways. Long term depression, pathways in cancer, JAK-STAT signaling, Wnt signaling, Insulin signaling, and ErbB signaling are some of the major significant pathways being regulated by these DE miRs (Figure 7).

Discussion

Gestational Diabetes Mellitus is a glucose metabolism disorder and its progresses much earlier before its clinical diagnosis which is accomplished at 24-28 weeks of gestation [7]. In recent years, incidences of GDM has increased dramatically and hence demands

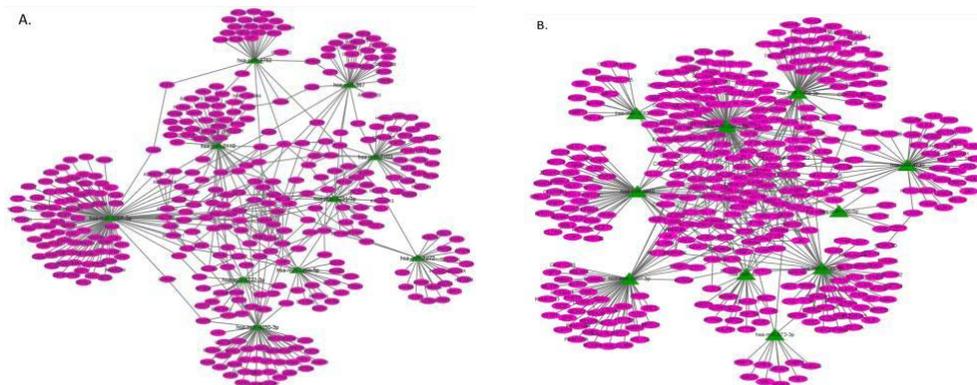


Figure 5: MicroRNA-mRNA regulatory Module (MMRM). A. MMRM of up-regulated miRNA and their target genes. B. MMRM of down-regulated miRNA and their target genes. Blue ellipses represent target genes, Green triangle up-regulated miRNAs. Lines the correlation between genes. Thickness of lines (edges) is proportional to the combined score. Cytoscape v 3.2.1 was used to construct the network.

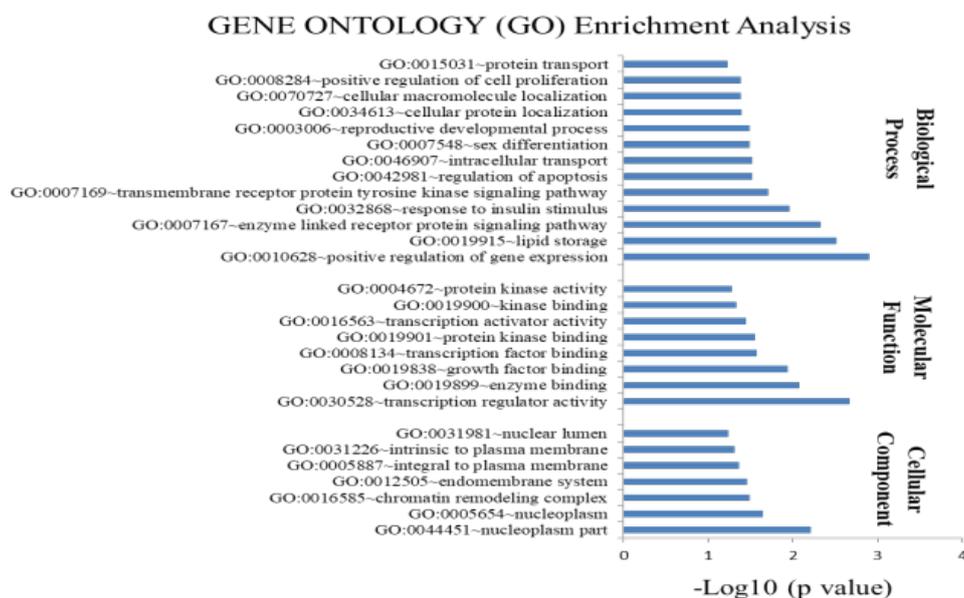


Figure 6: Gene Ontology (GO) analysis for DE-miR in PPI network. Bar graph showing significant processes, function and cellular component enriched in diabetic mothers for target genes of up-miR. DAVID v 6.7 was used for annotation.

additional biomarkers to accurately monitor the status of gestational diabetes so that early screening in the first or second trimester of pregnancy could be feasible. Hence, deep understanding of GDM could have an important role in detecting biomarkers involved in the prognosis of GDM. Recently, diverse role of miRNA have been reported in many diseases [9-11]. Hence, it can be considered as optimal biomarkers and sensors in GDM. In the present study, we have tried to identify the blood-derived miRNAs biomarkers as well as molecular interactions that clarify biochemical mechanisms involved in GDM.

The microarray datasets, GSE98043-miRNA was statistically analyzed in this study. We have identified a total of 128 differentially expressed miRNAs, 63 Up-regulated, and 65 Down-regulated miRNAs in GDM. For further analysis, only the top 20 differentially expressed miRNAs (10 Up and 10 Down) were selected and a heat map was generated (Figure 2). Target gene prediction led to the

identification of a total of 41,685 target genes for Up- and 50,831 genes for Down-regulated miRNAs. These genes were further sorted based on target score and combined score leading to the identification of 49 potential validated GDM related genes (22 for up- and 27 for down-miRNAs) were identified (Figure 3). Then, the miRNA-mRNA regulatory module was constructed for Up-miRNAs and Down-miRNAs (Figure 4A, 4B). Validated GDM related target genes along with other neighbor-genes were enriched for their functions and pathways. Major significant functions and pathways regulated by target genes of Up-miRNAs were a response to insulin stimulus, lipid storage, regulation of apoptosis, cell proliferation, response to carbohydrate stimulus, Notch signaling, Wnt signaling, insulin signaling, and ErbB signaling pathways. Down-miRNAs were found to be involved in the regulation of fatty acid metabolism, regulation of immune response, pathways in cancer and long term depression, tyrosine kinase signaling (Figure 5).

We identified four potential GDM miRNAs biomarkers, miR-

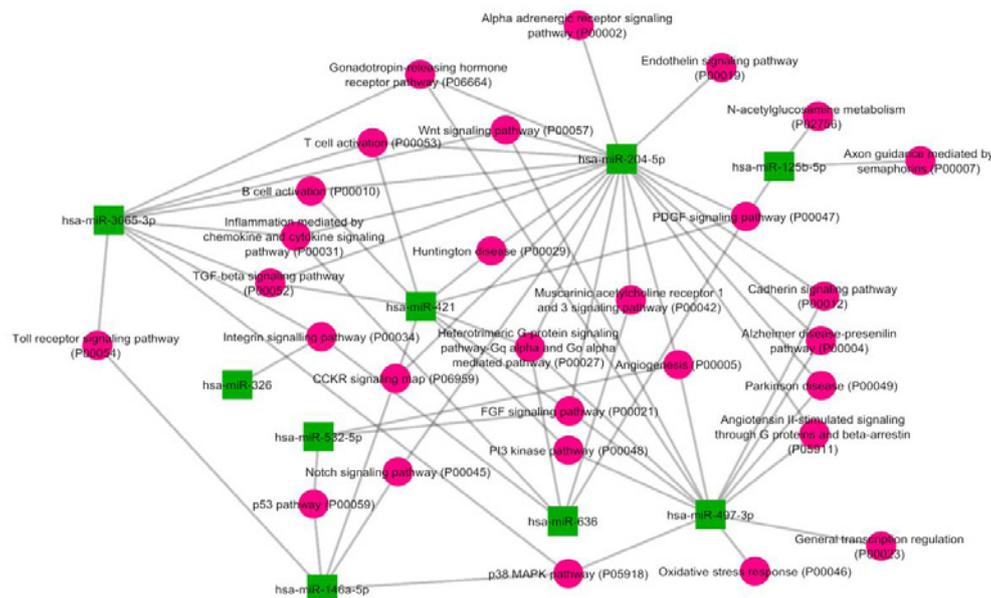


Figure 7: KEGG Pathway analysis for DE miRNAs in diabetic mothers. Pathway enrichment for DE miRNAs led to identification of 3 significant pathways for up-miRNAs while 7 significant pathways for down-miRNAs. DAVID v 6.7 was used for annotation. Red and blue bars represent pathways of up-miRNAs and down-miRNAs respectively.

miR-3065-3p, miR-4650-3p, miR-29b-2-5p, and miR-3915 that were significantly altered in GDM. Among these miRNAs, miR-3065-3p and miR-4650-3p were Up-regulated while miR-29b-2-5p and miR-3915 were Down-regulated. Very less/no study on these four miRNAs makes them novel biomarkers for GDM. However, further experimental studies are required to validate these findings.

MIR-29b-2-5p has been shown to activate p53 expression and induce the p53-mediated apoptosis in HeLa cells [14]. In another study, miR-29b-2-5p inhibited cell proliferation, induced cell cycle arrest, and promoted apoptosis [15]. Furthermore, in a variety of tumors including chronic lymphocytic leukemia, lung cancer, prostate cancer, and breast cancer, miR-29b-2-5p was down-regulated [16-17]. From network analysis, we revealed that miR-3065-3p, which has increased expression in GDM and enriched in insulin metabolism [18], has a role in the regulation of insulin signaling pathways. Besides its role in insulin signaling, it has also been found to regulate Wnt and JAK-STAT pathways. This implies that Insulin signaling is somehow related to Wnt and JAK-STAT.

The consensus approach led to the identification of GDM specific target genes of DE miRNAs in GSE19649 datasets. Although these genes were not significant, however, they were found to be validated potential role players in GDM as confirmed from the results of GeneCards search. These genes were TCF7L2, BRAF, IL10RB, CD36, and IL6ST regulated by Up-miRNAs namely miR-3065-3p, miR-2110, miR-4650-3p, and miR-567 while ACSL1, AR, IL1RN, PRKG1 are genes regulated by Down-miRNAs namely miR-146a-3p, miR-2467-3p and miR-3915.

In conclusion, our finding suggests that the different expressions of miRNAs are one of the most important variables in GDM. We argued that, among others, miR-3065-3p, miR-4650-3p, miR-29b-2-5p, and miR-3915 might be the most promising blood-derived miRNA biomarkers in GDM. Although, our analysis is based on the

high throughput data and is not derived in our laboratory, a large number of experimental studies confirm that the pathways and genes which were involved in GDM are supported.

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