

# *In Silico* Study of miRNA Based Gene Regulation, Involved in Solid Cancer, by the Assistance of Argonaute Protein

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Solid tumor is generally observed in tissues of epithelial or endothelial cells of lung, breast, prostate, pancreases, colorectal, stomach, and bladder, where several genes transcription is regulated by the microRNAs (miRNAs). Argonaute (AGO) protein is a family of protein which assists in miRNAs to bind with mRNAs of the target genes. Hence, study of the binding mechanism between AGO protein and miRNAs, and also with miRNAs-mRNAs duplex is crucial for understanding the RNA silencing mechanism. In the current work, 64 genes and 23 miRNAs have been selected from literatures, whose deregulation is well established in seven types of solid cancer like lung, breast, prostate, pancreases, colorectal, stomach, and bladder cancer. *In silico* study reveals, miRNAs namely, miR-106a, miR-21, and miR-29b-2 have a strong binding affinity towards *PTEN*, *TGFBR2*, and *VEGFA* genes, respectively, suggested as important factors in RNA silencing mechanism. Furthermore, interaction between AGO protein (PDB ID-3F73, chain A) with selected miRNAs and with miRNAs-mRNAs duplex were studied computationally to understand their binding at molecular level. The residual interaction and hydrogen bonding are inspected in Discovery Studio 3.5 suites. The current investigation throws light on understanding miRNAs based gene silencing mechanism in solid cancer.

**Keywords:** Argonaute, *in silico*, microRNAs, mRNA, solid cancer

## Introduction

Cancer has a complex pathophysiology unlike other diseases. The development of cancer is attributed to a number of predisposing factors like familial and genetic factors, racial and geographic factors and various epidemiological factors like smoking, use of tobacco, diet, and certain type of infection. Majority of the cancers occur in ageing population [1], however there is a changing trend towards younger population in recent years. The uncontrolled division of cancer cells generally spreads to the other part of body through the blood and lymphatic systems. In this context, solid cancer which is an abnormal mass of tissue that usually does not contain cysts or liquid area can be either benign or malignant in nature. Such solid cancers are observed in tissues of epithelial or endothelial cells of lung,

breast, prostate, pancreatic, colorectal, stomach, and bladder. Management of cancer is a multimodality approach and includes surgery, radiotherapy, chemotherapy and targeted therapy with certain limitations of each approach. Research is going across the globe for the management of cancer. Recently microRNAs (miRNAs) have drawn attention of the researchers to discover new insights into the treatment of cancer. These miRNAs are highly conserved non-coding single stranded RNAs (~18 to 22 bp) that target mRNA at 3' un-translated region of protein coding genes and act as natural inhibitor. These miRNAs participate in several biological processes such as cell differentiation, proliferation, metabolism, and apoptosis and are also involved in the regulation of gene expression [2]. However, in development of pathologies like cancer, deregulation of miRNAs expression has been identified as potential area to be studied. The miRNAs have special signature and variation from normal

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cells [3]. Hence, use of specific miRNAs as biomarker may be applied for cancer diagnosis and treatment. Since the expression of tumor suppressor genes and oncogenes are influenced by the miRNAs, provides scope to study their association in cancer [3]. Collating data for miRNAs signatures associated with solid tumors, it was reported that more than 50% of miRNAs genes are located in cancer

associated genomic regions or in fragile sites, suggesting that miRNAs play a crucial role in the pathogenesis of a limited range of human cancers than previously expected [4]. Considering their influence on the cancer cell phenotype, some miRNAs are considered to be oncogenic, and others to be tumor-suppressive [5]. Few miRNAs are well characterized in cancer association such as miR-21, miR-17-5p, miR-191,

**Table 1.** The 17 miRNAs and 45 target genes involved in regulation of seven types of solid cancers are reported

miRNA	Cancer	Target gene			Reference
		Oncogene	Expression	Tumor suppressor gene Expression	
miR-21	Lung	-	-	<i>PDCD4<sup>a</sup></i>	Down [6]
	Breast	-	-	<i>PTEN<sup>a</sup></i>	Down [7]
	Colorectal	<i>CDC25A<sup>a</sup></i>	Down	<i>PDCD4<sup>a</sup>, TGFBR2<sup>a</sup></i>	Down [8]
miR-17-5p	Bladder	<i>RECK<sup>a</sup>, BCL2<sup>a</sup></i>	Up	Absent	- [7]
	Prostate	<i>PCAF<sup>a</sup></i>	Up	Absent	- [9]
	Colorectal	Absent	-	<i>PTEN<sup>a</sup></i>	Down [10]
miR-191	Pancreatic	<i>MUC17<sup>a</sup></i>	Up	Absent	- [11]
	Colorectal	<i>SOX4<sup>a</sup>, TIMP3<sup>a</sup></i>	Up	Absent	- [12]
miR-29b-2	Lung	<i>MMP2<sup>a</sup></i>	Up	Absent	- [13]
	Breast	<i>MMP2<sup>a</sup>, DNMT3B<sup>a</sup></i>	Up	Absent	- [14]
	Prostate	<i>DNMT3B<sup>a</sup>, VEGFA<sup>a</sup>, MMP2<sup>a</sup></i>	Up	Absent	- [15]
	Colorectal	<i>MMP2<sup>a</sup></i>	Up	Absent	- [16]
	Stomach	<i>MMP2<sup>a</sup></i>	Up	Absent	- [17]
	Bladder	<i>IFNG<sup>a</sup>, MMP2<sup>a</sup></i>	Up	Absent	- [14]
miR-223	Colorectal	<i>FOXO1<sup>a</sup>, IGF-1R<sup>a</sup></i>	Up	Absent	- [18]
	Pancreatic	<i>NFIA<sup>a</sup></i>	Up	Absent	- [19]
	Stomach	Absent	-	<i>FBXW7<sup>a</sup></i>	Down [20]
miR-199a-1	Lung	<i>HIF1<math>\alpha</math><sup>a</sup></i>	Up	Absent	- [21]
	Pancreatic	Absent	-	<i>SMAD4<sup>a</sup></i>	Down [22]
miR-126	Lung	<i>VEGFA<sup>a</sup>, CRK<sup>a</sup>, SLC7A5<sup>a</sup></i>	Down	<i>EGFR<sup>a</sup></i>	Down [23]
	Colorectal	Absent	-	<i>IRS-1<sup>a</sup></i>	Down [24]
	Stomach	<i>CRK<sup>a</sup></i>	Up	Absent	- [25]
	Bladder	<i>ADAM9<sup>a</sup></i>	Up	Absent	- [26]
miR-31	Lung	Absent	-	<i>LATS2<sup>a</sup>, PPP2R2A<sup>a</sup></i>	Down [27]
	Prostate	<i>EZH2<sup>a</sup></i>	Up	Absent	- [28]
miR-146a	Prostate	<i>ROCK1<sup>a</sup></i>	Up	Absent	- [29]
	Pancreatic	<i>IRAK1<sup>a</sup>, NFKB<sup>a</sup>, MTA2<sup>a</sup></i>	Down	<i>EGFR<sup>a</sup></i>	Down [30]
miR-155	Lung	<i>CASP3<sup>a</sup>, TP53INP1<sup>a</sup>, CASP317<sup>a</sup></i>	Down	<i>SOCS1<sup>a</sup>, PTEN<sup>a</sup></i>	Down [31]
	Breast	<i>FOXO3<sup>a</sup></i>	Up	<i>SOCS1<sup>a</sup></i>	Up [32]
miR-181b-1	Breast	<i>BCL2<sup>a</sup></i>	Up	Absent	- [33]
	Colorectal	<i>TIMP3<sup>a</sup></i>	Up	Absent	- [33]
	Stomach	Absent	-	<i>TIMP3<sup>a</sup></i>	Down [34]
miR-20a	Colorectal	Absent	-	<i>PTEN<sup>a</sup></i>	Down [35]
	Pancreatic	<i>ABL2<sup>a</sup></i>	Up	Absent	- [30]
miR-107	Pancreatic	Absent	-	<i>CDK6<sup>a</sup></i>	Down [36]
miR-32	Prostate	<i>BCL2L11<sup>a</sup></i>	Up	Absent	- [37]
	Colorectal	Absent	-	<i>PTEN<sup>a</sup></i>	Down [38]
mir-214	Pancreatic	Absent	-	<i>ING4<sup>a</sup></i>	Down [39]
miR-106a	Colorectal	<i>E2F1<sup>a</sup></i>	Up	<i>PTEN<sup>a</sup>, RBT<sup>a</sup></i>	Up [40]
	Pancreatic	Absent	-	<i>TGFBR2<sup>a</sup></i>	Down [41]
miR-128b	Lung	<i>VEGF<sup>a</sup>, CRK<sup>a</sup>, SLC7A5<sup>a</sup></i>	Down	<i>EGFR<sup>a</sup></i>	Down [17]

miRNA, microRNA.

<sup>a</sup>The genes are on the basis of their expression criteria.

miR-29b-2, miR-223, miR-128b, miR-199a-1, miR-24-1, miR-24-2, miR-146, miR-155, miR-181b-1, miR-20a, miR-107, miR-32, miR-92-2, miR-214, miR-30c, miR-25, miR-221, miR-106a, miR-126, and miR-31 (Supplementary Table 1) that are involved in either up regulation or down regulation of many genes [42-58]. Till date various researchers have explored the unusual expression of miRNAs, and its prognostic significance in various human malignancies. Hence, to study the relationship between miRNAs and cancer, it is important to examine the expression profile of miRNAs and their target genes in different cancer types. As a case study, the unusual expression of miRNA-21 has been conformed in various cancers such as lung, breast, prostate, colorectal, pancreatic, bladder, and stomach cancer, and interestingly the oncogenic like function of miRNA-21 is mediated through the expression of its target genes like *PDCD4*, *PTEN*, and *TGFBR2* which are generally tumor suppressor genes in nature [59]. Though miRNAs control the gene expression to some extent during translation process but the translational suppression mechanism is still controversial, for example some miRNAs down-regulate while others up-regulate the gene expression. Hence, study of interaction mechanism between miRNAs and their target

genes is essential. In the process of miRNAs mediated gene regulation, the Argonaute (AGO) class of proteins play a significant role in the hybrid formation between miRNA-mRNA [60, 61]. Despite of several researches, controlling this abnormal cell proliferation selectively in different cancer by miRNAs as natural inhibitor is still a major challenge. In the present study, attempts have been made to develop a strategy for identification and selection of suitable miRNAs, their target genes associated in solid tumor, and as well as to study the role of AGO protein in their interaction at molecular level using computational tools and techniques.

## Methods

### Screening of miRNAs and genes

Extensive literature search and exploration of online databases were conducted to understand miRNAs mediated regulation of solid cancer associated target genes using miRCancer (<http://mircancer.ecu.edu/>) and miRDisease (<http://mir2disease.org>). miRNAs and target genes were screened by following two criteria: (1) only up regulated oncogenes or down regulated tumor suppressor genes were selected and (2) the screening was performed by selecting

**Table 2.** Twenty-three target genes and their involvement in different biological function are reported from UniProt (<http://www.uniprot.org/>) web server

No.	Gene	miRNA	Function
1	<i>TGFBR2</i> <sup>a</sup>	miR-21, miR-106a	Angiogenesis, apoptosis, cell cycle, cell proliferation, other function
2	<i>VEGFA</i> <sup>a</sup>	miR-29b-2, miR-126	
3	<i>PTEN</i> <sup>a</sup>	miR-106a, miR-20a, miR-17-5p, miR-32, miR-155, miR-21	
4	<i>IFNG</i>	miR-29b-2	Apoptosis, cell cycle, cell proliferation, other function
5	<i>CDK6</i>	miR-107	
6	<i>IGF-1R</i>	miR-223	Apoptosis, cell cycle, other function
7	<i>TP53INP1</i>	miR-155	
8	<i>MMP2</i>	miR-29b-2	Angiogenesis, other function
9	<i>ADAM9</i>	miR-126	
10	<i>RB1</i>	miR-106a	Apoptosis, cell cycle
11	<i>FBXW7</i>	miR-223	Apoptosis, other function
12	<i>EGFR</i>	miR-146a, miR-128b	Cell proliferation, other function
13	<i>SMAD4</i>	miR-199a-1	
14	<i>CDC25A</i>	miR-21	Cell proliferation
15	<i>DNMT3B</i>	miR-29b-2	Other function
16	<i>ABL2</i>	miR-20a	
17	<i>ROCK1</i>	miR-146a	
18	<i>CRK</i>	miR-126	
19	<i>PPP2R2A</i>	miR-31	
20	<i>MTA2</i>	miR-146a	
21	<i>TIMP3</i>	miR-181b-1	
22	<i>RECK</i>	miR-21	
23	<i>SLC7A5</i>	miR-126	

miRNA, microRNA.

<sup>a</sup>Three genes have maximum involvement in different biological activity.

oncogenes and tumor suppressor genes as target genes when both of them are either up regulated or down regulated. Further, minimum free energy (MFE) score based binding affinity between miRNAs and their target genes were explored and inspected using miRTarbase web server (<http://mirtarbase.mbc.nctu.edu.tw/>). Furthermore, the involvement of target genes in different biological function was inspected using UniProt (<http://www.uniprot.org/>) web server and plotted using Venn (<http://bioinformatics.psb.ugent.be/webtools/Venn/>) diagram.

### Prediction of structural model of miRNA-mRNA complexes

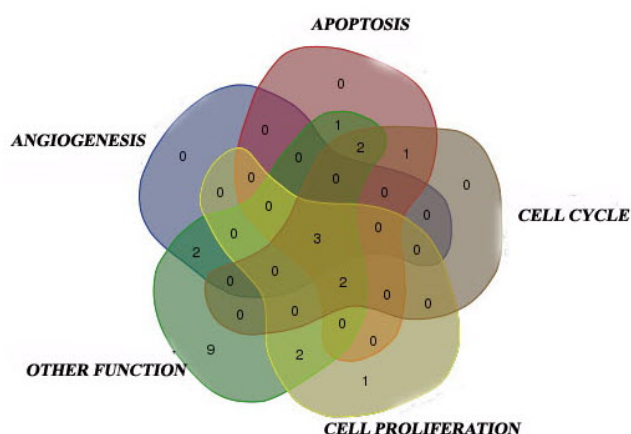
To verify the folding affinity between selected miRNAs and their target genes, secondary structures were predicted using RNAfold web server (<http://rna.tbi.univie.ac.at/cgi-bin/RNAfold.cgi>). The resulted dot bracketed structures of duplex were used for prediction of their tertiary structure using RNA COMPOSER (<http://rnacomposer.cs.put.poznan.pl/>).

### Structure extraction of AGO protein

The three-dimensional structure of AGO protein was retrieved from Protein Data Bank (PDB ID: 3F73). The structure preparation and correction of AGO protein were performed using Discovery Studio 3.5 suite (<http://accelrys.com/products/discovery-studio/visualizatation-download.php>).

### Molecular docking between miRNA-mRNA and AGO protein

Docking between three dimensional structure of protein



**Fig. 1.** The 23 target genes and their involvement in different biological functions like angiogenesis, apoptosis, cell cycle, cell proliferation, and others are plotted using Venn diagram (<http://bioinformatics.psb.ugent.be/webtools/Venn/>). The numbers denoted in plot indicate the number of target genes involvement in each of the different biological function.

and ligand, may be a biomolecule like miRNA or a gene is an efficient computational method to inspect the molecular interaction [61]. Docking were performed between AGO protein and miRNA-mRNA duplexes (miR-106 and *PTEN*; miR-21 and *TGFBR2*; and miR-29b-2 and *VEGFA*) using PatchDock web server (<http://bioinfo3d.cs.tau.ac.il/PatchDock/>), algorithm ranked the docked complexes on the basis of highest geometrical shape complementary scores. The molecular interaction was studied using Discovery Studio 3.5 suite.

**Table 3.** MFE score based binding affinity between 15 miRNAs and 23 target genes associated in seven types of solid cancer

No.	Gene	Cancer	miRNA	MFE score (kcal/mol)
1	<i>PTEN</i> <sup>a</sup>	Colorectal	miR-106a	-14.3
		Colorectal	miR-20a	-13
		Colorectal	miR-17-5p	-12.9
		Colorectal	miR-32	-12
		Lung	miR-155	-10.7
		Breast	miR-21	-9.41
2	<i>TGFBR2</i> <sup>a</sup>	Colorectal	miR-21	-16.2
		Pancreatic	miR-106a	-15.1
3	<i>VEGFA</i> <sup>a</sup>	Prostate	miR-29b-2	-15
		Lung	miR-126	-11.5
4	<i>CDC25A</i>	Colorectal	miR-21	-10.2
5	<i>RECK</i>	Bladder	miR-21	-16.1
6	<i>MMP2</i>	Lung, breast, colorectal, prostate, stomach, bladder	miR-29b-2	-11.3
7	<i>DNMT3B</i>	Breast, prostate	miR-29b-2	-12.6
8	<i>IFNG</i>	Bladder	miR-29b-2	-16.7
9	<i>IGF-1R</i>	Colorectal	miR-223	-11
10	<i>FBXW7</i>	Stomach	miR-223	-12.5
11	<i>SMAD4</i>	Pancreatic	miR-199a-1	-13.2
12	<i>CRK</i>	Lung	miR-126	-18.1
13	<i>SLC7A5</i>	Lung	miR-126	-16.3
14	<i>ADAM9</i>	Bladder	miR-126	-13.8
15	<i>PPP2R2A</i>	Lung	miR-31	-17.9
16	<i>ROCK1</i>	Prostate	miR-146a	-9.3
17	<i>MTA2</i>	Pancreatic	miR-146a	-14.7
18	<i>EGFR</i>	Pancreatic	miR-146a	-19.8
		Lung	miR-128b	-17.2
19	<i>TP53INP1</i>	Lung	miR-155	-13.4
20	<i>TIMP3</i>	Colorectal, stomach	miR-181b-1	-14.7
21	<i>ABL2</i>	Pancreatic	miR-20a	-20.4
22	<i>CDK6</i>	Pancreatic	miR-107	-19.2
23	<i>RB1</i>	Colorectal	miR-106a	-13.7

MFE, minimum free energy; miRNA, microRNA.

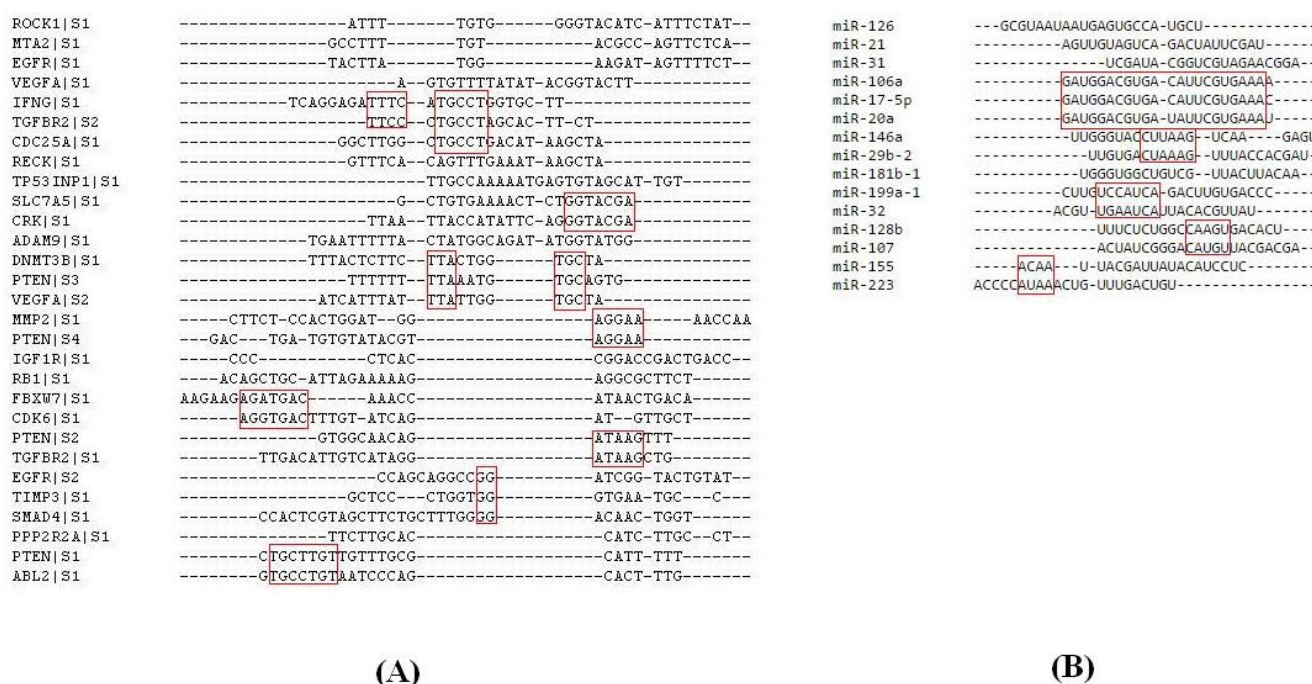
<sup>a</sup>Three target genes namely *PTEN*, *TGFBR2*, and *VEGFA* are observed with high binding affinity towards miR-106a, miR-21, and miR-29b-2, respectively.

## Results

### Screening of miRNAs and genes associated with solid tumor

From the literature, 23 miRNAs were found to be involved in seven solid tumors namely; lung, breast, colorectal, pancreatic, prostate, stomach, and bladder [62]. Again through exploration of online databases 64 different target genes (oncogenes and tumor suppressor genes) were observed to be regulated by these 23 miRNAs (Supplementary Table 1). Again out of these seventeen miRNAs

are suspected to be effectively involved in controlling the expression pattern of 45 target genes associated in seven solid tumors (Table 1) [6-41]. Further, binding affinity was explored using miRTarbase web server. Fifteen miRNAs and 23 target genes were selected as per the availability of MFE score (Supplementary Table 2) and subjected to further study. The involvement of these 23 genes in different biological functions are explored and inspected from UniProt web server (<http://www.uniprot.org/>). It was observed only *PTEN*, *TGFBR2*, and *VEGFA* genes mostly regulating angiogenesis, apoptosis, cell cycle, cell proli-

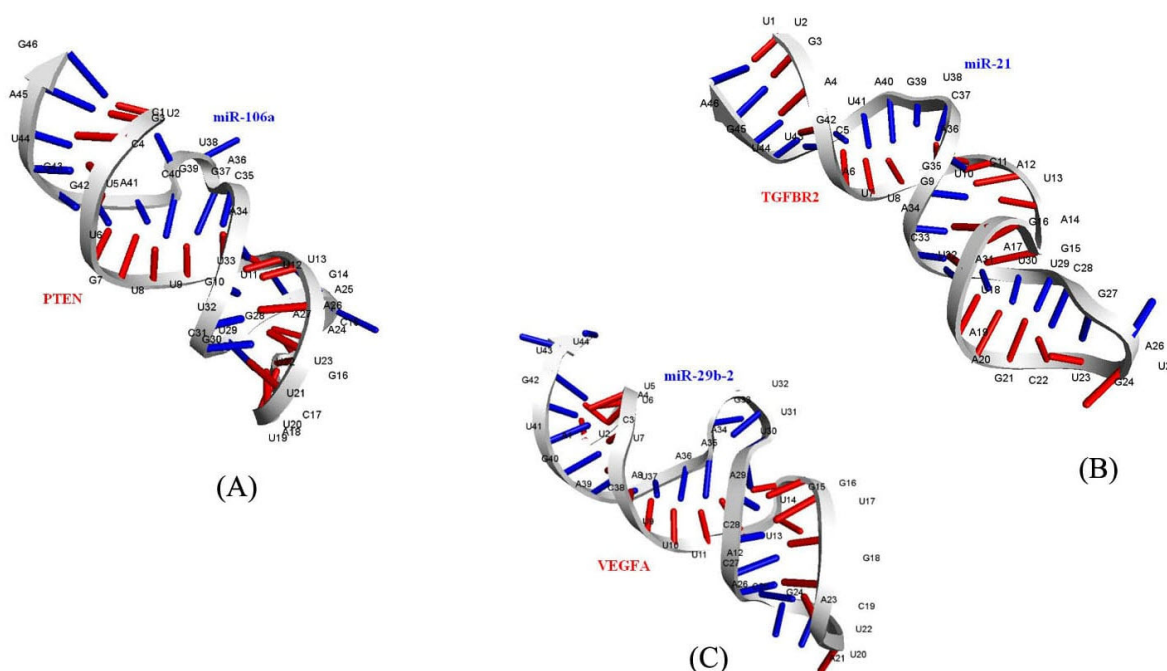


**Fig. 2.** The sequence similarity between 23 selected genes (A) and 15 miRNAs (B) inspected and deciphered. The sequence conservation in binding pattern highlighted in red box. miRNA, microRNA.

**Table 4.** Secondary folding pattern of miRNA-mRNA duplexes along with their predicted binding energy (RNAfold) and MFE scores (miRTarbase)

No.	Gene	miRNA	Dot-bracket image	Secondary structure of miRNA-mRNA duplex	Binding energy (kcal/mol)	MFE score (kcal/mol)
1	<i>PTEN</i>	miR-106a	(((((((((((.....)))))))))..))))))		-15.40	-14.3
2	<i>TGFBR2</i>	miR-21	(((((((((((.....)))))))))..))))))		-13.50	-16.2
3	<i>VEGFA</i>	miR-29b-2	..(((((((((((.....)))))))))..))))))		-11.10	-15

miRNA, microRNA; MFE, minimum free energy.



**Fig. 3.** Three dimensional binding modes of miR-106a and mRNA of *PTEN* gene (A), miR-21 and mRNA of *TGFBR2* gene (B), and miR-29b-2 and mRNA of *VEGFA* gene (C) are deciphered, respectively.

**Table 5.** Docking scores between miRNA and AGO protein

miRNA and AGO (PDB ID:3F73, chain A)	Score	Area	ACE
miR-106a-AGO	16,618	2,039.00	-455.23
miR-21-AGO	16,678	2,275.40	-374.62
miR-29b-2-AGO	19,222	2,942.20	-555.08

Score indicates the geometric shape complementary score and ACE score generated for each miRNA and AGO complex. miRNA, microRNA; AGO, argonaute; ACE, atomic contact energy.

feration, and other biological functions (Table 2, Fig. 1). Further, the conservation in binding pattern among selected miRNAs and mRNAs (Table 3) were studied through sequence similarity algorithm using Clustal Omega (<http://www.ebi.ac.uk/Tools/msa/clustalo/>) web server. The study revealed for the existence of quite less portion of conservation at sequence level among chosen 23 mRNAs and also in 15 miRNAs (Fig. 2), is not sufficient to throw light on binding patterns. Therefore, the binding affinity was evaluated between mRNA and miRNA at secondary structural level. Good MFE score suggested, the target genes *PTEN*, *TGFBR2*, and *VEGFA* are having a strong affinity towards miR-106a, miR-21, and miR-29b-2 (Table 3). Hence those genes and miRNAs were taken into consideration to study their interaction at molecular level.

### Study of binding affinity between miRNA-mRNA duplex

Duplex sequences between miR-106 and *PTEN*, miR-21 and *TGFBR2*, miR-29b-2 and *VEGFA* were extracted from miRTarbase web server and prediction of secondary folding pattern was performed in RNA fold. The secondary folding patterns along with their binding energy value are reported (Table 4). The predicted binding energy suggested for a high affinity among selected miRNA-mRNA duplexes. Predicted three dimensional models [63] of the duplex structures between miR-106 and *PTEN*, miR-21 and *TGFBR2*, miR-29b-2 and *VEGFA* also supported for strong molecular interaction between them.

### Structure preparation of AGO protein

The three-dimensional crystallized structure of AGO protein, with 685 amino acid residues was extracted from Protein Data bank (PDB ID: 3F73). The structure of AGO protein contains guide DNA and target RNA duplexes. All water molecules and ligands were removed from the structure. As, the AGO protein is a homo dimer, out of two chains, only chain 'A' of AGO protein was considered and refined before docking. The necessary correction in bond order and bond length of all atoms in the structure was performed using prepare protein and clean geometry protocol of Discovery Studio 3.5.

### Study of molecular interaction between miRNAs and AGO protein

The AGO protein is a key player in the formation of the RNA-induced silencing complex, a major component of

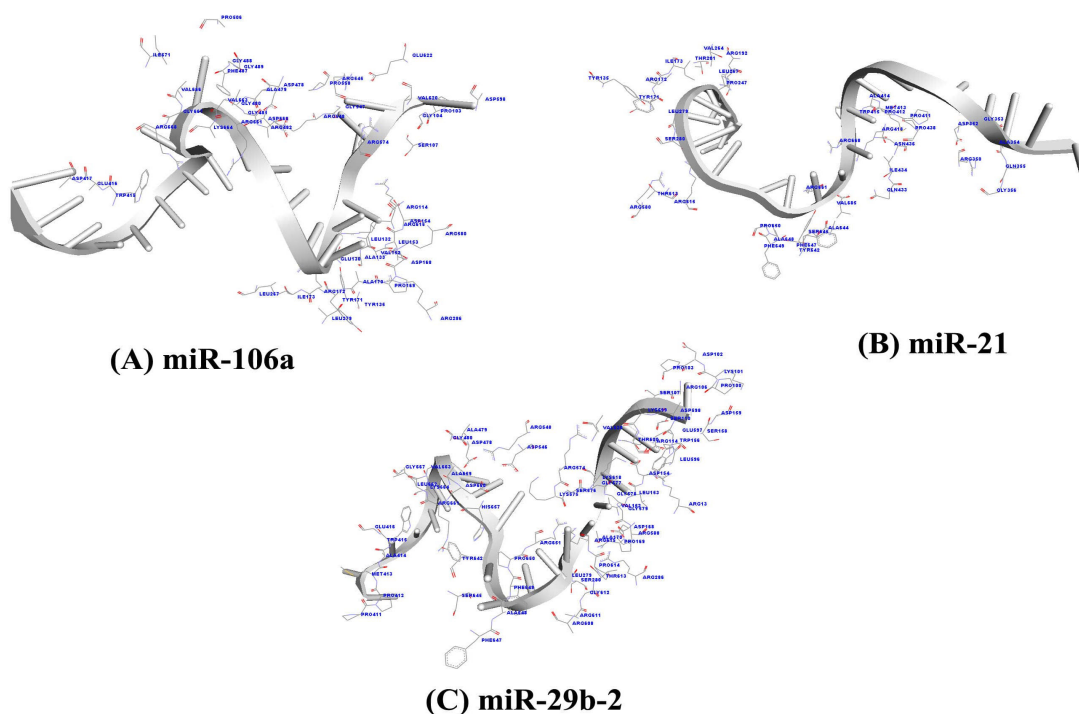
RNA interference. The three dimensional structures of miRNA-mRNA duplexes were prepared using RNA COMPOSER web server (Fig. 3). The first round of docking was performed between the miRNAs and AGO (PDB ID: 3F73, chain A) protein to inspect the binding affinity between the

**Table 6.** Amino acid residues of Argonaute protein participating in the interaction with miR-106a, miR-21, and miR-29b-2 within a distance of 3.5 Å

miRNA	Amino acid residues		
	Hydrophobic interactions <sup>a</sup>	With aromatic rings <sup>b</sup>	Hydrogen bonding <sup>c</sup>
miR-106a	LEU 132, ALA 133, VAL 152 <sup>d</sup> , LEU 153 <sup>d</sup> , ALA 170 <sup>d</sup> , ILE 173 <sup>d</sup> , LEU 267 <sup>d</sup> , LEU 279 <sup>e</sup> , ALA 479 <sup>d</sup> , VAL 620 <sup>d</sup> , VAL 663 <sup>d</sup> , VAL 666, ILE 671	TYR 135 <sup>d</sup> , TYR 171 <sup>d</sup> , TRP 415 <sup>e</sup> , PHE 487	SER 107, TYR 135, LEU 153, PRO 169, TYR 171, GLU 416, PHE 487, ARG 548 <sup>d</sup> , ARG 574 <sup>d</sup> , ASP 598 <sup>d</sup> , ARG 615 <sup>e</sup> , LYS 664 <sup>d</sup>
miR-21	ILE 173 <sup>d</sup> , VAL 264, LEU 267 <sup>d</sup> , LEU 279 <sup>e</sup> , ALA 354, ALA 414 <sup>d</sup> , ILE 434, ALA 644, ALA 648 <sup>d</sup> , VAL 685	TYR 135 <sup>d</sup> , TYR 171 <sup>d</sup> , TRP 415 <sup>e</sup> , TYR 642 <sup>d</sup> , PHE 647 <sup>d</sup> , PHE 649 <sup>d</sup>	ARG 172, ARG 192, THR 201, LEU 279, ARG 350, ALA 354, GLN 355, PRO 412 <sup>d</sup> , MET 413, TRP 415, ARG 418, ASN 436, ARG 615 <sup>e</sup> , ALA 644, PHE 649 <sup>d</sup> , ARG 661 <sup>d</sup> , ARG 668
miR-29b-2	VAL 152 <sup>d</sup> , LEU 153 <sup>d</sup> , ALA 170 <sup>d</sup> , LEU 279 <sup>e</sup> , ALA 414 <sup>d</sup> , ALA 479 <sup>d</sup> , LEU 596, VAL 620 <sup>d</sup> , ALA 648 <sup>d</sup> , LEU 652, ALA 659, LEU 662, VAL 663 <sup>d</sup>	TRP 156, TRP 415 <sup>e</sup> , TYR 642 <sup>d</sup> , PHE 647 <sup>d</sup> , PHE 649 <sup>d</sup>	ARG 13, LYS 101, ARG 114, VAL 152, ASP 159, ARG 286, PRO 412 <sup>d</sup> , ALA 414, ASP 478, ARG 548 <sup>d</sup> , ARG 574 <sup>d</sup> , LYS 575, ARG 580, GLU 597, ASP 598 <sup>d</sup> , ARG 611, ARG 615 <sup>e</sup> , ALA 648, PHE 649 <sup>d</sup> , ARG 651, HIS 657, ASP 660, ARG 661 <sup>d</sup> , LYS 664 <sup>d</sup>

miRNA, microRNA.

<sup>a</sup>Amino acid residues involved in hydrophobic interactions; <sup>b</sup>Amino acid residues with aromatic rings; <sup>c</sup>Amino acid residues participating in hydrogen bonding; <sup>d</sup>The amino acid residues of Argonaute protein commonly participated in more than one miRNA interaction; <sup>e</sup>The amino acid residues of Argonaute protein commonly participated in case of all miRNA interaction.



**Fig. 4.** Amino acid residues of Argonaute protein participating in interaction with miR-106a (A), miR-21 (B), and miR-29b-2 (C) within a distance of 3.5 Å are deciphered, respectively.

complexes. Out of 10 different poses resulted for docking complexes in Patch Dock server, the pose with highest geometrical shape complementary score [64] is considered as the best docked complex. The resulted geometrical shape complementary score and atomic contact energy scores are reported (Table 5), implicated a strong binding affinity between the miRNAs and AGO protein. The binding affinity between the AGO protein and miRNAs (miR-106a, miR-21, and miR-29b-2) is established through the observation of amino acids (miR-106a: LEU 132, ALA 133, VAL 152, LEU 153, ALA 170, ILE 173, LEU 267, LEU 279, ALA 479, VAL 620, VAL 663, VAL 666, and ILE 671; miR-21: ILE 173, VAL 264, LEU 267, LEU 279, ALA 354, ALA 414, ILE 434, ALA 644, ALA 648, and VAL 685; miR-29b-2: VAL 152, LEU 153, ALA 170, LEU 279, ALA 414, ALA 479, LEU 596, VAL 620, ALA 648, LEU 652, ALA 659, LEU 662, and VAL 663) which are strongly hydrophobic in nature and also amino acids with aromatic rings (miR-106a: TYR 135, TYR 171, TRP415, and PHE 487; miR-21: TYR 135, TYR 171, TRP 415, TYR 642, PHE 647, and PHE 649; miR-29b-2: TRP 156, TRP 415, TYR 642, PHE 647, and PHE649) within a distance of 3.5 Å (Table 6, Fig. 4). The presence of hydrogen bonding pattern during interaction (Table 7, Fig. 5) also supported the fact of AGO protein driven miRNA based gene regulation.

### Study of molecular interaction between AGO protein and miRNA-mRNA duplex

The second round docking was performed between AGO protein and miRNA-mRNA duplexes (miR-106 and *PTEN*; miR-21 and *TGFBR2*; and miR-29b-2 and *VEGFA*) separately in PatchDock web server, and scores are reported (Table 8). Amino acids which are strong hydrophobic in nature and amino acids with aromatic rings which are relatively hydrophobic generally contribute a lot towards the stability of binding during molecular interaction between two macro molecules. Hence the molecular interaction between miRNA-mRNA duplexes and AGO protein was studied by inspecting close amino acid residues of AGO protein within a distant of 3.5 Å. Strong hydrophobic amino acids of AGO like VAL 152, LEU 153, VAL 264, LEU 265, LEU 267, LEU 277, ALA 278, LEU 279, ALA 414, ILE 434, ALA 479, VAL 663, and VAL 685 in miR-106a and *PTEN* duplex; LEU 45, LEU 46, ALA 47, VAL 49, ALA 50, ALA 80, ILE 173, LEU 265, LEU 267, LEU 277, ALA 278, LEU 279, LEU 281, ALA 479, ALA 644, ALA 648, LEU 652, and VAL 663 in miR-21 and *TGFBR2* duplex; and ALA 80, LEU 132, VAL 152, LEU 153, ALA 170, ILE 173, VAL 264, ALA 479, VAL 606, ALA 644, ALA 648, VAL 663, and VAL 685 in miR-29b-2 and *VEGFA* duplex are observed within a distant of 3.5 Å. Similarly, amino acids like TYR 43, TRP 415, PHE 487, and TYR 642 in miR-106a and *PTEN* duplex; TYR 43, TRP 202,

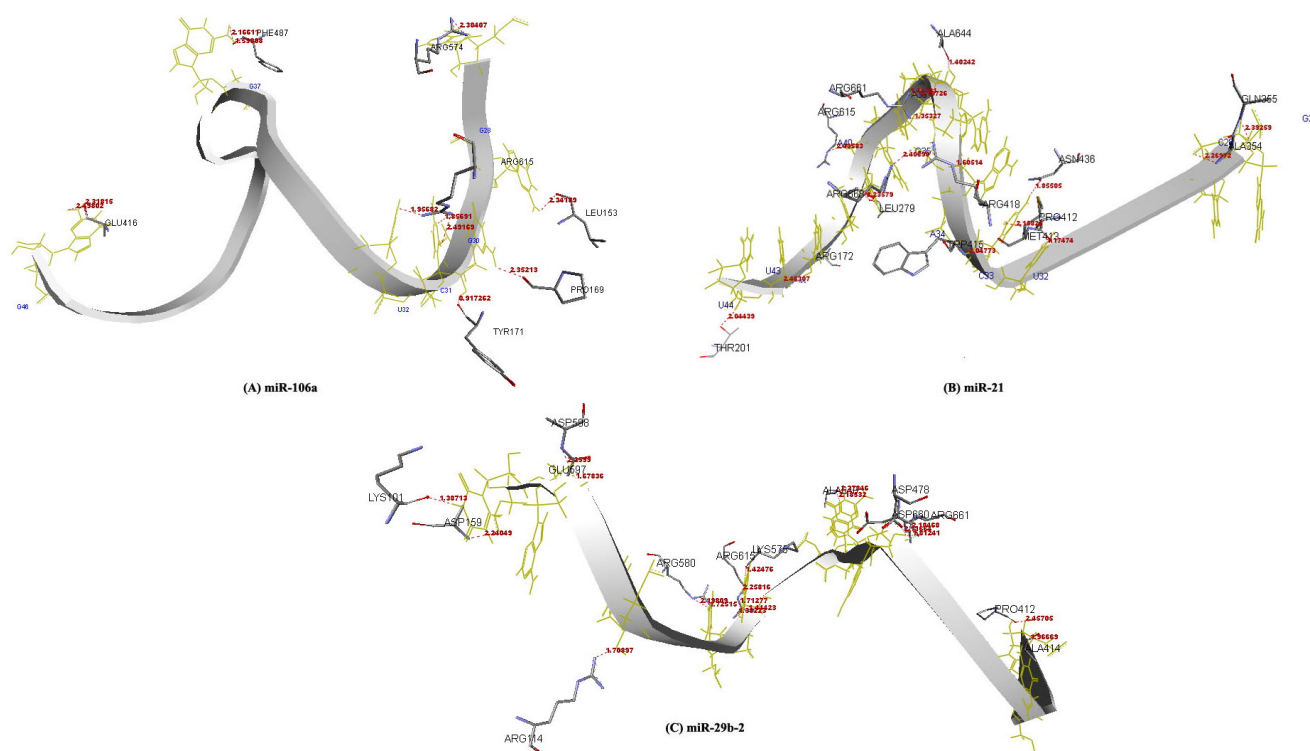
TRP 415, TYR 642, PHE 647, and PHE 649 in miR-21 and *TGFBR2* duplex; and TYR 43, TYR 86, TYR 135, TRP 415, TYR 171, TYR 642, PHE 647, and PHE 649 in miR-29b-2 and

**Table 7.** Amino acid residues of Argonaute protein participating in hydrogen bonding with miRNAs within a distance of 2.5 Å

miRNA	Residues	Atom	Distance		
miR-106a	LEU 153	O...H22 (G28)	2.34		
	PRO 169	O...H21 (G30)	2.35		
	TYR 171	O...HO2' (G30)	0.91		
	GLU 416	O...H21 (G46)	2.49		
		O...H22 (G46)	2.31		
	PHE 487	O...H21 (G37)	1.59		
		O...H22 (G37)	2.16		
	ARG 574	NH2...O4' (A26)	2.39		
	ARG 615	NH1...O2 (U32)	1.95		
		NH2...NO2 (C31)	2.49		
		NH2...N3 (C31)	1.85		
	miR-21	ARG 172	NH2...OP1 (U43)	2.46	
		THR 201	OG1...OP1 (U44)	2.04	
LEU 279		O...HO2' (A40)	2.23		
ALA 354		N...OP2 (C28)	2.26		
GLN355		N...O5' (G27)	2.39		
PRO 412		A...H3 (U32)	1.17		
MET 413		N...O2 (C33)	2.15		
TRP 415		N...O2 (C33)	2.04		
ARG 418		NE...O2' (A34)	1.60		
ASN 436		OD1...H42 (C33)	1.85		
ARG 615		NE...OP1 (A40)	2.48		
ALA 644		O...HO2' (A36)	1.40		
ARG 661		NH1...OP2 (A36)	1.35		
		NH2...OP1 (A36)	1.41		
miR-29b-2		ARG 668	NH2...O5' (A36)	2.19	
	LYS 101	NH2...OP1 (G35)	2.40		
		ARG 114	O...H3 (U22)	1.38	
		ASP 159	NH2...O2'(C25)	1.70	
		PRO 412	N...P(U22)	2.24	
		ALA 414	O...HO3' (U44)	2.45	
		ASP 478	O...H22 (G42)	1.96	
		LYS 575	OD2...HO2' (A35)	2.11	
		ARG 580	O...H62 (A29)	1.42	
			NE...O2 (C28)	2.19	
		GLU 597	NH2...O2 (C28)	1.72	
			N...OP1 (A23)	1.67	
			ASP 598	N...OP1 (A23)	2.25
			ARG 615	NE...N3 (A29)	2.25
				NE...N1 (A29)	2.25
NE...N3 (A29)	2.25				
NE...N7 (A29)	1.71				
NH1...N7 (A29)	1.44				
NH2...N7 (A29)	1.38				
ALA 648	N...O4 (U32)		2.18		
O...H1 (G33)	2.27				
ASP 660	O...HO2' (A35)	1.81			
ARG 661	N...O3' (A35)	2.18			

miRNA, microRNA.





**Fig. 5.** Amino acid residues of Argonaute protein participating in hydrogen bonding interaction with miR-106a (A), miR-21 (B), and miR-29b-2 (C) within a distance of 2.5 Å are deciphered, respectively.

**Table 8.** Docking scores between miRNAs-mRNA duplex and AGO protein

miRNA-mRNA and AGO (PDB ID:3F73, chain A)	Score	Area	ACE
miR-106a_PTEN-AGO	19,722	3,519.90	-408.36
miR-21_TGFB2-AGO	20,036	4,132.60	-863.02
miR-29b-2_VEGFA-AGO	24,310	3,927.40	-70.34

Score indicates the geometric shape complementary score and ACE means atomic contact energy score generated for each receptor and ligand complex.

miRNA, microRNA; AGO, argonaute; ACE, atomic contact energy.

VEGFA duplex, with aromatic ring are also found as participating in interaction within the binding pocket of AGO protein around distance of 3.5 Å (Table 9, Fig. 6).

## Discussion

The current study focused on *in silico* identification of genes and their regulation mediated through miRNAs, involved in seven types of solid tumors of colorectal, pancreatic, breast, stomach, lung, prostate, and bladder. miRNAs have a crucial role in gene silencing mechanism observed through the altered expression of certain miRNA molecules in case of neurodegenerative diseases such as

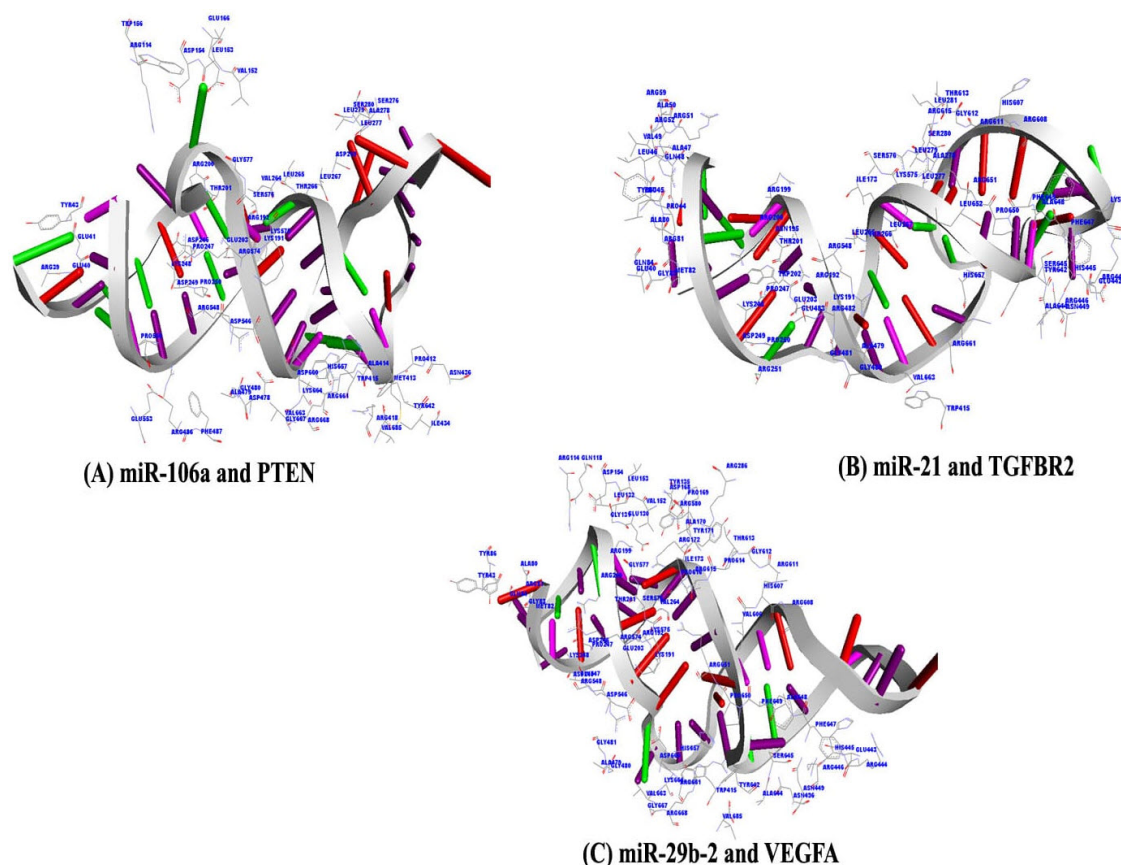
Alzheimer and Parkinson suggesting that the association between mRNA-miRNA-AGO, therefore not cancer specific [16, 65]. The association between mRNA-miRNA-AGO pattern has been reported [16, 65, 66] in RNA based gene silencing mechanism and their association at atomic level has already been studied in case of leukemia [25]. In this context, molecular association between AGO protein, miRNAs and mRNAs of target genes were studied and analyzed in case of seven types of solid tumor. Sixty-four genes and 23 miRNAs were collected from the literature (Supplementary Table 1), out of which 45 genes and seventeen miRNAs were selected on the basis of their expression pattern (Table 1). The affinity in binding modes between 15 miRNAs and 23 genes was verified, basing on the availability of MFE scores in miRTarbase web server (Supplementary Table 2). Further, different biological activities of selected genes were studied using UniProt database (<http://www.uniprot.org/>) to screen out important genes and their contribution towards seven types of solid tumors. The observation suggested three genes namely, PTEN, TGFB2, and VEGFA were involved in different biological activities like angiogenesis, apoptosis, cell cycle, and cell proliferation, are the major contributing factor in oncogenesis (Table 2). However, quite less sequence conservation was observed within the binding site of 23 target

**Table 9.** Amino acid residues of Argonaute protein participating during interaction with miRNA and mRNA duplex within a distance of 3.5 Å

miRNA-mRNA duplex	Amino acid residues	
	Hydrophobic interactions <sup>a</sup>	With aromatic rings <sup>b</sup>
miR-106a and PTEN	VAL 152 <sup>c</sup> , LEU 153 <sup>c</sup> , VAL 264 <sup>c</sup> , LEU 265 <sup>c</sup> , LEU 267 <sup>c</sup> , LEU 277 <sup>c</sup> , ALA 278 <sup>c</sup> , LEU 279 <sup>c</sup> , ALA 414, ILE 434, ALA 479 <sup>c</sup> , VAL 663 <sup>d</sup> , VAL 685 <sup>c</sup>	TYR 43 <sup>d</sup> , TRP 415 <sup>d</sup> , PHE 487, TYR 642 <sup>d</sup>
miR-21 and TGFBR2	LEU 45, LEU 46, ALA 47, VAL 49, ALA 50, ALA 80 <sup>c</sup> , ILE 173 <sup>c</sup> , LEU 265 <sup>c</sup> , LEU 267 <sup>c</sup> , LEU 277 <sup>c</sup> , ALA 278 <sup>c</sup> , LEU 279 <sup>c</sup> , LEU 281, ALA 479 <sup>c</sup> , ALA 644 <sup>c</sup> , ALA 648 <sup>c</sup> , LEU 652, VAL 663 <sup>d</sup>	TYR 43 <sup>d</sup> , TRP 202, TRP 415 <sup>d</sup> , TYR 642 <sup>d</sup> , PHE 647 <sup>c</sup> , PHE 649 <sup>c</sup>
miR-29b-2 and VEGFA	ALA 80 <sup>c</sup> , LEU 132, VAL 152 <sup>c</sup> , LEU 153 <sup>c</sup> , ALA 170, ILE 173, VAL 264 <sup>c</sup> , ALA 479, VAL 606, ALA 644 <sup>c</sup> , ALA 648 <sup>c</sup> , VAL 663 <sup>d</sup> , VAL 685 <sup>c</sup>	TYR 43 <sup>d</sup> , TYR 86, TYR 135, TRP 415 <sup>d</sup> , TYR 171, TYR 642 <sup>d</sup> , PHE 647 <sup>c</sup> , PHE 649 <sup>c</sup>

miRNA, microRNA.

<sup>a</sup>Amino acid residues involved in hydrophobic interactions; <sup>b</sup>Amino acid residues with aromatic rings; <sup>c</sup>The amino acid residues of Argonaute protein commonly participated in more than one miRNA-mRNA duplex interaction; <sup>d</sup>The amino acid residues of Argonaute protein commonly participated in case of all miRNA-mRNA duplex interaction.

**Fig. 6.** Amino acid residues of Argonaute protein participating in interaction with miR-106a and mRNA of *PTEN* gene (A), miR-21 and mRNA of *TGFBR2* gene (B), and miR-29b-2 and mRNA of *VEGFA* gene (C) within a distance of 3.5 Å are deciphered, respectively.

genes (Fig. 2A). But, quite well sequence similarity was observed between miR-106a, miR-17-5p, and miR-20a (Fig. 2B) suggesting for possibility of regulation of *PTEN* gene through these three miRNAs (Table 3), associated in causing

colorectal cancer. Again, a strong and energetically binding affinity was proved through good MFE scores -14.3 (kcal/mol), -16.2 (kcal/mol), and -15 (kcal/mol) for *PTEN* and miR-106a; *TGFBR2* and miR-21; and *VEGFA* and

miR-29b-2, respectively, suggested for appropriate miRNAs selection for *PTEN*, *TGFBR2*, and *VEGFA* genes (Table 3), supported by the predicted binding energy scores for miRNA-mRNA duplex structures (Table 4). Furthermore, to study the molecular basis of AGO protein driven miRNAs namely, miR-106a, miR-21, and miR-29b-2 having highest binding affinity towards their regulating genes namely, *PTEN*, *TGFBR2*, and *VEGFA* respectively, the molecular docking study was carried out. Generally, presence of amino acids with aliphatic group namely, alanine (ALA), valine (VAL), leucine (LEU), and isoleucine (ILE), are strongly hydrophobic in nature provides stability during molecular interaction between macro molecules, whereas amino acids namely, phenylalanine (PHE), tyrosine (TYR), tryptophan (TRP), are relatively hydrophobic in nature, but the presence of aromatic ring like structure provides a steadiness towards binding stability within the structural moiety of a protein. The observation of amino acids (miR-106a: LEU 132, ALA 133, VAL 152, LEU 153, ALA 170, ILE 173, LEU 267, LEU 279, ALA 479, VAL 620, VAL 663, VAL 666, and ILE 671; miR-21: ILE 173, VAL 264, LEU 267, LEU 279, ALA 354, ALA 414, ILE 434, ALA 644, ALA 648, and VAL 685; miR-29b-2: VAL 152, LEU 153, ALA 170, LEU 279, ALA 414, ALA 479, LEU 596, VAL 620, ALA 648, LEU 652, ALA 659, LEU 662, and VAL 663) which are strongly hydrophobic in nature and amino acids with aromatic rings (miR-106a: TYR 135, TYR 171, TRP 415, and PHE 487; miR-21: TYR 135, TYR 171, TRP 415, TYR 642, PHE 647, and PHE 649; miR-29b-2: TRP 156, TRP 415, TYR 642, PHE 647, and PHE649) during interaction within a distance of 3.5Å (Table 6, Fig. 4) recognized a strong molecular interaction between AGO protein and miR-106a, miR-21, and miR-29b-2. Again, weak interaction like hydrogen bonding has a major contribution to facilitate the stability of molecules during interaction at atomic level. Here, the amino acids like, LEU 153, PRO 169, TYR 171, GLU 416, PHE 487, ARG 574, and ARG 615; ARG 172, THR 201, LEU 279, ALA 354, GLN355, PRO 412, MET 413, TRP 415, ARG 418, ASN 436, ARG 615, ALA 644, ARG 661, and ARG 668; LYS 101, ARG 114, ASP 159, PRO 412, ALA 414, ASP 478, LYS 575, ARG 580, ARG 580, GLU 597, ASP 598, ARG 615, ALA 648, ASP 660, and ARG 661 are participated in hydrogen bonding interaction with miR-106a, miR-21, and miR-29b-2 respectively in the structural moiety of AGO protein within a distance of 2.5Å (Table 7, Fig. 5), strongly supports for binding stability during assistance of AGO protein for miRNA based gene regulation. Furthermore, presence of commonly participating strong hydrophobic amino acids namely, VAL 663 and amino acid with aromatic rings namely, TYR 43, TRP 415, and TYR 642 during molecular interaction of AGO protein with miR-106a and *PTEN*, miR-21 and *TGFBR2*, and miR-29b-2

and *VEGFA* duplex within a distance of 3.5Å (Table 9, Fig. 6). Although, the evidence at molecular association between mRNA-miRNA-AGO pattern have already been established computationally [16, 61] the current investigation recommending for AGO protein assistance in regulation of *PTEN*, *TGFBR2*, and *VEGFA* genes by miR-106a, miR-21, and miR-29b-2, respectively, associated in seven types of solid tumor. This report would be helpful in understanding miRNA-based gene silencing mechanisms in seven types of solid cancer like colorectal cancer, pancreatic cancer, breast cancer, stomach cancer, lung cancer, prostate cancer, and bladder cancer. Furthermore, extensive computational study may be carried out for better understanding the mechanism of miRNAs based gene regulation in solid cancer. This methodology would further help us to design suitable miRNAs against respective genes rationally, only after validation through laboratory experiments.

## Supplementary materials

Supplementary data including two tables can be found with this article online at <http://www.genominfo.org/src/sm/gni-14-112-s001.pdf>

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## References

1. Alison RM. *Encyclopedia of Life Sciences: Cancer*. London: Nature Publishing Group, 2001.
2. Lee YS, Dutta A. MicroRNAs in cancer. *Annu Rev Pathol* 2009;4:199-227.
3. Grammatikakis I, Gorospe M, Abdelmohsen K. Modulation of cancer traits by tumor suppressor microRNAs. *Int J Mol Sci* 2013;14:1822-1842.
4. Zhang B, Pan X, Cobb GP, Anderson TA. microRNAs as oncogenes and tumor suppressors. *Dev Biol* 2007;302:1-12.
5. Esquela-Kerscher A, Slack FJ. Oncomirs-microRNAs with a role in cancer. *Nat Rev Cancer* 2006;6:259-269.
6. Lu Z, Liu M, Stribinskis V, Klinge CM, Ramos KS, Colburn NH, *et al.* MicroRNA-21 promotes cell transformation by targeting the programmed cell death 4 gene. *Oncogene* 2008;27:4373-4379.
7. Xu LF, Wu ZP, Chen Y, Zhu QS, Hamidi S, Navab R.

- MicroRNA-21 (miR-21) regulates cellular proliferation, invasion, migration, and apoptosis by targeting PTEN, RECK and Bcl-2 in lung squamous carcinoma, Gejiu City, China. *PLoS One* 2014;9:e103698.
8. Wang P, Zou F, Zhang X, Li H, Dulak A, Tomko RJ Jr, *et al.* microRNA-21 negatively regulates Cdc25A and cell cycle progression in colon cancer cells. *Cancer Res* 2009;69:8157-8165.
  9. Gong AY, Eischeid AN, Xiao J, Zhao J, Chen D, Wang ZY, *et al.* miR-17-5p targets the p300/CBP-associated factor and modulates androgen receptor transcriptional activity in cultured prostate cancer cells. *BMC Cancer* 2012;12:492.
  10. Fang L, Li H, Wang L, Hu J, Jin T, Wang J, *et al.* MicroRNA-17-5p promotes chemotherapeutic drug resistance and tumour metastasis of colorectal cancer by repressing PTEN expression. *Oncotarget* 2014;5:2974-2987.
  11. Yamada N, Kitamoto S, Yokoyama S, Hamada T, Goto M, Tsutsumida H, *et al.* Epigenetic regulation of mucin genes in human cancers. *Clin Epigenetics* 2011;2:85-96.
  12. Nagpal N, Kulshreshtha R. miR-191: an emerging player in disease biology. *Front Genet* 2014;5:99.
  13. Wang H, Guan X, Tu Y, Zheng S, Long J, Li S, *et al.* MicroRNA-29b attenuates non-small cell lung cancer metastasis by targeting matrix metalloproteinase 2 and PTEN. *J Exp Clin Cancer Res* 2015;34:59.
  14. Liu H, Wang B, Lin J, Zhao L. microRNA-29b: an emerging player in human cancer. *Asian Pac J Cancer Prev* 2014;15:9059-9064.
  15. Ru P, Steele R, Newhall P, Phillips NJ, Toth K, Ray RB. miRNA-29b suppresses prostate cancer metastasis by regulating epithelial-mesenchymal transition signaling. *Mol Cancer Ther* 2012;11:1166-1173.
  16. Wang Y, Li Y, Ma Z, Yang W, Ai C. Mechanism of microRNA-target interaction: molecular dynamics simulations and thermodynamics analysis. *PLoS Comput Biol* 2010;6:e1000866.
  17. Gong J, Li J, Wang Y, Liu C, Jia H, Jiang C, *et al.* Characterization of microRNA-29 family expression and investigation of their mechanistic roles in gastric cancer. *Carcinogenesis* 2014;35:497-506.
  18. Wu LH, Cai QQ, Dong YW, Wang R, He BM, Qi B, *et al.* Decoy oligonucleotide rescues IGF1R expression from microRNA-223 suppression. *PLoS One* 2013;8:e82167.
  19. Schickel R, Boyerinas B, Park SM, Peter ME. MicroRNAs: key players in the immune system, differentiation, tumorigenesis and cell death. *Oncogene* 2008;27:5959-5974.
  20. Yin Y, Li J, Chen S, Zhou T, Si J. MicroRNAs as diagnostic biomarkers in gastric cancer. *Int J Mol Sci* 2012;13:12544-12555.
  21. Ding G, Huang G, Liu HD, Liang HX, Ni YF, Ding ZH, *et al.* MiR-199a suppresses the hypoxia-induced proliferation of non-small cell lung cancer cells through targeting HIF1  $\alpha$ . *Mol Cell Biochem* 2013;384:173-180.
  22. Zhang Y, Fan KJ, Sun Q, Chen AZ, Shen WL, Zhao ZH, *et al.* Functional screening for miRNAs targeting Smad4 identified miR-199a as a negative regulator of TGF- $\beta$  signalling pathway. *Nucleic Acids Res* 2012;40:9286-9297.
  23. Zhu X, Li H, Long L, Hui L, Chen H, Wang X, *et al.* miR-126 enhances the sensitivity of non-small cell lung cancer cells to anticancer agents by targeting vascular endothelial growth factor A. *Acta Biochim Biophys Sin (Shanghai)* 2012;44:519-526.
  24. Zhou Y, Feng X, Liu YL, Ye SC, Wang H, Tan WK, *et al.* Down-regulation of miR-126 is associated with colorectal cancer cells proliferation, migration and invasion by targeting IRS-1 via the AKT and ERK1/2 signaling pathways. *PLoS One* 2013;8:e81203.
  25. Liao YL, Tsai KW, Lin WC. miRNAs in gastric cancer. Rijeka: INTECH Open Access Publisher, 2011.
  26. Jia AY, Castillo-Martin M, Bonal DM, Sánchez-Carbayo M, Silva JM, Cordon-Cardo C. MicroRNA-126 inhibits invasion in bladder cancer via regulation of ADAM9. *Br J Cancer* 2014;110:2945-2954.
  27. Liu X, Sempere LF, Ouyang H, Memoli VA, Andrew AS, Luo Y, *et al.* MicroRNA-31 functions as an oncogenic microRNA in mouse and human lung cancer cells by repressing specific tumor suppressors. *J Clin Invest* 2010;120:1298-1309.
  28. Zhang Q, Padi SK, Tindall DJ, Guo B. Polycomb protein EZH2 suppresses apoptosis by silencing the proapoptotic miR-31. *Cell Death Dis* 2014;5:e1486.
  29. Lin SL, Chiang A, Chang D, Ying SY. Loss of miR-146a function in hormone-refractory prostate cancer. *RNA* 2008;14:417-424.
  30. Labbaye C, Testa U. The emerging role of miR-146A in the control of hematopoiesis, immune function and cancer. *J Hematol Oncol* 2012;5:13.
  31. Zhang CM, Zhao J, Deng HY. MiR-155 promotes proliferation of human breast cancer MCF-7 cells through targeting tumor protein 53-induced nuclear protein 1. *J Biomed Sci* 2013;20:79.
  32. Liu J, Huang W, Yang H, Luo Y. Expression and function of miR-155 in breast cancer. *Biotechnol Biotechnol Equip* 2015; 29:840-843.
  33. Mansueto G, Forzati F, Ferraro A, Pallante P, Bianco M, Esposito F, *et al.* Identification of a new pathway for tumor progression: microRNA-181b up-regulation and CBX7 down-regulation by HMGA1 protein. *Genes Cancer* 2010;1:210-224.
  34. Iliopoulos D, Jaeger SA, Hirsch HA, Bulyk ML, Struhl K. STAT3 activation of miR-21 and miR-181b-1 via PTEN and CYLD are part of the epigenetic switch linking inflammation to cancer. *Mol Cell* 2010;39:493-506.
  35. Aslam MI, Patel M, Singh B, Jameson JS, Pringle JH. MicroRNA manipulation in colorectal cancer cells: from laboratory to clinical application. *J Transl Med* 2012;10:128.
  36. Lee KH, Lotterman C, Karikari C, Omura N, Feldmann G, Habbe N, *et al.* Epigenetic silencing of microRNA miR-107 regulates cyclin-dependent kinase 6 expression in pancreatic cancer. *Pancreatol* 2009;9:293-301.
  37. Ambs S, Prueitt RL, Yi M, Hudson RS, Howe TM, Petrocca F, *et al.* Genomic profiling of microRNA and messenger RNA reveals deregulated microRNA expression in prostate cancer. *Cancer Res* 2008;68:6162-6170.
  38. Wu W, Yang J, Feng X, Wang H, Ye S, Yang P, *et al.* MicroRNA-32 (miR-32) regulates phosphatase and tensin homologue (PTEN) expression and promotes growth, migration, and invasion in colorectal carcinoma cells. *Mol Cancer* 2013;12:30.
  39. Zhang XJ, Ye H, Zeng CW, He B, Zhang H, Chen YQ. Dysregulation of miR-15a and miR-214 in human pancreatic cancer. *J Hematol Oncol* 2010;3:46.
  40. Azrak SS, Ginel-Picardo A, Drosten M, Barbacid M, Santos E.

- Reversible, interrelated mRNA and miRNA expression patterns in the transcriptome of Rasless fibroblasts: functional and mechanistic implications. *BMC Genomics* 2013;14:731.
41. Feng B, Dong TT, Wang LL, Zhou HM, Zhao HC, Dong F, et al. Colorectal cancer migration and invasion initiated by microRNA-106a. *PLoS One* 2012;7:e43452.
  42. Li XM, Wang AM, Zhang J, Yi H. Down-regulation of miR-126 expression in colorectal cancer and its clinical significance. *Med Oncol* 2011;28:1054-1057.
  43. Yu J, Ohuchida K, Mizumoto K, Fujita H, Nakata K, Tanaka M. MicroRNA miR-17-5p is overexpressed in pancreatic cancer, associated with a poor prognosis, and involved in cancer cell proliferation and invasion. *Cancer Biol Ther* 2010;10:748-757.
  44. Wu W, Yang P, Feng X, Wang H, Qiu Y, Tian T, et al. The relationship between and clinical significance of microRNA-32 and phosphatase and tensin homologue expression in colorectal cancer. *Genes Chromosomes Cancer* 2013;52:1133-1140.
  45. Qin S, Zhu Y, Ai F, Li Y, Bai B, Yao W, et al. MicroRNA-191 correlates with poor prognosis of colorectal carcinoma and plays multiple roles by targeting tissue inhibitor of metalloprotease 3. *Neoplasia* 2014;61:27-34.
  46. Volinia S, Calin GA, Liu CG, Ambs S, Cimmino A, Petrocca F, et al. A microRNA expression signature of human solid tumors defines cancer gene targets. *Proc Natl Acad Sci U S A* 2006;103:2257-2261.
  47. Schaefer A, Jung M, Mollenkopf HJ, Wagner I, Stephan C, Jentzmik F, et al. Diagnostic and prognostic implications of microRNA profiling in prostate carcinoma. *Int J Cancer* 2010;126:1166-1176.
  48. Baffa R, Fassan M, Volinia S, O'Hara B, Liu CG, Palazzo JP, et al. MicroRNA expression profiling of human metastatic cancers identifies cancer gene targets. *J Pathol* 2009;219:214-221.
  49. Bhaumik D, Scott GK, Schokrpur S, Patil CK, Campisi J, Benz CC. Expression of microRNA-146 suppresses NF-kappaB activity with reduction of metastatic potential in breast cancer cells. *Oncogene* 2008;27:5643-5647.
  50. Zhu N, Zhang D, Xie H, Zhou Z, Chen H, Hu T, et al. Endothelial-specific intron-derived miR-126 is down-regulated in human breast cancer and targets both VEGFA and PIK3R2. *Mol Cell Biochem* 2011;351:157-164.
  51. Liu K, Li G, Fan C, Diao Y, Wu B, Li J. Increased expression of microRNA-221 in gastric cancer and its clinical significance. *J Int Med Res* 2012;40:467-474.
  52. Li X, Zhang Y, Zhang H, Liu X, Gong T, Li M, et al. miRNA-223 promotes gastric cancer invasion and metastasis by targeting tumor suppressor EPB41L3. *Mol Cancer Res* 2011;9:824-833.
  53. Li ZW, Yang YM, Du LT, Dong Z, Wang LL, Zhang X, et al. Overexpression of miR-223 correlates with tumor metastasis and poor prognosis in patients with colorectal cancer. *Med Oncol* 2014;31:256.
  54. Yabushita S, Fukamachi K, Tanaka H, Sumida K, Deguchi Y, Sukata T, et al. Circulating microRNAs in serum of human K-ras oncogene transgenic rats with pancreatic ductal adenocarcinomas. *Pancreas* 2012;41:1013-1018.
  55. Wang Y, Yu Y, Tsuyada A, Ren X, Wu X, Stubblefield K, et al. Transforming growth factor- $\beta$  regulates the sphere-initiating stem cell-like feature in breast cancer through miRNA-181 and ATM. *Oncogene* 2011;30:1470-1480.
  56. Li Y, Vandenboom TG 2nd, Wang Z, Kong D, Ali S, Philip PA, et al. miR-146a suppresses invasion of pancreatic cancer cells. *Cancer Res* 2010;70:1486-1495.
  57. Sun Q, Zhao X, Liu X, Wang Y, Huang J, Jiang B, et al. miR-146a functions as a tumor suppressor in prostate cancer by targeting Rac1. *Prostate* 2014;74:1613-1621.
  58. Li BS, Zuo QF, Zhao YL, Xiao B, Zhuang Y, Mao XH, et al. MicroRNA-25 promotes gastric cancer migration, invasion and proliferation by directly targeting transducer of ERBB2, 1 and correlates with poor survival. *Oncogene* 2015;34:2556-2565.
  59. Hamano R, Ishii H, Miyata H, Doki Y, Mori M. Role of microRNAs in solid tumors. *J Nucleic Acids Investig* 2011;2:e2.
  60. Hutvagner G, Simard MJ. Argonaute proteins: key players in RNA silencing. *Nat Rev Mol Cell Biol* 2008;9:22-32.
  61. Das RP, Konkimalla VB, Rath SN, Hansa J, Jagdeb M. Elucidation of the molecular interaction between miRNAs and the HOXA9 gene, involved in acute myeloid leukemia, by the assistance of Argonaute protein through a computational approach. *Genomics Inform* 2015;13:45-52.
  62. Mascellani N, Tagliavini L, Gamberoni G, Rossi S, Marchesini J, Taccioli C, et al. Using miRNA expression data for the study of human cancer. *Minerva Biotechnol* 2008;20:23-30.
  63. Popenda M, Szachniuk M, Antczak M, Purzycka KJ, Lukasiak P, Bartol N, et al. Automated 3D structure composition for large RNAs. *Nucleic Acids Res* 2012;40:e112.
  64. Schneidman-Duhovny D, Inbar Y, Nussinov R, Wolfson HJ. PatchDock and SymmDock: servers for rigid and symmetric docking. *Nucleic Acids Res* 2005;33:W363-W367.
  65. Junn E, Mouradian MM. MicroRNAs in neurodegenerative diseases and their therapeutic potential. *Pharmacol Ther* 2012;133:142-150.
  66. Chi SW, Zang JB, Mele A, Darnell RB. Argonaute HITS-CLIP decodes microRNA-mRNA interaction maps. *Nature* 2009;460:479-486.