

Novel Bioinformatics Approaches for MicroRNA Detection and Target Prediction

by

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To amma, appa and panni

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Chapter 1

Introduction

The draft human genome sequence assembly in 2001 was a landmark achievement in the field of genomics (Lander et al. 2001; Venter et al. 2001), paving the way for sequencing of nearly a hundred eukaryotic organisms (Liolios et al. 2008). Improvement in sequencing technology has steadily been lowering costs and turnaround times for access to vast amounts of data. The wealth of information that is being “mined” from this data through sophisticated tools has helped further our knowledge in biology and disease. Comparative genomics, benefiting from the data, has been making strides alongside, which has aided our understanding of genetic variation and evolution. Eventually, scientists aim to define features and gene expression control mechanisms that lend uniqueness not only at the tissue level but also at the level of an organism. Though many new regulatory elements have been characterized at both the DNA and RNA level, it is the harmonious action and interaction of all these elements that hold the key to understanding the emergent properties. The “-omics” revolution in different areas of biology is centered upon large-scale analysis of data mostly through computational approaches followed by experimental validation of models and predictions that are generated. Study of gene regulation has also seen such combinatorial approaches being adopted to elucidate elements and explain mechanisms involved. In this thesis we focus

on aspects related to one subset of eukaryotic gene regulation mechanisms, namely, post-transcriptional regulation mediated by microRNAs (miRNAs).

Broadly, the two main areas of contribution by this body of work relate to the detection of miRNAs using microarrays and to prediction of miRNA targets. Novel approaches for microarray probe design and for identification of regulatory elements specific to miRNAs followed by experimental validations for our predictions are described. In this chapter concepts related to these areas are introduced and a brief overview of challenges faced is presented.

1.1 Post-transcriptional gene regulation

Regulation of gene expression is a complex process that requires the coordination of multiple factors at several different steps (Orphanides and Reinberg 2002). Control begins with the organization of genetic material at the chromatin level which regulates access for DNA transcription (Richards and Elgin 2002). Transcriptional regulation is a highly regulated step that involves sequence and protein elements (Sperling 2007). Following RNA polymerase transcription of DNA, transcripts are further subjected to various processes like capping, editing, polyadenylation and regulation by non-coding RNAs before they are finally turned over (Moore 2005). Genome-wide studies of these post-transcriptional gene regulation mechanisms revealed their importance in cellular processes (Halbeisen et al. 2008).

One highly conserved mechanism of post-transcriptional gene regulation is RNA interference (RNAi), which causes gene silencing mediated by double-stranded RNA (dsRNA) (Cerutti and Casas-Mollano 2006). The term was first coined when repression

mediated by dsRNA was characterized in the nematode worm, *Caenorhabditis elegans* (*C. elegans*) (Fire et al. 1998). The most well-studied mechanism of mRNA degradation through a complex protein machinery is that by small-interfering RNA (siRNA) (Hannon and Rossi 2004). This species of RNA and the associated RNAi machinery has been investigated in several eukaryotic systems, making it an excellent tool for functional genetic studies (Elbashir et al. 2001) and also for therapeutics (Zimmermann et al. 2006). Though usually exogenous, many endogenous siRNAs like small scan-RNAs (scnRNAs), trans-acting siRNAs (tasi-RNAs) and repeat-associated siRNAs (rasiRNAs) have been discovered in other organisms (Kim 2005). In addition to siRNAs, other endogenous small RNAs like miRNAs and Piwi-interacting RNAs (piRNAs) share the RNAi machinery for transcriptional silencing, mRNA degradation or translational repression (Farazi et al. 2008).

1.2 Introduction to microRNAs

MicroRNAs (miRNAs) are 21-23 nucleotide (nt) long post-transcriptional regulators of gene expression many of which are conserved across metazoans (Bartel 2004). The first miRNA, *lin-4*, was discovered by genetics analysis in *C. elegans*, where it was found to negatively regulate protein levels of LIN-14 (Lee et al. 1993; Wightman et al. 1993). The term ‘microRNA’ was first coined in 2001 when tens of small RNAs with regulatory potential were discovered in *C. elegans* (Lau et al. 2001; Lee and Ambros 2001). A term search for ‘microRNAs’ on PubMed emphasizes the increasing interest and impact it has had (**Fig. 1.1**). At present there are over 8000 miRNAs that have been identified in over 30 different species through experimental and computational approaches (Griffiths-Jones

et al. 2008). Through diverse experimental approaches their prevalence has been brought to light not only in plants and animals but also in a unicellular alga (Zhao et al. 2007).

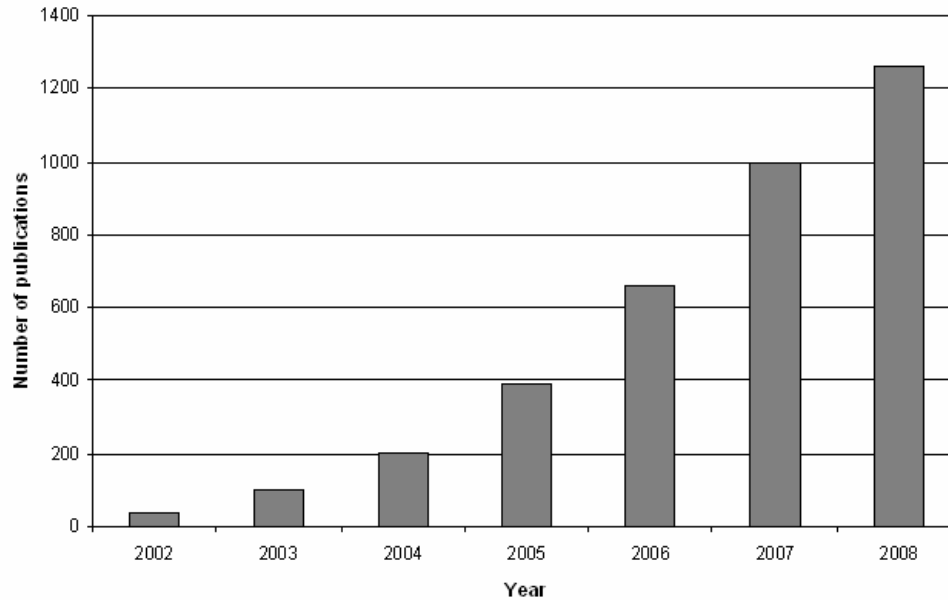


Figure 1.1 Trend showing increase in microRNA research since 2001

Their functions are diverse ranging from development control to apoptosis to involvement in disease like cancer (Kloosterman and Plasterk 2006; Bushati and Cohen 2007; Croce 2008). With an estimated 3% of human miRNAs each targeting hundreds of mRNAs their significance in post-transcriptional gene regulation is unmistakably large (Bartel 2004; Engels and Hutvagner 2006).

1.2.1 MicroRNA biogenesis

The mature form of a miRNA is generated through a multi-step process (Kim 2005). miRNA genes are first transcribed from genomic loci either as independent units or as

part of introns of other protein-coding genes (Du and Zamore 2005), and like mRNAs, they contain a 5'-cap structure and a poly-A tail (Bracht et al. 2004; Cai et al. 2004). This primary transcript (called pri-miRNA) exists in a hairpin conformation ~200nt long (**Fig. 1.2**), which is further processed by enzymes downstream.

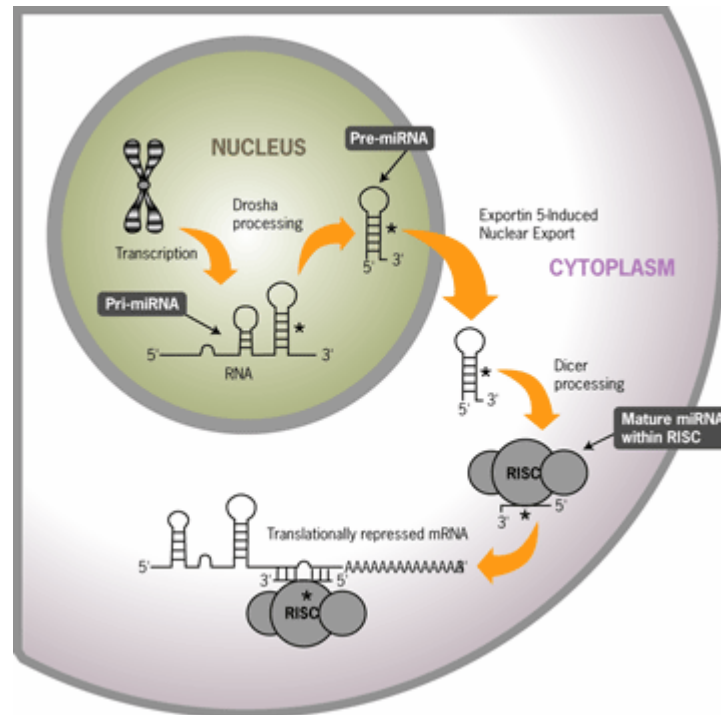


Figure 1.2 MicroRNA biogenesis (Source – <http://www.ambion.com>)

Drosha, an endoribonuclease belonging to the RNase III family, cleaves the pri-miRNA to form the precursor miRNA (pre-miRNA) molecule (Peters and Meister 2007). The enzyme Exportin-5 mediates the transport of pre-miRNA to the cytoplasm (Yi et al. 2003; Lund et al. 2004). Precursor miRNAs are then processed in the cytoplasm by the enzyme Dicer, which cleaves the hairpin loop to produce miRNA duplexes (Bernstein et al. 2001). In most cases only one of the strands in the duplex functions as a mature miRNA. This is decided by the thermodynamic stability of the ends of the duplex (Khvorova et al. 2003).

1.2.2 Mechanisms of miRNA-mediated repression

The mature strand of the miRNA is incorporated into a complex of ribonucleotide proteins (RNPs) to form the miRNP, also called the miRNA-induced silencing complex (miRISC). The primary proteins in this complex are members of the Argonaute (AGO) family, each of which possesses repressive capabilities. Mammals have four AGO proteins (AGO1-AGO4) of which only AGO2 has the potential to cleave target sequences due to its RNaseH-like domain (Peters and Meister 2007). The mature miRNA is used as a guide in the miRNP to recognize its target mRNA, to which it may be complementary with different degrees. In plants, miRNAs exhibit a near-perfect match to targets, thereby triggering an RNAi-like mechanism that results in cleavage of target mRNAs (**Fig. 1.3**), one of the modes of miRNA-mediated regulation (Jones-Rhoades et al. 2006). In animals, however, there is imperfect complementarity between a miRNA-target pair leading to several alternative mechanisms of repression (Filipowicz et al. 2008).

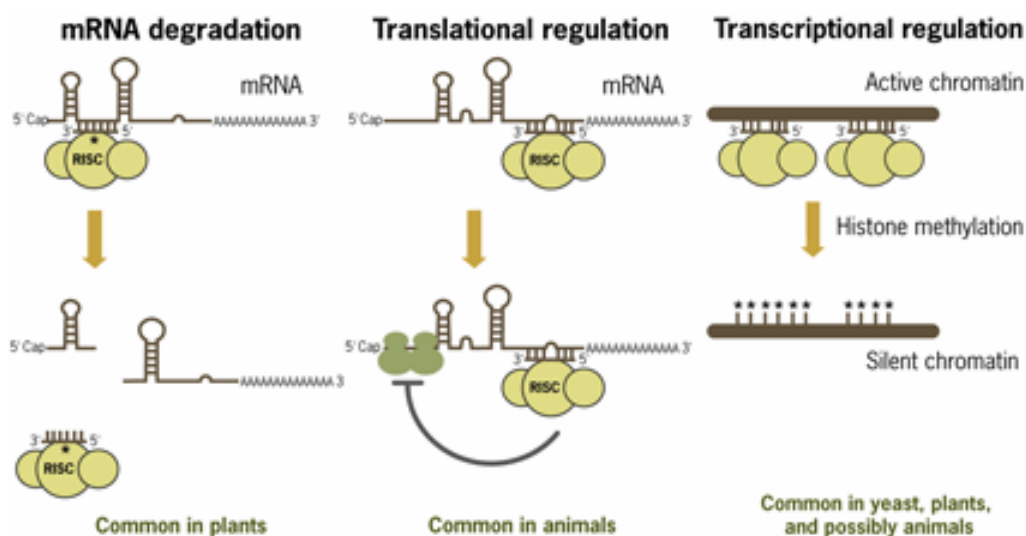


Figure 1.3 Mechanisms of miRNA-mediated post-transcriptional regulation (Source – www.ambion.com)

Majority of animal miRNA targets are regulated by repressing protein translation either at the initiation stage (Humphreys et al. 2005; Pillai et al. 2005) or during the elongation phase (Nottrott et al. 2006; Petersen et al. 2006). There is also recent evidence to show that mRNA destabilization occurs in certain cases (Bagga et al. 2005; Giraldez et al. 2006). Reconciliation of these mechanisms or at least understanding the context in which each mechanism predominates is an area of active work. One report shows promoter dependency for different translation repression mechanisms (Kong et al. 2008).

1.3 Nearest-neighbour thermodynamics

Much of the subject matter dealt in this thesis, especially microarray probe design tailored to miRNAs, employs a thermodynamic component based on the nearest-neighbour model. The approaches described in our work rely on nearest-neighbour thermodynamic quantities to assess the outcomes from our predictions, so a fair introduction to this topic will lay a foundation for rest of the chapters in this thesis.

Thermodynamic quantities have long been used to understand spontaneity of processes and one such is the change in Gibbs free energy. Conceptually, it is the amount of useful work that can be done by a system or the amount of work that must be done on a system for the process to take place (Haynie 2001). By this definition a negative change in free energy indicates spontaneity. Mathematically, the change in free energy at constant pressure and temperature is defined as

$$\Delta G = \Delta H - T\Delta S$$

where ΔH is the change in enthalpy, T is the absolute temperature and ΔS is the change in entropy.

An important application of free energy change is in the study of thermodynamics of nucleic acid base-pairing. Although thermodynamic measurements can be made for a sequence-pair of interest, it is not conceivable to record these values for every possible one comprised of Watson-Crick (WC) base-pairs, mismatches and other modified nucleotides. Clearly, a theoretical approximation that could predict these quantities for sequences that have not been studied would be very valuable. It is well understood that stability of base-pairing comes is correlated with the GC content of the nucleic-acid sequence. However, the largest contribution to helix stability comes from vertical stacking of bases in a sequence-dependent manner (Devoe and Tinoco 1962). These short-range interactions are useful to study the thermodynamic properties of a sequence as a function of its structure. The nearest-neighbour model assumes that the thermodynamic parameters of a given base-pair only depend on the adjacent pair and that the stability of helix formation may be approximated by pairwise addition of these nearest-neighbour parameters (Turner 1996; SantaLucia 1998).

Oligonucleotides and polymer duplex sequences have been used to estimate free energy and enthalpy changes by studying the ‘melting’ of these sequences assuming a two-state cooperative process (Borer et al. 1974). The procedure is repeated for many known sequences to derive the individual nearest-neighbour contributions to overall stability. Contributions by adjacent WC base-pairs have been studied and compiled by several groups for both the DNA (SantaLucia et al. 1996; SantaLucia 1998) and RNA backbones (Uhlenbeck et al. 1973; Borer et al. 1974; Breslauer et al. 1986; Freier et al.

1986). Apart from WC base-pairs, parameters for dangling ends, internal mismatches and loops have since been compiled (SantaLucia and Hicks 2004).

The change in free energy or in enthalpy for an unknown sequence may be calculated using the following equation,

$$\Delta G^{\circ}_{37(total)} = \Delta G^{\circ}_{37 initiation} + \Delta G^{\circ}_{37 symmetry} + \Sigma \Delta G^{\circ}_{37 stack} + \Delta G^{\circ}_{37 AT terminal}$$

where $\Delta G^{\circ}_{37 initiation}$ is the parameter for duplex initiation, $\Delta G^{\circ}_{37 symmetry}$ is the symmetry penalty for self-complementary sequences, $\Sigma \Delta G^{\circ}_{37 stack}$ is the sum of individual nearest-neighbour contributions from tabulated data and $\Delta G^{\circ}_{37 AT terminal}$ is the penalty for a terminal AT nearest-neighbour. The magnitude of negative free energy change thus calculated provides an indication of the strength of base-pairing. This formula is also applied to calculate the total changes in enthalpy and entropy. The melting temperature (T_m), defined as the temperature at which 50% of the oligonucleotide molecules are single stranded, is then given by

$$T_m = \Delta H^{\circ} \times 1000 / (\Delta S^{\circ} + R \times \ln(C_T / x)) - 273.15$$

where ΔH° (kcal/mol) and ΔS° (entropy units) are the changes in standard enthalpy and entropy, R is the gas constant (1.9872 cal/K-mol), C_T is the total molar strand concentration and x equals 4 for nonself-complementary duplexes and 1 for self-complementary duplexes.

Applications of nearest-neighbour thermodynamics to nucleic acid base-pairing exist in secondary structure prediction, primer design and microarray probe design among others. A quantum mechanical or a statistical mechanical treatment of thermodynamic quantities can provide an understanding of the molecular interactions involved when

base-pairing occurs, but the idea is to be able to predict if a given process can occur spontaneously, which the free energy change in the classical sense using the nearest-neighbour model adequately does.

A phenomenon that is common to miRNA expression detection and miRNA target recognition is nucleic-acid hybridization. In the case of miRNA detection, a nucleotide probe or primer is designed to efficiently pair with the miRNA sequence intended to be captured. Similarly, irrespective of the degree of complementarity between a miRNA and target sequence, this process is at least partly responsible for miRNA action. In this thesis, we use tools that employ nearest-neighbour parameters to assess the spontaneity of these processes.

1.4 Problem Statement

Understanding the mechanisms of miRNA-mediated post-transcriptional gene regulation is critical to learning how disease phenotypes are manifested because of dysfunctional regulation and being able to develop therapeutic solutions. Even before we can begin to understand mechanistic implications, the ability to accurately profile miRNA expression and the ability to predict which genes they target, be it in different tissues or in normal and disease states, will bring us closer to this goal.

We developed methods to generate high-confidence predictions in both these respects. We provide an overview of the current approaches and challenges for both miRNA expression profiling and target prediction, which are motivations for this thesis.

1.4.1 Detection of miRNA expression

Being able to determine expression patterns of all miRNAs in different tissues can help us better understand their roles in development and gene regulation. The first described method for miRNA expression detection used a northern blot procedure (Lee et al. 1993). Although this gel-based method can convincingly determine the length of the hybridizing sequence and is fairly sensitive the biggest disadvantage is the amount of time consumed by this technique. This makes it unsuitable for profiling the expression of hundreds of miRNAs simultaneously. Even though quantitative RT-PCR (qRT-PCR) offers a highly sensitive method (Fulci et al. 2007), the lack of parallelism is evident.

Expanding an earlier cloning and sequencing study (Lagos-Quintana et al. 2002) across tens of different tissues and various cell-lines has produced very comprehensive datasets that can be visualized to study miRNA expression (Landgraf et al. 2007); however it has its shortcomings too (Lim and Linsley 2007). A high-throughput alternative to the aforementioned techniques is a microarray. The use of microarray technology was pioneered by Schena et al. to study the expression of a set of *Arabidopsis thaliana* (*A. thaliana*) genes on a complementary DNA microarray (Schena et al. 1995) and the first global gene expression study followed two years later (DeRisi et al. 1997). Since then microarrays have been used for both genomic and transcriptomic analysis, and have also been adopted to study the expression of miRNAs (Nelson et al. 2004; Thomson et al. 2004). Not only have they been used to profile expression in different tissue types (Babak et al. 2004; Liu et al. 2004) but also in studying their impact on mRNA repression and to gain insight into target evolution (Farh et al. 2005).

Some of the challenges associated with detecting miRNAs using microarrays are associated with the inherent nature of miRNA sequences. It has been proven that the mature sequences are involved in hybridizing with the designed probes and not their hairpin precursors (Barad et al. 2004). This means that probes designed to hybridize with the mature miRNAs are, in essence, reverse complementary to the candidate (mature) miRNA. Since there is only one candidate sequence for a probe the challenges at least three-fold:

- *Cross-hybridization with closely-related sequences* – many miRNAs are grouped into families based on the similarity of sequences. One such family is the human *let-7* group of miRNAs (**Fig. 1.4**). It is evident that these miRNAs share extensive similarity and are different only by one or two nucleotides. We show that probes that are designed perfectly complementary to the intended sequence cross-hybridize with non-target sequences.
- *Non-uniform melting temperatures* – the base compositions of all mature sequences are fairly varied which results in a diverse range of melting temperatures. Finding a suitable experimental condition to assay for all miRNAs is, therefore, not a trivial task.

hsa-let-7a	ugagguaguagguuguauaguu
hsa-let-7b	ugagguaguagguugugugguu
hsa-let-7c	ugagguaguagguuguauugguu
hsa-let-7d	agagguaguagguugcauaguu
hsa-let-7e	ugagguaggagguuguauaguu
hsa-let-7f	ugagguaguagauguauaguu
hsa-let-7g	ugagguaguaguuguacaguu
hsa-let-7i	ugagguaguaguuguucuguu
hsa-miR-98	ugagguaguaaguuguauuguu

Figure 1.4. The human *let-7* miRNA family consists of highly similar mature sequences

- *Probe secondary structure* – Probes may fold upon themselves to form secondary structures, rendering them unable to bind to target sequences being assayed for.

The approaches taken to increase specificity of hybridization or to balance melting temperatures of sequences either use modified nucleotides (Guo et al. 1997; Castoldi et al. 2006) or linker sequences (Wang et al. 2007). Using high-throughput sequencing technologies for RNA profiling (Nagalakshmi et al. 2008) has begun to alleviate specificity issues but current costs, errors rates and associated lack of standards for data analysis still pose an impediment.

We present an alternative probe design strategy that uses naturally occurring nucleotides wherein mismatches introduced in the probes eliminate the above unfavourable scenarios.

1.4.2 Computational miRNA target prediction in animals

Genetic approaches helped identify the first miRNA-target pair in the nematode worm, *C. elegans* (Lee et al. 1993; Wightman et al. 1993). Sequencing data from several different species further led to the discovery of many miRNAs, which in turn spurred the development of computational techniques to identify targets. The mechanisms behind miRNA action have not been revealed completely which pose a challenge in identifying true targets. Some of the earliest data in flies showed regulatory motifs on the 3'-UTRs of mRNAs that were complementary to the 5'-end of miRNAs (Lai 2002). It soon became clear that a short region (6-8 nt) on the 5'-end of the mature miRNA called the 'seed' was

the primary participant in Watson-Crick base-pairing with the 3'-UTR of mRNAs and contributed to efficient repression (Lewis et al. 2003). Several predictions emerged both in fruit-fly (Enright et al. 2003; Rajewsky and Socci 2004) and vertebrates that similarly reported the involvement of the 5'-end of the miRNA in target recognition (John et al. 2004; Kiriakidou et al. 2004). Results from these predictions show that animal target sites are only perfectly complementary to miRNAs.

Considering the short length (6-8 nt) of a match, this is a source for many false-positive predictions. To counter this problem most programs employ a combination of two or more of three major criteria to identify miRNA targets: 1) seed-match between miRNA and target 3'-UTR – while some programs require or prefer perfect seed-matches (Krek et al. 2005; Lewis et al. 2005) others allow imperfect base-pairing (Enright et al. 2003; Kiriakidou et al. 2004), 2) free energy of binding between the miRNA and target site, and 3) cross-species conservation of miRNAs and/or target sites – all programs use *a priori* conservation information across two or more species based on the idea that evolutionary constraint could signify function. Considerable variation in predictions from different algorithms coupled with the fact that only a small fraction of predictions are validated in each case leaves us with very little knowledge to make predictions with confidence.

The approaches mentioned above leave out possible target sites that may not be conserved yet are functional. It is plausible that these non-conserved sites are unique to certain miRNAs in a species – a source of variation in targeting, and hence in gene regulation, across different organisms. In chapter 3 we present work beginning with

formulation of a hypothesis based on this idea, leading to testing with sequence data on a whole-genome scale followed by validation in biological systems of interest.

1.5 Contributions

The obstacles outlined in the problem statement currently prevent us from harnessing the power of a high-throughput technology like microarrays to detect miRNAs using conventional DNA probes. Though sensitivity and specificity of probes can be improved with artificial probes they are less cost effective. Specificity with respect to target prediction was raised with current approaches that consider conservation across multiple species. Here, we detail the contributions made by this thesis to alleviate these challenges

1.5.1 Target-specific microarray probe design

In combination with the use of nearest-neighbor thermodynamics, we discuss strategies to generate optimal probes for the entire complement of mature human miRNAs. Unlike conventional perfectly-matched probes, we introduce base changes in a probe sequence that serve to eliminate cross-hybridization, reduce probes with high melting temperatures and/or secondary structural features. This strategy was adopted from a study that demonstrates the dependence of oligonucleotide melting temperatures on the natures of mismatches and their positions (Lee et al. 2004). Computationally, Probe Design Guru (ProDeG) was able to design probes for all miRNAs in the human dataset (Lee et al. 2008). We employed the services of LC Sciences, Inc. (Houston, TX) to validate probes designed for six of the *let-7* family of miRNAs using spiked-in samples cDNA and RNA samples. Cross-hybridization observed with perfectly-matched probes was eliminated

when ProDeG designed probes were used. As a collaborative effort with Dr. Haiming Chen (Department of Psychiatry, University of Michigan) total RNA from lymphoblastoid cell-line was used to assay *let-7* miRNAs from a true biological sample. We demonstrate the fidelity of ProDeG probes (microarray experiments at LC Sciences, Inc.) by reproducing expression patterns of the *let-7* miRNAs as determined by qRT-PCR (by Dr.Chen's group).

1.5.2 Discovery of endogenous 5'-UTR target sites

Majority of animal miRNA target prediction programs rely on conservation of sites in two or more species and only consider interaction of the seed region with these sites. A hypothesis was proposed by Dr. Inhan Lee suggesting that the 3'-end of the miRNAs may interact with regions on the 5'-UTR that are less conserved – a source of species-specific or gene-specific variation in targeting. We used data from a previously compiled genome-wide motif study (Xie et al. 2005) to examine the propensity of miRNAs, both 5'- and 3'-ends, to interact with 5'-UTR and 3'-UTR motifs of different degrees of conservation. We first show that motifs from the 5'-UTR with little or no conservation interact preferably with 3'-ends of miRNAs. Taken together with the seed-matches, we surmised that a miRNA may target both 5'-UTR and 3'-UTR of a gene simultaneously.

We collaborated with Dr. JongIn Yook (Dental School, Yonsei University, Seoul, South Korea) and Dr. Arul Chinnaiyan (Department of Pathology and Urology, University of Michigan) for *in vitro* verification of results from the computational study. Sequence analysis of two genes, human AXIN2 and the well studied *C. elegans* LIN-28, revealed conserved sites on the 3'-UTRs and non-conserved sites on the 5'-UTRs for *hsa-*

miR-34a and *cel-lin-4*. Reporter gene experiments revealed that the 5'-UTR site of AXIN2 was able to repress protein translation independent of the 3'-UTR site (work done by Dr. Yook's group). Inhibiting the endogenous expression of *hsa-miR-34a* produced a greater rescue from repression when both sites were present compared to when either site was present alone.

We also performed similar experiments to validate the *lin4-lin28* pair using a designed siRNA that contains an intact seed-match but modified 3'-end with compensatory modifications in the 5'-UTR. This was done in Dr. Chinnaiyan's laboratory under the guidance of Dr. Saravana Dhanasekaran. We show that the 5'-UTR target site for modified siRNA was found to influence reporter gene product (luciferase) expression. The interaction was determined to be sequence-specific by mutating target sites on the UTRs.

Having established the ability of endogenous 5'-UTRs to interact with miRNAs, we examined a known regulatory element on the 5'-UTR, namely upstream AUGs (uAUG), for their potential to interact with miRNAs. Using uAUG sequences extracted from alignments of human and mouse 5'-UTRs (Churbanov et al. 2005) we demonstrate that these elements are probable target sites specific for miRNAs. We also show that the ability of uAUG motifs to confer cell-specific expression of the gene product correlates with the expression of miRNAs predicted to interact with the uAUG motifs in these cell-lines.

1.6 Thesis Outline

The following is a brief outline of work done to tackle the problems discussed above:

Chapter 2 deals with the design of microarray probes tailored to miRNAs, providing methods for producing high-fidelity probes. In Chapter 3, we provide computational and experimental evidence to show that non-seed regions of miRNAs can target endogenous 5'-UTR sites. Chapter 4 provides a possible unified mechanism for the action of uAUGs, another post-transcriptional regulatory element, along with miRNAs by serving as binding sites. We conclude by discussing findings in this thesis and provide future directions in Chapter 5.

Chapter 2

Microarray probe design for miRNAs

2.1 Background

Many miRNAs are conserved across several species and are highly similar to other miRNAs in the genome. There is a great demand for accurate expression profiling of these miRNAs to better understand their tissue specificities (Babak et al. 2004; Barad et al. 2004; Liu et al. 2004; Chapman and Carrington 2007) and their role in development (Watanabe et al. 2005; Bushati and Cohen 2007; Moss 2007; Zhao and Srivastava 2007) and disease (Lu et al. 2005; Fulci et al. 2007; Jay et al. 2007; Soifer et al. 2007; van Rooij and Olson 2007).

Techniques for determining miRNA expression include Northern blot analyses (Valoczi et al. 2004), quantitative RT-PCR (Fulci et al. 2007), and microarrays (Thomson et al. 2004). Among these, the oligonucleotide microarray platform offers a simple and high-throughput experimental procedure for genome-wide miRNA profiling. Barad *et al.* have shown in expression profiling experiments that mature microRNA sequences, not their precursors, are responsible for fluorescence signals (Barad et al. 2004). By positioning short probes away from a solid support via an unrelated linker sequence, they have demonstrated efficient miRNA hybridization to the probes.

However, miRNA arrays pose several challenges. One is the ability of design strategies to distinguish many highly similar sequences that differ by only a few nucleotides. Another is the mere ~22 nt length of miRNA, which allows no choice for a probe sequence other than the miRNA itself. Given the diverse range of miRNA melting temperatures (T_m), it is almost impossible to find one experimental condition to satisfy all genomic miRNA hybridizations simultaneously. Currently there exist two major strategies for balancing T_m : 1) by incorporating chemically modified nucleotides with higher affinity (Castoldi et al. 2006) and 2) altering probe sizes (Wang et al. 2007). However, discriminating highly similar sequences, thus featuring similar T_m , remains a challenge. Such sequences will hybridize similarly to the probes and the signal will not be specific any more. Guo *et al.* have shown experimentally that the introduction of an artificial nucleotide (lacking hybridization ability) into the probes enhanced specificity and allowed discrimination of single nucleotide polymorphisms (Guo et al. 1997). However, the small data set and use of an artificial nucleotide limit genome-wide application, as no microarray could utilize this feature.

Conventionally, mismatched sequences have been used in assessing noise levels rather than signals because hybridization can disappear with single or double nucleotide mismatches. The problem arises that background signals produced by these mismatched probes can be as strong as those of the matched probes.

Here, we present Probe Design Guru, or ProDeG (pronounced *prodigy*), a highly specific microarray probe design algorithm that also ensures a narrower calculated T_m range. This is achieved by following a base-change strategy previously outlined (Lee et al. 2004). We applied ProDeG to miRNA sequences as a first step in validating our probes

based on the importance and feasibility. Since the probes do not include any modified nucleotides or change of lengths, our methods are easy to incorporate into any microarray platform. Applying this method to human mature miRNAs from miRBase version 9.1, we found specific probes for all members of the *let-7*.

2.2 Computational Methods

2.2.1 Base change strategy

In a previous study, we identified mismatched sequences and positions which induced minimal or maximal changes in oligonucleotide hybridization compared to perfectly matched sequences. In addition, we found T_m variance with two-point mismatches to be greater than twice that with one-point mismatches (Lee et al. 2004). By carefully introducing mismatches into a probe sequence, we can increase differences in stabilities of hybridization between target and non-target sequences sufficient to achieve discrimination, as shown in **Fig. 2.1**. This technique allows the reduction of probe-target hybridization melting temperatures (T_m) when they significantly exceed the T_m of most other probe-target pairs. Introducing mismatches in the probe sequence can also serve to eliminate secondary structures of probes.

2.2.1 ProDeG algorithm

ProDeG follows a series of steps in scrutinizing each of the probes before reporting them as specific to a targeted miRNA. The flow chart in **Fig. 2.2** details all the steps in processing before final reporting on probes. Initially, the sole candidate probe is the mature miRNA sequence. Following this, probes are evaluated in two broad stages, first

addressing probe quality in respect to a target and secondly checking non-targets. In the first stage, probes are assessed for their structural properties and for their hybridization with the target sequence. Undesirable stable hairpin formations in probes and uniform T_m are evaluated. Melting temperature as a measure of hybridization stability is calculated using the nearest neighbor thermodynamics model (SantaLucia and Hicks 2004) with licensed software Oligonucleotide Modeling Platform (OMP; <http://www.dnasoftware.com>). Observing that OMP calculations correlated with experimental T_m better than our in-house program containing publicly available parameters, we then calculated T_m variance dependency on mismatch positions (Lee et al. 2004). Interestingly, Pizhitkov *et al.* recently reported a similar mismatch position dependency (Pozhitkov et al. 2006) based on microarray signal intensity data, leading us to utilize OMP in the miRNA probe design.

In the second stage, we use BLAST to search for similarities among all the other human miRNA sequences, making sure that the DUST program is turned off using the $-F$ option so all sequence stretches are considered. Candidates predicted to cross-hybridize with matches ≥ 14 nucleotides are retained for further processing. Predicted cross-hybridizations between probes and non-target sequences may, in fact, not occur due to unstable interactions. Such interactions then undergo a round of thermodynamic stability evaluations using OMP. Probes without any stable cross-hybridization are then reported as specific.

Next, imperfectly matched probes are used to identify a target sequence when candidates fail to satisfy the conditions set forth in the two prior stages of evaluation. If stable cross-hybridizations are present, we change bases in order to alter binding

stabilities enough to distinguish between target and non-target sequences (**Fig. 2.1**). If target-candidate hybridization T_m is above a set temperature (75 °C in the current case) or the candidates have strong secondary structure, imperfectly matched candidates are generated to destabilize secondary structure and also reduce excessively high T_m of hybridization between a candidate and its target. To assess the probe characteristics after base changes have been introduced, each of these modified probes is made a new candidate for which evaluations are repeated *from the start*. When imperfectly matched probes satisfy all the set criteria, they can be reported as specific to the target.

If a single round of changes in the probe sequence fails to weaken secondary structure formation, reduce high T_m of hybridization with the target, or eliminate hybridization with non-target sequences, we subject the probe to a defined maximum number n of rounds of base changes (currently, $n = 2$) and evaluate its hybridization properties. In spite of having two sets of introduced mutations, miRNA probes still showing some cross-hybridizations are reported as such.

Mature human miRNAs have a very wide T_m range of about 36 °C, the lowest and highest melting temperatures being 56 °C and 92 °C for *miR-620* and *miR-663*, respectively (1M salt concentration). Since there are numerous miRNAs with melting temperatures between 65 °C and 75 °C, we set the ceiling for the T_m range at 75 °C. The discriminating ΔT for our program is based on data from experiments conducted by Thomson *et al.* which showed that sequences with one mismatch are distinguishable (Thomson et al. 2004). By calculating T_m for *miR-124a* and the reverse complements of the perfectly and imperfectly matched probe sequences used in their experiments (data not shown), we concluded that 5 °C is sufficient. Even though absolute T_m is a function of

parameters in the nearest neighbor model, T_m difference is not. Since our criteria for lowest hybridization T_m between probe and target is 56 °C, we set the maximum hybridization T_m between probe and non-target to be 51 °C. Detailed calculation parameters are given in **Table 2.1**.

ProDeG is a bundle of programs for the UNIX programming environment written in PERL and C++, process flow being controlled by a PERL script which calls all other programs within it. ProDeG uses two external programs, BLAST and OMP. BLAST is available for download for several platforms; OMP is a licensed application available on several platforms as well and may be purchased from the vendor. By calculating T_m using the nearest neighbor model and published parameters (SantaLucia and Hicks 2004), licensed OMP may feasibly be replaced.

2.3 Computational Results

2.3.1 Variance of T_m by introducing mismatches

One of the most abundant and well-studied miRNAs is the *let-7* family, associated with most cancers (Johnson et al. 2005; Brueckner et al. 2007). The *let-7* family of sequences and their corresponding DNA hybridization T_m with perfectly complementary pairs are shown in **Table 2.2**. Each family member differs by only one or two nucleotides. Predicted cross-hybridizations with $T_m \geq 52$ °C are also presented in **Table 2.2**. With perfectly matched probes, there is no way to prevent cross-hybridizations (Wang et al. 2007). Utilizing our finding that T_m variance with two-point mutations is greater than twice that with one-point mutations (Lee et al. 2004), discrimination is now possible. This synergetic effect is not limited to nearest neighbor two-point mutation sites. Rather,

most positions of an oligonucleotide show this, unless they are close to the chain end. The discrimination of *let-7e* and *let-7a* exemplifies the process diagram in **Fig. 2.1**. One nucleotide among these differs near the middle of the sequences. T_m of a perfectly-matched *let-7e* probe – target is 66 °C; T_m of a perfectly-matched *let-7e* probe – non-target (*let-7a*) is 62 °C (**Table 2.2**), so that $\Delta T_1 = T_{m1} - T_{m3} = 4$ °C. When we change the 10th position sequence *A* of the *let-7e* probe to *T*, T_m for target and non-target becomes 60 and 54 °C, respectively ($\Delta T_2 = T_{m2} - T_{m4} = 6$ °C). After incorporation of a base change, the T_m difference between target and non-target is increased ($\Delta T_2 > \Delta T_1$). This technique, moreover, allows probe-target hybridization T_m 's to be reduced when they significantly exceed the T_m of most other probe-target pairs. Introducing mismatches in the probe sequence can also serve to eliminate secondary structures.

2.3.2 ProDeG probes for human miRNA cDNAs

Taking advantage of the fact that T_m variance with two-point mutations is greater than twice that with one-point mutations, ProDeG processed mature human miRNAs to design microarray probes with the parameters in **Table 2.1** and predicted probes for all 470 of them. Calculations treat samples as reverse complementary DNA sequences to mature miRNA and DNA probes as equivalent to mature miRNA, in accordance with cDNA microarray experiments. These cDNA probes will validate that microarray signals produced by ProDeG from highly similar sequences are discriminated. Moreover, as miRNA amplification methods become more advanced, probes for miRNA cDNA may prove valuable. ProDeG probes for the *let-7* family are shown in **Table 2.3** along with predicted cross-hybridizations where $T_m \geq 52$ °C. Following several mutation steps, all

cross-hybridizations predicted in **Table 2.2** have been eliminated. In addition, all the probes shown in **Table 2.3** have uniform melting temperatures (mostly 57 and 58 °C). Note that *miR-98* did not undergo the mutation steps because our T_m ceiling criterion was set at 75 °C.

2.3.3 Characteristics of ProDeG probes for cDNA of human miRNAs

Among the probes for the 470 mature miRNA sequences, those for 432 miRNAs are target specific, including imperfectly matched probes for 224 miRNAs, 160 of them due to eliminating cross-hybridizations of perfectly matched probes. Secondary structures were eliminated in probes for 27 miRNAs. High T_m was eliminated in probes for 76 miRNAs. We were able to overcome these obstacles (cross-hybridization, secondary structures, and high T_m) using imperfectly matched probe sequences. Designed probes for 38 mature miRNAs presented cross-hybridization with non-target miRNAs (mostly with one other); the detailed sequences and T_m are in **Supplementary Table 3 (new Appendix A.1)**. 20 out of 38 miRNAs were 100% identical to at least one other miRNA except for bases at either end of the sequences, 5 of the 20 being complete subsets of the other miRNAs. 10 other miRNAs contained one mismatch with other mature miRNA sequences at the second or third position from the 3'-end. The remaining eight miRNAs have one middle A which differs from G in another miRNA sample, leading to T (probe)-A (target sample) and T (probe)-G (non-target sample) discrimination tasks.

2.3.4 ProDeG probes for RNA samples of human miRNAs

Since most miRNA profiles use fractionated small RNAs from total RNA, we designed probes for RNA samples using hybridization parameters of DNA-RNA pairs. Again, all

470 probes for RNA samples were predicted. **Table 2.4** shows perfectly matched (control) let-7 probes while **Table 2.5** shows ProDeG-designed let-7 probes and their predicted cross-hybridizations using the same criteria of $T_m \geq 52$ °C. Probes for RNA samples are predicted to present some cross-hybridization on let-7a probe with *let-7c* and *let-7e* samples and on *let-7c* probe with *let-7b*. T_m 's for targets are less uniform and a bit higher than cDNA sample cases.

2.4 Experimental validation – Methods

2.4.1 Microarray platform

Microarray services were provided by LC Sciences Inc. (Houston, TX), which made the detection probes by *in situ* synthesis using photogenerated reagent chemistry on a microfluidic chip. We augmented their microarray layout with custom probes to experimentally validate our probe design strategy. The whole block of probe sets is repeated six times in a microarray. Custom probes include DNA sequences to the *let-7* family in **Table 2.2** (as a control) and the ProDeG *let-7* family probes in **Table 2.3** for the cDNA spiked-in experiments. Custom probes also include the reverse complementary sequences of the *let-7* family (as a control; **Table 2.4**), as well as ProDeG-designed probes for RNA samples (**Table 2.5**) of both spiked-in and total RNA from the lymphoblastoid cell lines.

2.4.2 let-7 family spiked-in experiments

DNA and RNA oligonucleotides with fluorescence dye attached to their 5'-end were purchased from Integrated DNA Technologies, Inc. (Coralville, IA). DNA

sequences are reverse complementary to the mature *let-7* member sequences, while RNA sequences are the same as the mature *let-7* family. For pairing, *let-7a*, *let-7c*, and *let-7f* were labeled with Cy-5 and *let-7b*, *let-7d*, *let-7e* with Cy-3. LC Sciences performed custom microarray fabrication, hybridization, and signal reading. All hybridization was performed for one hour in the presence of hybridization buffer (25% formamide, 6 × SSPE, pH 6.8) on a μ Paraflo microfluidic chip using a micro-circulation pump (Atactic Technologies, Inc.; Houston, TX). The signal intensities of each pair (*let-7a/7d*, *let-7b/7c*, and *let-7e/7f*) were recorded at seven temperature conditions (25 °C to 55 °C) for both cDNA and RNA cases. Because the microarray platform is microfluidic, the hybridization solution contains formamide, which reduces hybridization temperature (Hutton 1977) to minimize bubble formation in the chamber. Internal controls were used to compare multiple experiments. Hybridization images were collected using a laser scanner (GenePix 4000B, Molecular Devices, Inc; Sunnyvale, CA) and digitized using Array-Pro image analysis software (Media Cybernetics, Inc). Data were analyzed by first subtracting the background and then normalizing the signals using a LOWESS filter (Locally-weighted Regression) to compensate for the intensity difference between Cy5 and Cy3.

2.4.3 Hybridization experiment using lymphoblastoid cell-line small RNA

Lymphoblastoid cell lines were prepared from blood draws of six human subjects using established methods (Neitzel 1986). Briefly, peripheral blood mononuclear cells were isolated from whole blood with Histopaque reagent (Sigma). For each blood sample, 10 ml of Histopaque was added to a 50 ml sterile conical tube. In another 50 ml conical

tube, 10 ml of well-inverted blood was mixed with 10 ml of RPMI 1640 medium (Invitrogen). We then gently layered the blood and RPMI mixture on top of the Histopaque, and centrifuged at 1500-1700 rpm for thirty minutes.

In a bar-coded T₂₅ flask, we added 0.15 ml of phytohemagglutinin reagent and 6 ml of 30% FBS complete medium. When blood centrifugation was complete, we aspirated off the top layer and transferred the white cloudy middle layer into a new 50 ml conical tube to wash the PBM cells with RPMI 1640 medium. We then re-suspended the cell pellet in 2 ml of RPMI 1640 medium. In the T₂₅ flask prepared as described above, we added 2 ml of filtered EBV and the suspended pellet. We then filled the flask with 30% FBS complete medium up to 10 ml of total volume. The cells were placed in a CO₂ incubator for 6-8 weeks. At the half-way point (about 3 weeks), we fed the cells with 10% FBS complete medium. When the culture grew to a confluency of 10⁶ cells/ml, we collected the cells and made stocks with freezing medium, storing the cell stocks in freezers at -140 °C.

Total RNA from each human lymphoblastoid cell line was isolated with Trizol reagent (Invitrogen) according to the manufacturer's protocol (Invitrogen Cat No. 15596). Following the recommendation of LC Sciences, Inc., we used 1.5 ml of isopropyl alcohol per 1 ml of Trizol Reagent for the initial homogenization. We incubated samples at -20°C overnight and centrifuged them at no more than 12,000 × g for 10 minutes at 4°C. These modifications were necessary for the recovery of small RNAs from our cell line samples (based on preliminary study), which would be lost otherwise.

Microarray assay was performed using a service provider (LC Sciences). The assay started from 2 to 5 µg total RNA sample, which was size fractionated using a YM-

100 Microcon centrifugal filter (from Millipore) and the small RNAs (< 300 nt) isolated were 3'-extended with a poly(A) tail using poly(A) polymerase. An oligonucleotide tag was then ligated to the poly(A) tail for later fluorescent dye Cy-3 staining. Hybridization took place at 34 °C. Wash temperatures for control and ProDeG probes were 53 and 47 °C, respectively.

2.4.5 Quantitative RT-PCR

We purchased TaqMan® 2X Universal PCR Master mix and primers of the *let-7* family and a control from Applied Biosystems Inc. and followed the supplied protocol. Briefly, for each 15 µL RT reaction, 7 µL of RT master mix was combined with 5 µL total RNA (5 ng) in a tube and gently mixed. 3 µL of RT primer was added to each reaction tube, gently mixed and placed on ice. The tubes of a mixture were loaded into a thermal cycler and reverse transcription was performed. For each 20 µL PCR reaction, 10 µL of Master Mix were mixed with 7.67 µL nuclease-free water. Once the mixture was added to the PCR reaction tube, 1 µL of 20X TaqMan MicroRNA Assay mix and 1.33 µL of the RT product were transferred and gently mixed. The PCR reaction plate was prepared with 20 µL of the complete PCR master mix in each well. We used three replicates per RT reaction. Applied Biosystems 7900HT Fast Real-Time PCR System detected the fluorescence intensity during PCR amplification. We used SDS2.1 software (Applied Biosystems, CA) for quantification analysis in conjunction with the comparative Ct method.

2.5 Experimental validation – Results

2.5.1 Verification of ProDeG cDNA probe specificity using *let-7* spike-in experiments

Spiked-in experiments were performed to verify designed probe specificity within the *let-7* family. Since there is no significant cross-hybridization for *let-7g*, *7i*, or *miR-98*, we used designed probes for *let-7a* to *7f* (**Table 2.3**). Based on the T_m calculations (**Table 2.2**), we paired *let-7a/7d*, *let-7b/7c*, and *let-7e/7f* for two-color hybridization experiments. Average fluorescent signals from six adjacent spots of perfectly matched probes (controls) and of our probes are shown in **Fig. 2.3a** and **2.3b**. Each control or probe signal value is chosen for its optimal discriminating temperature (35 and 30 °C, respectively, with formamide addition (Hutton 1977)) from 55 to 25 °C data and normalized with the highest signal value from the respective control set or probe set. Two clear advantages over the controls become apparent. First, probe-target signal intensities align except in the case of *let-7e* probes, yielding much more homogeneous fluorescence signals, as predicted. Second, cross-hybridizing signals appearing in the control sets are mostly removed. In addition, the highest signal intensity value from the control set is nearly 4 times greater than that of the probe set. The minimal cross-hybridization signals in **Fig. 2.3b** are practically non-existent. The question arises whether the signals from our probes are strong enough for use in an application.

When we performed RNA spike-in experiments with these probes over 7 temperature points from 25 to 55 °C, we found that the hybridizations were more stable than those in the case of DNA-DNA. Since some signals of the mismatched probes were much stronger than with cDNA, we prepared the normalized signal graph at 40 degrees

for both control and ProDeG probes in **Fig. 2.4a** and **Fig 2.4b**. The T_m calculations are basically held in the signal intensities except for the *let-7b* probe (**Fig. 2.4b**). If we set aside the *let-7b* probe signal, the specificity of ProDeG probes were dramatically superior to the control probes (**Fig. 2.4a**), with only mild cross-hybridization of *let-7c* on *let-7a* probes. Please note that the overall cross-hybridization of control probes was also much more prevalent compared to the case of cDNA. The normalized intensity of control probes is about three times higher than that of ProDeG probes.

2.5.2 Expression signals of ProDeG *let-7* probes from human lymphoblastoid cell lines

We prepared total RNA of lymphoblastoid cell lines from a human subject to obtain miRNA profiles. In addition to LC Sciences probes, we incorporated custom probes containing controls (perfectly matched sequences) and ProDeG probes to compare signals among them. Since the hybridization temperature was 34 °C, optimized for the company's probes, gentle wash condition (47 °C) was performed to detect ProDeG signals compensating weaker signals in addition to the normal wash condition (53 °C). Each microarray contained probe blocks repeated six times. The relative signal intensities compared to the *let-7a* signal are shown in **Fig. 2.5a** and **Fig 2.5b** for control and ProDeG probes, respectively. Interestingly, *let-7b* signal from ProDeG probes was detectable, in spite of the unusually low *let-7b* spike-in signal in **Fig. 2.4b**. Rather, the *let-7b* signal in control probes was minimal. On the other hand, the *let-7c* signals from the control probe were significant, while those of the ProDeG probe were non-existent.

In order to verify the presence of each *let-7* family, we performed qRT-PCR on the same total RNA. The relative amount compared to *let-7a* quantity is shown in **Fig 2.5c**. The relative amount pattern strikingly resembles the ProDeG probe signal intensity: practically non-existent *let-7c* and *let-7e*, while *let-7a* amount is the largest followed by *let-7f* amount. We therefore conclude that the *let-7c* signals from the conventional perfectly-matched probe were actually false signals from other *let-7* family members (probably from cross-hybridization with *let-7a* based on **Fig. 2.4a**). ProDeG probes are highly reproducible using qRT-PCR and proved to be specific in our study.

2.6 Discussion

Which miRNAs need to be discriminated? Even though we definitely removed most cross-hybridizations, at least in computational terms, several remain (**Supplementary Table 2, new Appendix A.1**). Eliminating these involves discriminating one nucleotide difference near or at the end of the miRNA and discriminating T-A and T-G pairs. We reported that mutation in the first or last three bases of a sequence produces minimal T_m changes. Moreover, the interaction energy between T-A and T-G are similar, indicating limited discrimination by mismatched probes.

This limitation would be overcome when discriminating one nucleotide difference near or at the end of the miRNA by simulating an internal mismatch which may be obtained by padding two or three nucleotides during sample preparation. This concept has already been implemented by other researchers (Wang et al. 2007). ProDeG can then be applied to mismatch probe design. However, among the miRNAs listed in

Supplementary Table 2, new Appendix A.1, some are only predicted, without experimental confirmation. Also, a nuclease might have cut one or more sequences in the process of miRNA maturation. We do not feel compelled to go further in discriminating end sequence differences.

Discrimination of T-A and T-G pairs can be addressed using reverse complementary sequences as probes and mature miRNAs as samples. T (probe)-A (target sample) and T (probe)-G (non-target sample) pairs in the original set become A (probe)-T (target sample) and A (probe)-C (non-target sample) pairs in this reverse set. There should be no miRNAs in common in the G-U wobble category of predicted cross-hybridizations. Therefore, two sets of experiments, one using probes with mature miRNAs and the other using their reverse complements, will ultimately discriminate T-A and T-G pairs.

ProDeG probes for cDNA samples are of significant value both in terms of T_m calculations (**Table 2.3**) and spike-in experiments (**Fig. 2.3b**). One intrinsic concern, however, is that signal intensities from the ProDeG probes are relatively weak compared to the perfectly matched probes, thus raising a question regarding signal sensitivity in real applications. The next step is to optimize hybridization conditions and to find a balance between specificity and sensitivity. However, once techniques to obtain cDNAs of small RNAs are further developed and PCR amplification is routinely achievable, increased specificity to a target sequence using the ProDeG algorithm will be of some value.

RNA samples produced stronger signals and more cross-hybridization (**Table 2.4**, **Table 2.5** and **Fig. 2.4**) than cDNA samples. Since signals from the ProDeG probes were strong enough, we could use the same hybridization temperature for both control and

ProDeG probes in total RNA profiling experiments. During the revision process, the Sanger Institute miRBase updated its miRNA sequence database to version 10. Since cDNA samples established the correspondence between microarray signals and our calculations, cDNA data are meaningful by themselves. However, profiling total RNA involves endogenous miRNA, which needs to be updated based on the new information. In terms of the *let-7* family, however, only one nucleotide was added at the 3'-end position for *let-7d*, *e*, *g*, and *i*, whose influence is probably not significant. We added a corresponding sequence A to each *let-7* ProDeG probe, as calculated with version 9.1 and used for probes for RNA samples.

Comparing T_m calculation (**Table 2.5**) and spike-in experimental data (**Fig. 2.4b**), either the *let-7b* T_m calculation was wrong or *let-7b* RNA synthesis was not desirable or both. Since there was no *let-7e* cross-hybridization to the *let-7a* ProDeG probe (different from the Table 2.5 prediction), thermodynamic parameters of RNA-DNA pairs might be less accurate than those of DNA-DNA pairs. Improved thermodynamic parameters will increase the quality of designed probes. On the other hand, considering the *let-7b* signal detection using total RNA samples (**Fig 2.5b**), there might not be a high-purity yield of *let-7b* RNA, as the company warned, due to the difficulty of incorporating Cy-5 into RNA oligonucleotides. Despite these limitations, to our surprise, the relative signal intensity of total RNA using ProDeG probes matched the qRT-PCR data excellently, demonstrating the utility of ProDeG probes.

The presence of *let-7c* signal in the control emphasizes the false positive signal in miRNA microarray data which is prone to generate incorrect inferences in terms of miRNA expression. Another miRNA, miR-99a, is transcribed right next to *let-7c*

transcription site in the same intron of Chromosome 21 open reading frame 34. The expressions of these two miRNAs were reported to be correlated (Landgraf et al. 2007). In our total RNA sample, the *miR-99a* signal was absent from the microarray data. However, significant false signaling of *let-7c* in the control probes (**Fig. 2.5a**) would not yield such a correlation. With our probes, we can report both *let-7c* and *miR-99a* are probably absent from the transcription stage.

The ProDeG strategy is simple, powerful, cost-efficient and fully compatible with current profiling techniques, moreover considering only naturally occurring nucleotide hybridization. The use of mismatched sequences with natural nucleotides (less toxic than artificial ones) to enhance target specificity (minimal off-target effects) will allow safer *in vivo* applications. Like other hybridization calculations, ours lacks surface effects, which may have led to a lower than predicted *let-7e* signal in **Fig. 2.3b** (note that *let-7d* and *let-7e* are one nucleotide shorter than other members according to v9.1 of miRBase). To our surprise, however, the overall calculation predicted microarray intensity very well. All experimental data point to the validity of our computational algorithm.

Table 2.1 Parameters used in ProDeG microarray probes for mature human miRNA

Parameters

Assay Temperature ¹	53 °C
Maximum hybridization T _m	75 °C
Maximum monomer folding T _m ¹ (secondary structure measurement)	65 °C
Minimum hybridization T _m between probe and target	56 °C
Maximum hybridization T _m between probe and non-target	51 °C
Na ⁺ concentration	1 M
K ⁺ concentration	0 M
Probe concentration	100 nM
Target concentration	100 nM
BLAST word size	7

¹Specific parameters in the OMP software

Table 2.2 Mature human *let-7* family sequences in DNA and their hybridization T_m with perfectly complementary pairs

Name	Sequence ¹	T_m (°C) ²								
		<i>let-7a</i>	<i>let-7b</i>	<i>let-7c</i>	<i>let-7d</i>	<i>let-7e</i>	<i>let-7f</i>	<i>let-7g</i>	<i>let-7i</i>	<i>miR-98</i>
control <i>let-7a</i>	TGAGGTAGTAGGTTGTATAGTT	64	58	59	58	57	59	52	51	51
control <i>let-7b</i>	TGAGGTAGTAGGTTGT GTG GTT	58	70	65	51			51	54	
control <i>let-7c</i>	TGAGGTAGTAGGTTGTAT GG GTT	59	64	67	51	51	52	52	51	51
control <i>let-7d</i>	AG AGGTAGTAGGTTGCATAGT	55	51	51	66					
control <i>let-7e</i>	TGAGGTAG G AGGTTGTATAGT	62	55	57	56	66	55			
control <i>let-7f</i>	TGAGGTAGTAG ATT GTATAGTT	57					62			
control <i>let-7g</i>	TGAGGTAGTAG TTT GTACAGT							64	55	
control <i>let-7i</i>	TGAGGTAGTAG TTT GT GCT GT							55	68	
control <i>miR-98</i>	TGAGGTAGTA AG TTGTAT TG GTT									63

¹Mismatch sequences compared to *let-7a* are shown in bold italics.

²Hybridization T_m 51 °C is shown for reference but not expected to produce signals with our design criteria.

Table 2.3 ProDeG-designed probe sequences for cDNA of mature human *let-7* family and their hybridization T_m with targets and non-targets

Name	Sequence ¹	T_m (°C) ²								
		<i>let-7a</i>	<i>let-7b</i>	<i>let-7c</i>	<i>let-7d</i>	<i>let-7e</i>	<i>let-7f</i>	<i>let-7g</i>	<i>let-7i</i>	<i>miR-98</i>
probe <i>let-7a</i>	TGAG a TAGTAGGTTGTATAGTT	57			51					
probe <i>let-7b</i>	TG t GGTAGTAGG c TGTGTGGTT		57							
probe <i>let-7c</i>	TG t GG c AGTAGGTTGTATGGTT			57						
probe <i>let-7d</i>	AGAGGTAGTA a GTTGCATAGT				58					
probe <i>let-7e</i>	TG a CGTAGGAGGTTGTATAGT	51				57				
probe <i>let-7f</i>	TG c GGTAGTAGATTGTATAGTT	51					57			
probe <i>let-7g</i>	TGAGGTA a TAGTTTGTACAGT							56		
probe <i>let-7i</i>	TGAGGTAGTA c TTTGTGCTGT								58	
probe <i>miR-98</i>	TGAGGTAGTAAGTTGTATTGTT									63

¹Mismatch sequences compared to the original are shown in bold lower case.

²Hybridization T_m 51 °C is shown for reference but not expected to produce signals with our design criteria.

Table 2.4 Hybridization T_m for mature human let-7 family of microRNAs between DNA probes and RNA targets and off-targets before ProDeG run

Name	Sequence	T_m (°C) ¹								
		<i>let-7a</i>	<i>let-7b</i>	<i>let-7c</i>	<i>let-7d</i>	<i>let-7e</i>	<i>let-7f</i>	<i>let-7g</i>	<i>let-7i</i>	<i>miR-98</i>
control <i>let-7a</i>	AACTATACAACCTACTACCTCA	64	59	62	59	63	57	51		51
control <i>let-7b</i>	AACCACACAACCTACTACCTCA	58	70	64	56	55			52	
control <i>let-7c</i>	AACCATACAACCTACTACCTCA	60	65	67	56	57				
control <i>let-7d</i>	AACTATGCAACCTACTACCTCT	61	55	58	67	59	52			
control <i>let-7e</i>	AACTATACAACCTCCTACCTCA	58	51	55	51	67				
control <i>let-7f</i>	AACTATACAATCTACTACCTCA	59	52	56	52	57	62	51		
control <i>let-7g</i>	AACTGTACAAACTACTACCTCA	57	52	55		54	54	65	58	
control <i>let-7i</i>	AACAGCACAAACTACTACCTCA	52	57	52				56	68	
control <i>miR-98</i>	AACAATACAACCTACTACCTCA	53		54						63

¹Hybridization T_m 51 °C is shown for reference but is not expected to produce signals when considering our calculation criteria.

Table 2.5 ProDeG-designed probe sequences for mature human *let-7* family (RNA as sample) and their respective hybridization T_m with targets and non-targets

Name	Sequence ¹	T_m (°C) ²								
		<i>let-7a</i>	<i>let-7b</i>	<i>let-7c</i>	<i>let-7d</i>	<i>let-7e</i>	<i>let-7f</i>	<i>let-7g</i>	<i>let-7i</i>	<i>miR-98</i>
probe <i>let-7a</i>	AACTATACAACCTACTA t CTCA	59	52	56	52	57				
probe <i>let-7b</i>	AACCACACAAC t TACTACCA a CA		60	51						
probe <i>let-7c</i>	AACCATACAACCTA t TACCT t A		55	58						
probe <i>let-7d</i>	A c CTATG c cACCTACTACCTCT				59					
probe <i>let-7e</i>	A t CTATA a AACCTCCTACCTCA					58				
probe <i>let-7f</i>	t ACTATACAG t TCTACTACCTCA	53					57			
probe <i>let-7g</i>	AACTGTACT t AACTACTACCTCA	51						60	52	
probe <i>let-7i</i>	AACAGCAC c AACTACTACCTCA								63	
probe <i>miR-98</i>	AACAAT t CAACTTACTACCTCA									58

¹Mismatch sequences compared to the original are shown in bold lower case.²Hybridization T_m 51 °C is shown for reference but not expected to produce signals with our design criteria.

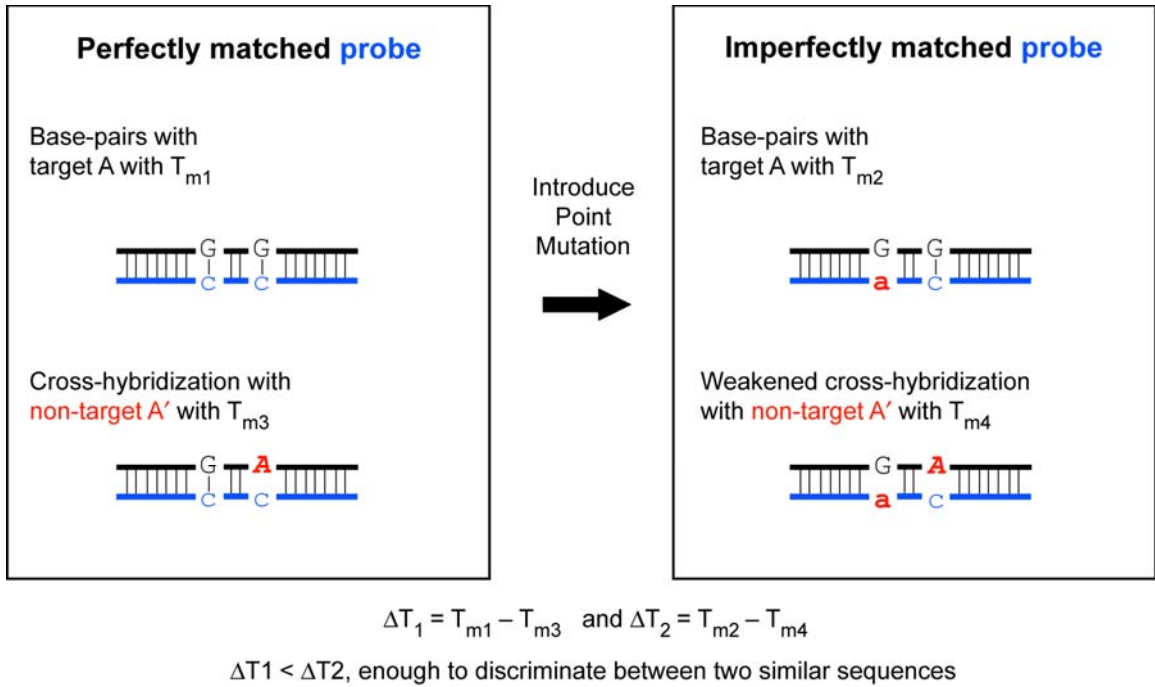


Figure 2.1 Schematic example of including an imperfectly matched probe to increase specificity. Probe strand is shown in blue and in lower case characters. Target A and non-target A' differ by one base at the position shown as sequence A. After incorporating a base change (sequence a), the difference in T_m between probe-target and probe-non-target pairs (right, $\Delta T_2 = T_{m2} - T_{m4}$) is sufficient to discriminate similar sequences as compared to the difference in T_m before point mutation (left, $\Delta T_1 = T_{m1} - T_{m3}$).

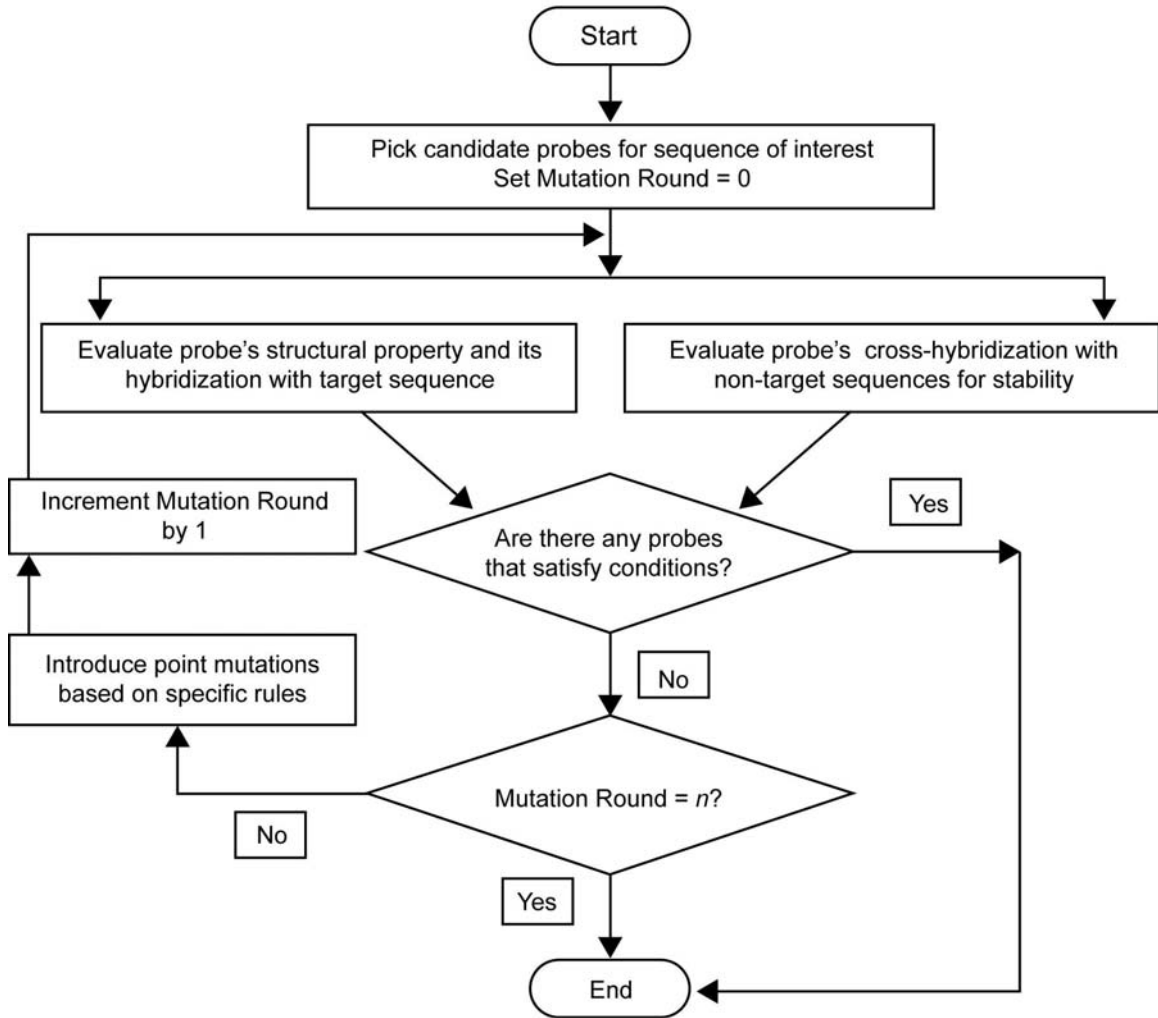


Figure 2.2 The ProDeG flowchart.

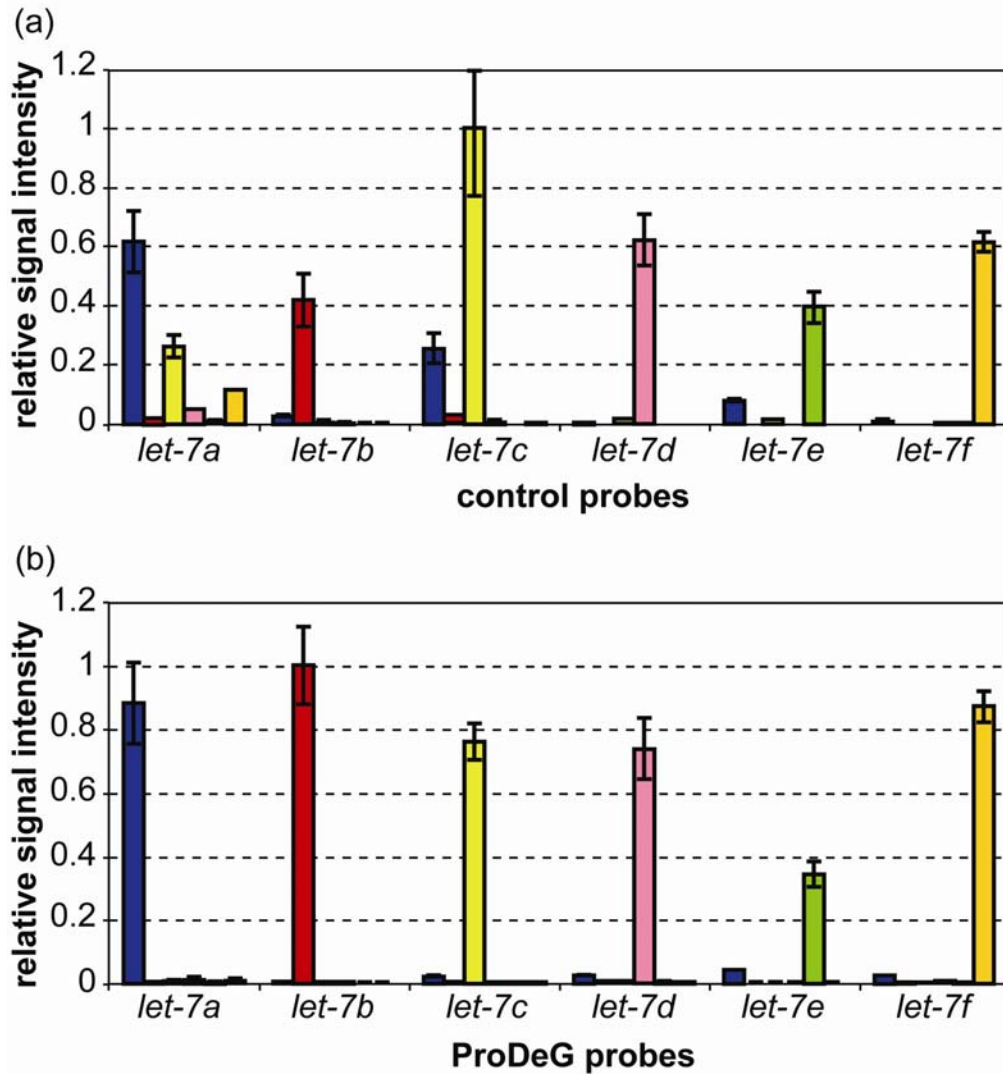


Figure 2.3 Relative signal intensities of the *let-7* family with spiked-in cDNA sequences. These are shown using control (perfectly matched) sequences as probes at 35 °C (a) and ProDeG designed probes at 30 °C (b). Each x-axis category indicates probes used while the corresponding series shows the relative probe intensities normalized with highest intensity value. Spiked-in sample notations are as follows: blue bars, *let-7a*; red bars, *let-7b*; yellow bars, *let-7c*; pink bars, *let-7d*; lime bars, *let-7e* and orange bars, *let-7f*.

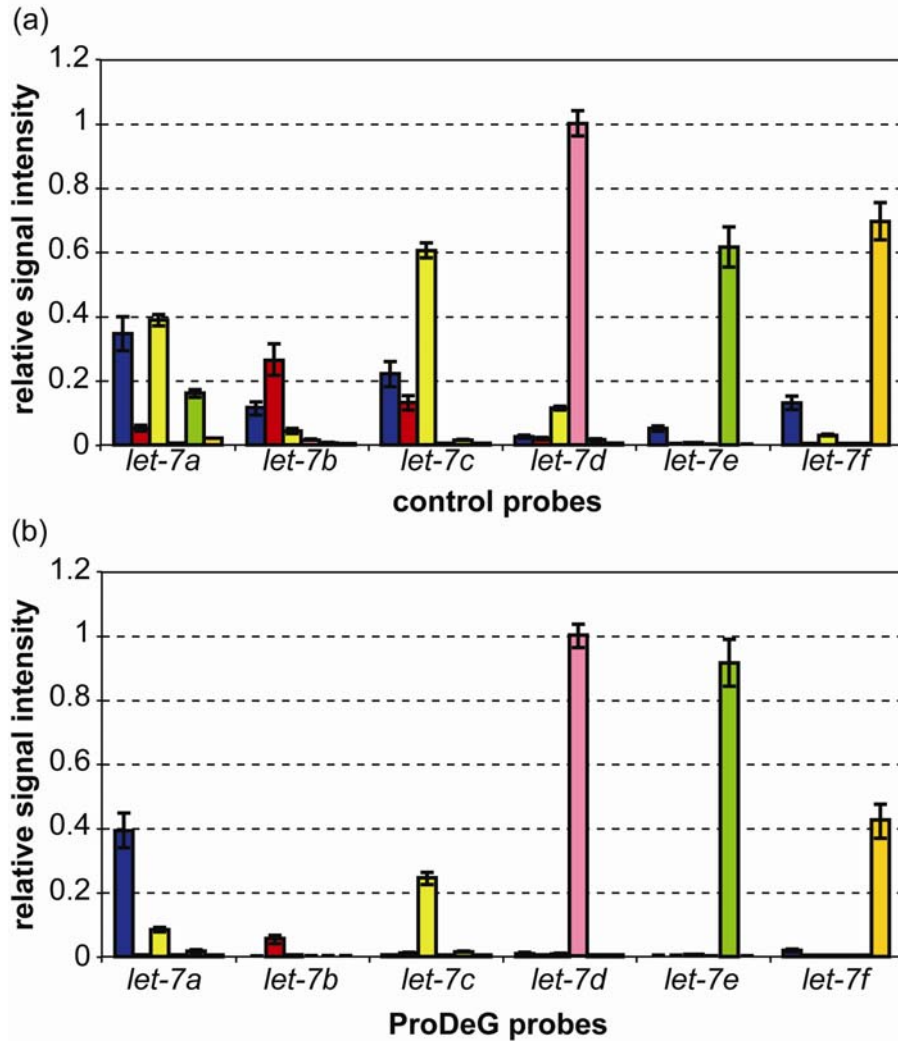


Figure 2.4 Relative signal intensities of the *let-7* family with spiked-in RNA sequences. These are shown using control (perfectly matched) sequences as probes (a) and ProDeG designed probes (b) at 40 °C. Each x-axis category indicates probes used while the corresponding series shows the relative probe intensities normalized with highest intensity value. Spiked-in sample notations are as follows: blue bars, *let-7a*; red bars, *let-7b*; yellow bars, *let-7c*; pink bars, *let-7d*; lime bars, *let-7e* and orange bars, *let-7f*.

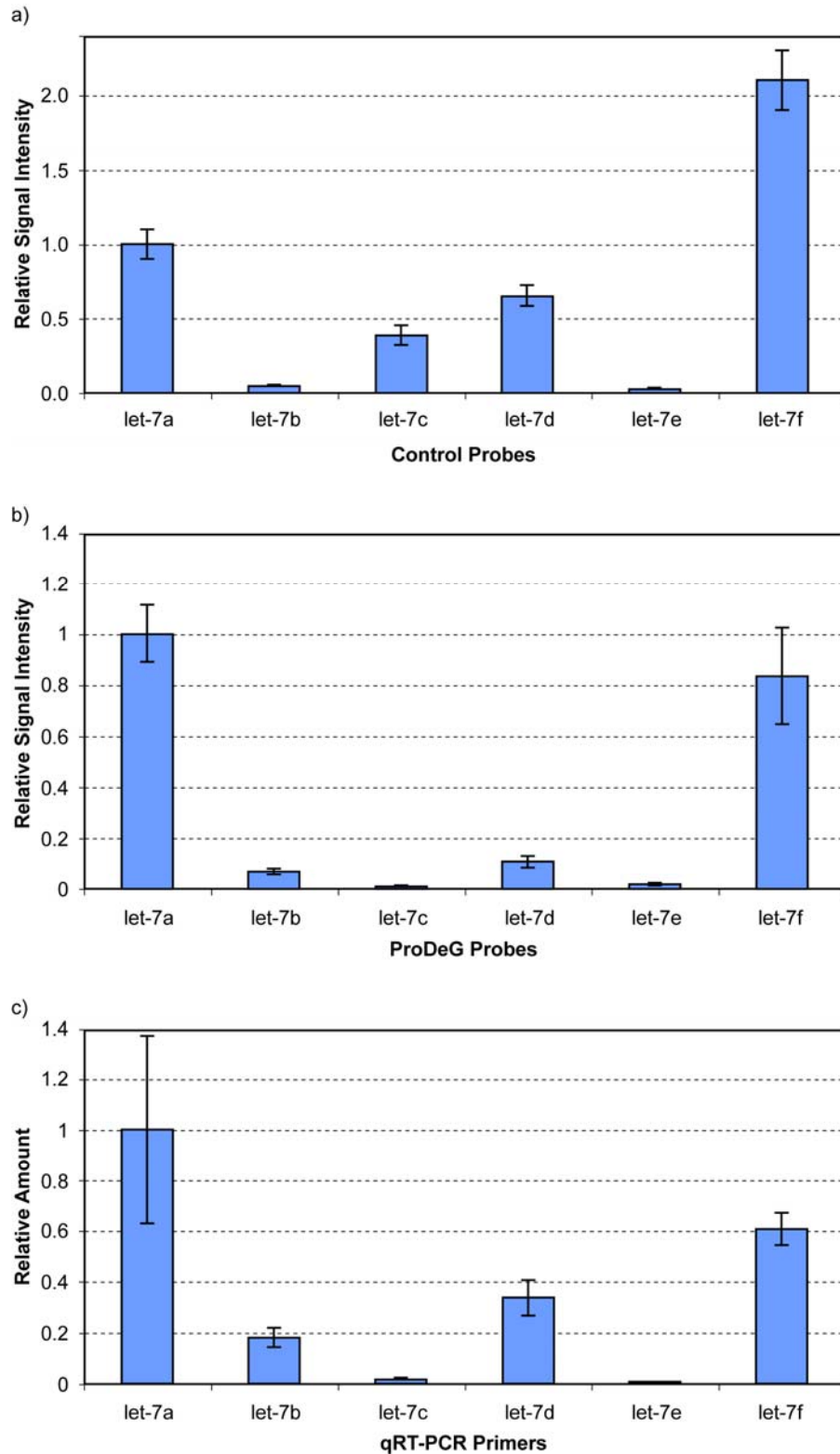


Figure 2.5 Total RNA sample data from a lymphoblastoid cell-line. All data are normalized against let-7a data. Relative signal intensity of the let-7 family control (a) and ProDeG (b) probes are shown after Cy-3 labeled total RNA from a lymphoblastoid cell-line was hybridized at 34 °C. The relative amount of each let-7 family miRNA was quantified using TaqMan® qRT-PCR assay (c).

Chapter 3

Discovery of endogenous 5'-UTR miRNA target sites

3.1 Background

miRNA target sites are known to primarily lie in 3'-UTR in animals. The first discovered miRNA, *lin-4* in *C. elegans*, was found to regulate developmental timing by targeting multiple sites in 3'-UTR of *lin-14* (Wightman et al. 1993). Since then several miRNA-target prediction programs have been developed (Rajewsky 2006; Sethupathy et al. 2006) that stress the importance of seed-match between the 5'-end of mature miRNA and 3'-UTR of the target mRNA, while some others show that the 3'-end of a miRNA may either complement a seed match or compensate for an imperfect one (Doench and Sharp 2004; Kiriakidou et al. 2004; Kloosterman et al. 2004; Grimson et al. 2007). The significance of this 5'-end of miRNA targeting 3'-UTR sites was recently confirmed by a proteomics study which showed superior protein inhibition capacity for the 3'-UTR sites over those in the coding region (Baek et al. 2008). It has been suggested a miRNA may target about 200 mRNAs (Krek et al. 2005), with varying degrees of protein repression (Baek et al. 2008; Selbach et al. 2008), though the number of predicted targets can range in the thousands. A major reason for these false positives lies in the partially complementary matches between miRNA and its targets.

To improve specificity of target prediction, many programs utilize sequence data to assess conservation of predicted target sites. This has also been done on a genome-

wide scale using motif data to uncover probable target sites (Xie et al. 2005). This study only discovered target sites on the 3'-UTR that interact with the seed region of miRNAs. Focusing on conserved target sites has the intrinsic limitation of not identifying species-specific sequences, including non-conserved miRNAs. Also, most miRNA target verification experiments have only used 3'-UTR interaction sites since many studies had shown miRNA effects with only portions of 3'-UTR. Even the first *lin-4* and *lin-14* experiments used not the whole mRNA, but rather the 3'-UTR together with coding region (Wightman et al. 1993). On the other hand, a few experiments have indicated possible target sites in the 5'-UTR (Jopling et al. 2005; Lytle et al. 2007; Orom et al. 2008).

We report here, based on both hybridization energy and sequence matches, many endogenous motifs within human 5'-UTRs specific to the 3'-ends of miRNAs. Rather than suggesting possible miRNA interactions with other regions of mRNA, we report combinatorial interactions between a single miRNA and both end regions of an mRNA, based on our finding that many miRNAs contain significant interaction sites with mRNA 5'-UTR and 3'-UTR motifs through their 3'- and 5'-end sequences, respectively. As a model system, we experimentally verified that *hsa-miR-34a* function depends on both UTR sites of *AXIN2*. Additionally, we show that both UTRs of the *C. elegans lin28* gene is targeted by a modified *cel-lin-4*. We propose a new miRNA target class containing simultaneous 5'- and 3'-UTR interaction sites. This class can serve as an efficient screening tool for identifying real targets, especially in the case of non-conserved miRNAs or target sites.

3.2 Results

3.2.1 Presence of miRNA interaction sites in human 5' UTR

We checked for genome-wide miRNA interaction motifs in human 5'-UTR and 3'-UTR. Xie *et al.* have reported conserved miRNA motifs in the 3'-UTR but not in the 5'-UTR or in coding sequences (Xie et al. 2005). We used the same UTR motif dataset sent to us by the authors but defined new conservation classes $C=0$ (non-conserved but human-enriched), 1 (minimally conserved and human-enriched), and ≥ 10 (highly conserved). To determine seed and non-seed region effects, all mature miRNAs were downloaded from miRBase (Release 11.0) (Griffiths-Jones et al. 2008) and split into their respective 5'- and 3'-ends, making miRNA halves. Following thermodynamic searches for half miRNA-UTR motif interaction using RNAhybrid (Kruger and Rehmsmeier 2006), we treated only consecutively-matched sequences as signals. To calculate significance, total numbers of pairwise interactions between half-miRNAs and UTR motifs were compared with the numbers of interactions with shuffled UTR motifs generated 1,000 times.

In these analyses, we identified 5'-UTR motifs (5U) interact significantly with the miRNA 3'-end (3P) in all conservation categories (5U3P's in **Fig. 3.1a**), most significantly in the case of $C=0$. 3'-UTR motifs (3U), on the other hand, show significant interactions with miRNA only in the case of highly conserved 8-mers ($C \geq 10$), which is consistent with previous reports (Conserved 10: 3U5P and 3U3P in **Fig. 3.1a**). Besides the most significant and well-known interaction of 3U5P, our identification of 3U3P interaction is in accordance with previous findings that the 3'-end of a miRNA may either complement a seed match or compensate for an imperfect one (Doench and Sharp 2004; Kiriakidou et al. 2004; Kloosterman et al. 2004; Grimson et al. 2007). Our new finding of

5U3P interaction was also observed with human-enriched 5'-UTR motifs when we followed Xie *et al.*'s conservation score (Methods and **Fig. 3.2**).

Viewed in terms of conserved and non-conserved miRNAs, interactions with conserved miRNAs show a trend similar to the one above, differing only in the levels of significance (**Fig. 3.1b**). Interestingly, 5U3P interactions with non-conserved miRNAs lack significance for C=0 motifs (**Fig. 3.1c**), the 5U3P signal in C=0 in **Fig. 3.1a** coming from that of conserved miRNAs. We also observed significant interactions between highly conserved 5'-UTR motifs and the 5'-end (5U5P) of non-conserved miRNAs (**Fig. 3.1c**).

In conjunction with the significant interaction between the seed region of a miRNA and the 3'-UTR, the preferential 5'-UTR interaction with the 3'-end of miRNA raises the question whether a common miRNA may target both UTRs of an mRNA by interacting with different ends of the miRNA. Based on the significance data in **Fig. 3.1a**, 37 common miRNAs identified between 5U3P (C=0 and 1: total 250 miRNAs) and 3U5P (C=10: total 116 miRNAs) cases are listed in **Appendix B.1**. When these kinds of motifs exist in a single gene, will they be regulated by a single miRNA?

3.2.2 *hsa-miR-34a* targets *AXIN2* through both UTRs

A highly-conserved human miRNA, *hsa-miR-34a*, has such interaction sites in *AXIN2* (**Fig. 3.3a**). Even though *miR-34a* is not one of the miRNAs in **Appendix B.1**, the 5'-end was predicted to interact with three highly-conserved (and one non-conserved) *AXIN* 3'-UTR sites, and the 3'-end with two overlapping 5'-UTR sites (**Fig. 3.3a**) present only in human and mouse but enriched in human 5'-UTRs (**Appendix B.2**). We used *hsa-miR-*

34a and *AXIN2* as a model system to verify simultaneous UTR interactions. Since interactions between miRNA and 3'-UTR are well-established, we focused on the 5'-UTR interaction sites, using only minimal interaction sequences of 36-mer in the experimental constructs. As shown in **Fig. 3.3a**, the *hsa-miR-34a* effects on this 36-mer should mostly come from the 3'-end. Note that the full 3'-UTR inserted in the construct is 1,408 nucleotides long.

Reporter gene assay of MCF-7 cells revealed that *miR-34a* downregulated constructs containing either the 5'-UTR (5ULuc) or 3'-UTR (Luc3U) alone. When both *Axin2* UTR sites were present (5ULuc3U), luciferase expression was further repressed by *miR-34a* (**Fig. 3.3c**). In order to identify endogenous miRNA effects in addition to those exogenously induced, we blocked endogenous *miR-34a* using inhibitor antisense RNA oligo. 5ULuc3U expression was greater than 5ULuc or Luc3U, suggesting that the 5'-UTR of *AXIN2* together with the 3'-UTR are functional target sites for *miR-34a* in the cells (**Fig. 3.3d**). In addition, the fold change of 5ULuc3U 1.88 is greater than with the addition of 5ULuc and Luc3U 1.61. Considering the many interaction sites in the 3'-UTR, the synergetic 5'-UTR effect on endogenous miRNA function is remarkable. These data suggest that in conjunction with the 3'-UTR, the 5'-UTR of *AXIN2* plays a role in miRNA-mediated repression in human cells beyond fine-tuning. In order to confirm the sequence specificity of 5'-UTR effects, we created a construct with sites mutated (5UmutLuc3U). Separate luciferase experiments inducing *hsa-miR-34a* showed rescue of repression when the 5U interaction sites are mutated (**Fig. 3.3e**).

3.2.3 Modified *cel-lin-4* targets both *lin28* UTRs

As an additional model system to verify simultaneous interaction of a miRNA with both UTRs, we chose the *C. elegans* *lin-4* and *lin-28* pair. The 3'-UTR of *lin28* contains a single canonical target site conserved in the *lin28* homologs of human, mouse and chimpanzee whereas the single 5'-UTR site predicted to bind with the 3'-end of the miRNA is lacking in all of the homologs. Expecting fewer cellular responses, we decided to use human cell lines. Due to the lower physiological temperature of *C. elegans*, we increased 5'-UTR and 3'-end interaction by changing GU pairs into GC pairs. The resulting construct-miRNA pair consisted of *lin-4*-like artificial miRNA (*lin4msiRNA*) and *lin-28*-like 5'-UTR sequences for 5U3P interaction; *lin-4* and *lin-28* sequences were for 3U5P interactions (**Fig. 3.4a**). Constructs with mismatched sequences were also prepared to study interaction-site specificity.

Reporter gene assay of HEK293 cells showed that *lin4msiRNA* repressed luciferase expressions more consistently when the 5'-UTR site is intact (Wilcoxon rank-sum test $p < 0.005$ for 5UpmLuc3Upm and 5UmmLuc3Upm; $p = 0.005$ for 5UpmLuc3Umm and 5UmmLuc3Umm). It is clear that mismatches in the 5'-UTR corresponding to the 3'-end of *lin4msiRNA* disrupt interaction. We recognize that the increased luciferase due to 3'-UTR mutation is much greater than that due to 5'-UTR mutation. Possibilities are 1) there is an additional endogenous effect for the 3'-UTR site due to the site's existence in the human homologue LIN28 (*hsa-miR-125a-5p* and *hsa-miR-125b* have same seed region compared to *cel-lin-4*), 2) 5'-UTR effects may require more overall structural context in addition to short oligonucleotide sequences, 3) exogenously-induced vector and small

RNA may not be ideal for observing endogenous cellular effects, and 4) 5'-UTR effects may reflect species-specific fine-tuning in this case.

3.3 Methods

3.3.1 Bioinformatics and statistical analysis

Mature human miRNA sequences were downloaded from miRBase, version 11.0. These were separated into two categories, conserved and non-conserved. We define a conserved miRNA as one that has a similarly-named counterpart in at least one other species regardless of the percentage identity. For example, *miR-34a* exists in humans as well as mouse and many others whereas *miR-1178*, a non-conserved miRNA by our definition, exists only in humans. Following this, miRNAs were split into their respective 5-prime and 3-prime end halves.

Xie *et al.* kindly provided us with data on conservation of all possible 8-mer sequences from aligned 5'-UTRs and 3'-UTRs among human, mouse, rat and dog (Xie *et al.* 2005). Each 8-mer was listed along with the number of occurrences conserved in all four species (C), the number of occurrences in the human sequence (N), and the conservation rate (R) given by the ratio C/N , where $0 \leq R \leq 1$. We created five motif conservation categories: 1) $C=0$, non-conserved 8-mers ordered on decreasing N, 2) $C=1$, 8-mers with exactly one conserved occurrence, ordered on decreasing N, 3) $C \geq 10$, 8-mers with at least 10 conserved occurrences ordered on decreasing C and decreasing R, 4) positive MCS, and 5) negative MCS described below. Briefly, the motif conservation score (MCS, from Xie *et al.*) is reported as a Z-score calculated using binomial probability, $MCS = (C - (Np_0)) / \sqrt{Np_0(1 - p_0)}$, where C is the number of conserved

instances, N the number of occurrences in human and p_0 the estimated rate of conservation. We calculated p_0 as the average conservation rate of all 65,536 8-mers. The top 540 highest scoring 5'-UTR and 3'-UTR 8-mers from each category above were then used for further analysis. RNAhybrid (Kruger and Rehmsmeier 2006) was used to search for potential interactions between the UTR motifs and each miRNA. Doench *et al.* having demonstrated the correlation between binding energy and fold repression (Doench and Sharp 2004), we set an energy threshold of -14 kcal/mol based on the RNAhybrid binding energy prediction for the *CXCR4* siRNA seed region and the corresponding target site used in Doench *et al.*'s paper. The results were then filtered for consecutive 8-mer matches with GU wobbles between the 8-mers and miRNA ends.

Shuffled 8-mers derived from the corresponding conservation category were used as controls to assess the significance of the number of interactions between motifs and miRNAs. The control datasets were generated 1000 times and the number of interactions calculated as an average over these iterations. We assumed the distribution of number of interactions to be normal and calculated p-value using the Z-test.

3.3.2 Experimental validation – *AXIN2* and *hsa-miR-34a*

Luciferase coding sequences were amplified from pGL3 vector (Promega) and inserted between HindIII and BamHI sites of pcDNA3.1-Hyg(+) mammalian expression vector (Invitrogen) to generate luciferase expression construct. To make 3'-UTR constructs, the 3'-UTR of *AXIN2* (NM_004655; +1 ~ +1059) was amplified from genomic DNA of MCF-7 cells and cloned into the BamHI and NotI sites. The synthetic oligonucleotide containing 5'-UTR sequences targeted by *miR-34a* of *AXIN2* (5'-GCC

CGG GGG AGT CGG CTG GAG CCG GCT GCG CTT TGA, corresponding to +44 ~ +79) was inserted into NheI and HindIII sites upstream of luciferase vectors. Each reporter construct (25 ng) was co-transfected with 20 pmol of negative control RNA oligo (Ambion, AM17110) or *miR-34a* precursor RNA oligo (Ambion, product ID PM11030) using Lipofectamine 2000 (Invitrogen) for 48 hrs. In experiments inhibiting endogenous *miR-34a*, 5 ng of each construct was co-transfected with 40 pmol of anti-*miR-34a* inhibitor (Ambion, product ID AM11030) or anti-*miR* negative control (Ambion, product ID AM17010). Fold change by *miR-34a* or *miR-34a* inhibitor was measured by a dual-luciferase assay kit (Promega), and the firefly luciferase activity normalized relative to a simultaneously transfected SV40-driven *Renilla* luciferase expression plasmid. Experiments were performed in two sets of triplicates simultaneously, one for reporter gene assay and one for qPCR analysis.

3.3.3 Experimental validation – LIN28 and *lin-4* siRNA

Custom-designed *lin-28* UTR sequences (**Appendix B.3**) were purchased from Integrated DNA Technologies, Inc. The expression reporter vector, pMIR-REPORT™, was purchased from Ambion, Inc. (Cat. # AM5795). 5'-UTR sequences were cloned into the BamHI restriction site upstream of the luciferase coding sequence and the 3'-UTR sequences were cloned into the multiple cloning site using HindIII and SpeI. UTR sequences and their orientation in the constructs were confirmed by DNA sequencing (University of Michigan DNA sequencing core).

Strands that make up the *lin4* siRNA duplex were purchased from Integrated DNA Technologies, Inc. The single stranded molecules were later annealed using the

manufacturer's protocol. We used hsa-miR-16 (Ambion, Inc., product ID PM10339) as a negative control since there is no interaction site predicted in lin-28 UTRs.

HEK293 cells were grown to 80% confluence in Dulbecco Modified Eagle Medium (DMEM) with 10% Fetal Bovine Serum. Cells were then trypsinized and plated in 12-well plates with about 250,000-300,000 cells per well. 500ng of each firefly reporter construct and 50ng of internal control Renilla reporter pRL-tk (Promega, Cat. # E2241) were co-transfected with either 37 pmol of control miRNA (hsa-miR-16) or 170 pmol of siRNA using Lipofectamine 2000 (Invitrogen). Owing to mismatches in the duplex we used, we increased the siRNA concentration to compensate for any inefficiency in annealing. Transfections were performed in quadruplicate two independent times. Cells were lysed 24 hours post-transfection and assayed for luciferase expression using the Dual-Luciferase Reporter Assay System (Promega, Cat. # E1910) and GloMax® 96 Microplate Luminometer w/Dual injectors (Promega, Cat. # E6521) according to the manufacturer's protocol.

For the lin-28 study, experiments were repeated two independent times in quadruplicate each time. *Renilla* normalized luciferase values were normalized using values from a non-specific miR-16 transfection. To determine if there was significant difference between the pairs (5UpmLuc3Upm and 5UmmLuc3Upm) and (5UpmLuc3Umm and 5UmmLuc3Umm) we used the Wilcoxon rank-sum test to calculate p-values from the normalized luciferase values for each pair of constructs chosen.

3.4 Discussion

Translation repression has been reported to occur when a 3'-UTR target site for endogenous *let-7a* in HeLa cells is moved to the 5'-UTR (Lytle et al. 2007). We now show there exist many endogenous target sites in 5'-UTR for endogenous miRNAs, so that these 5'-UTR sites can contribute to miRNA function. The data in **Fig. 3.1a** is intriguing in that 1) significant miRNA interactions in the 5'-UTR occur only with the 3'-end of miRNA (5U3P), and 2) such 5U3P significance seems to arise in highly-conserved 8-mers and spread into less-conserved but highly-human-present motifs (C=0 and 1). Non-conserved sites have been explored under the assumption that each species or genome might employ them to attribute specificity in some manner (Farh et al. 2005). Considering that the 3'-end of miRNA family members (intra-species) and those of some miRNAs across species differ, the 3'-end of miRNAs may contribute to gene- or species-specific target site recognition of the 5'-UTR. Dividing miRNAs into conserved and non-conserved ones, it seems that human-specific 5U motifs interact with pre-existing miRNAs (**Fig. 3.1b**) and that human-specific miRNAs interact with pre-existing 5U motifs (**Fig. 3.1c**). The significant 5U5P presence in the highly conserved UTR motifs and non-conserved miRNAs (**Fig. 3.1c**) may reflect an emergent feature of human-specific miRNAs, wherein miRNA and 5'-UTR are actively evolving in response to each other.

We used 36-mer sequences for the *AXIN2* 5'-UTR construct, which interacts mostly with the 3'-end of *miR-34a*. In contrast to 3'-UTR sites, which are well-dispersed across 1,408 nucleotides, making additive miRNA effects possible, the two 5'-UTR sites overlap, leaving no opportunity for additive effects. We expect to see four times higher

3'-UTR effects than with 5'-UTR, assuming the 5'-end represses translation in the 3'-UTR just as the 3'-end does in the 5'-UTR. Therefore, the contribution of *AXIN2* 5'-UTR sites in protein repression by *hsa-miR-34a* induction is no less than that of each site in the 3'-UTR (**Fig. 3.3c**). Of some interest are the endogenous miRNA effects on both UTRs in this pair (**Fig. 3.3d**). Not only is the inserted 5'-UTR site effect similar to that of the whole 3'-UTR (about 40 times longer than the inserted 5'-UTR sequences), but the presence of both UTRs has a synergetic effect on miRNA function. Exogenous *hsa-miR-34a* effects on top of endogenous *hsa-miR-34a* function may lead to saturation of repression capacity with 5ULuc3U in **Fig. 3.3c**, while repression of Luc3U is more easily achieved with exogenous *miR-34a*.

In order to fully understand miRNA function, therefore, we advise the insertion of both 5' and 3'-UTR sequences in miRNA functional experiments, which has rarely been done before. We may see more protein reduction with 5'-UTR inclusion where interaction sites exist as seen in **Fig. 3.3a and 3.4a**. Moreover, this new class of miRNAs and targets may fall into the class of translation blockers prior to the 40S ribosome reaching the translation start region, preventing 60S association (Wang et al. 2008), one possible miRNA mechanism of translation repression.

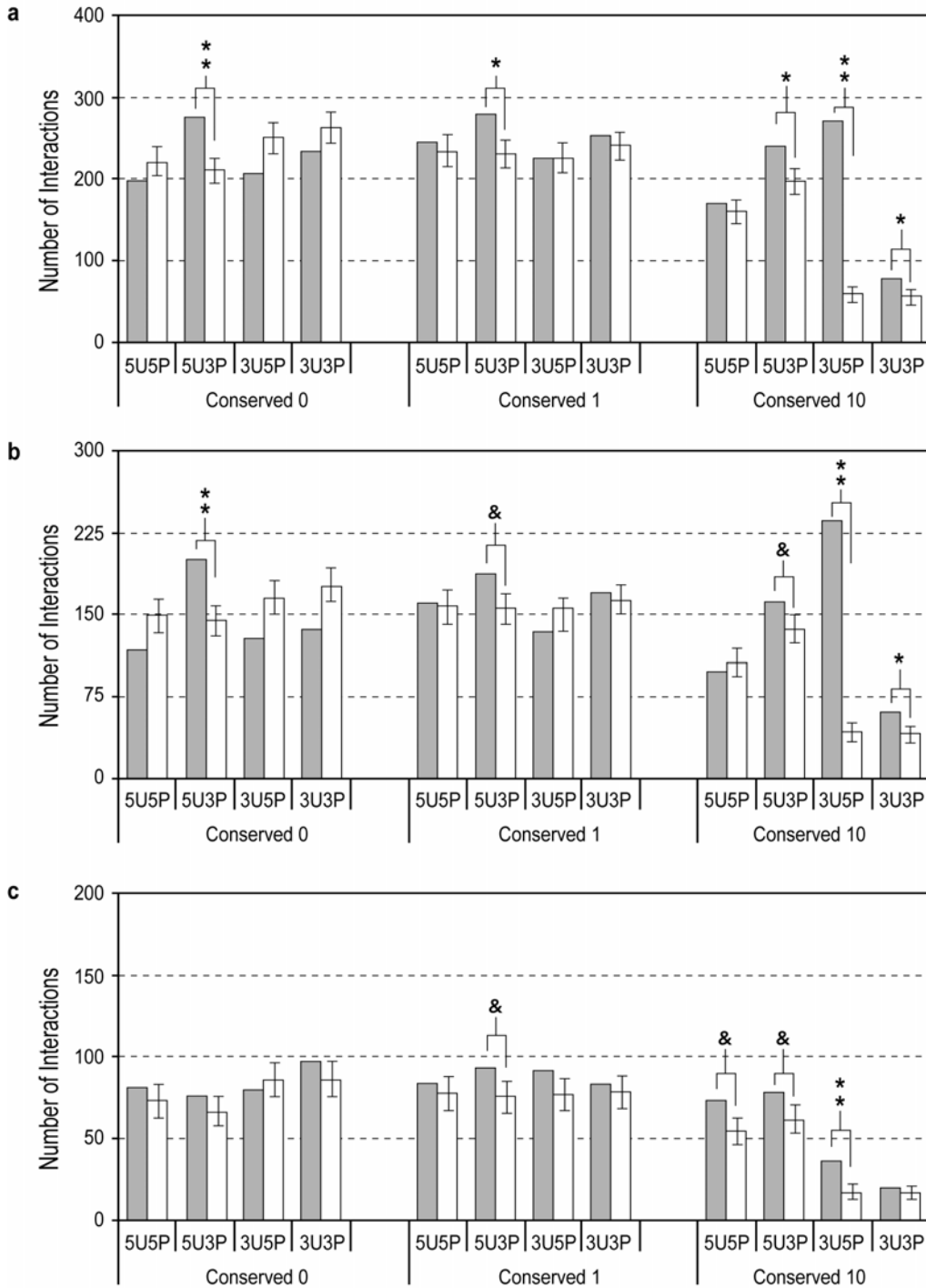


Figure 3.1 Analysis of predicted interactions between 8-mers from different conservation classes and miRNAs (based on number of occurrences). Closed bars indicate number of predicted interactions between 5'-UTR or 3'-UTR 8-mer sequences (indicated by 5U or 3U respectively) and 5'- or 3'- ends (indicated by 5P or 3P respectively) of a full set of mature miRNAs (a), of conserved miRNAs (b), and of non-conserved miRNAs (c). Open bars correspond to mean number of interactions after 1000 shuffling iterations and error bars indicate standard deviations. Double asterisk indicates $p < 5e-05$ and single asterisk $p < 5e-03$

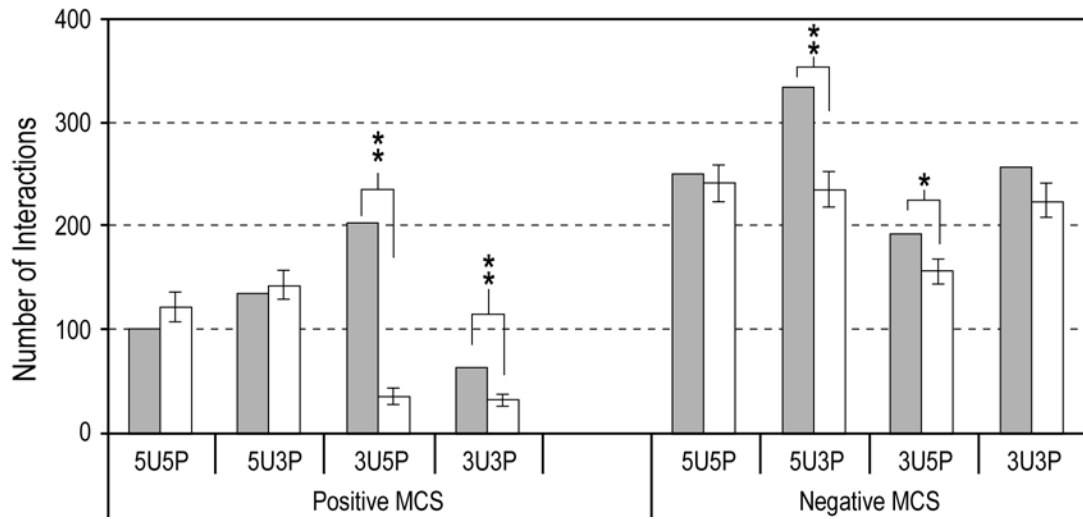


Figure 3.2 Analysis of predicted interactions between 8-mers from different conservation classes and miRNAs (based on conservation score). Closed bars indicate the number of predicted interactions between 5'-UTR or 3'-UTR 8-mers (5U and 3U respectively) and 5'- or 3'-ends of mature human miRNAs (5p and 3p respectively). Open bars indicate mean number of interactions using shuffled 8-mers after 1000 shuffling iterations. Double asterisk indicates $p < 5e-05$ and single asterisk, $p < 5e-03$.

Figure 3.3 Human miRNA *hsa-miR-34a* and target *AXIN2*. **(a)** Predicted interactions between *hsa-miR-34a* and *Axin2* UTR sequences. Extended seed match between the 5'-end of *miR-34a* and one of the 3'-UTR binding sites is shown in bold red. All predicted 3'-UTR sites are marked in the Supplementary Information. Overlapping interactions between the 3'-end of *miR-34a* and the 5'-UTR inserted sequences are shown in bold blue. Energy was calculated using RNAhybrid. **(b)** Schematic showing vector constructs containing firefly luciferase reporter gene used in transfection experiments. The 5'-UTR and 3'-UTR inserts are indicated as 5U and 3U respectively. **(c)** Luciferase expression fold change with *miR-34a* (red bars) normalized with negative control RNA oligo (blue bars). Firefly luciferase protein expression was normalized with Renilla luciferase protein. **(d)** Reporter constructs were co-transfected with anti-*miR-34a* oligo (red bars, Ambion, product ID, AM11030) and normalized with negative control RNA oligo (blue bars). **(e)** Effect of mutations in the 5'-UTR site – luciferase protein levels when reporter constructs were co-transfected with *miR-34a* (red bars) or negative control (blue bars). Error bars in panels **(c)** to **(e)** represent standard deviation from triplicate experiments

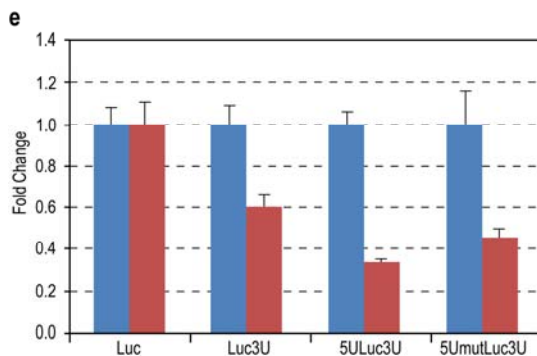
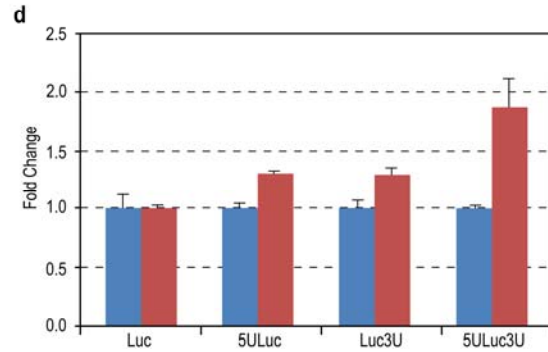
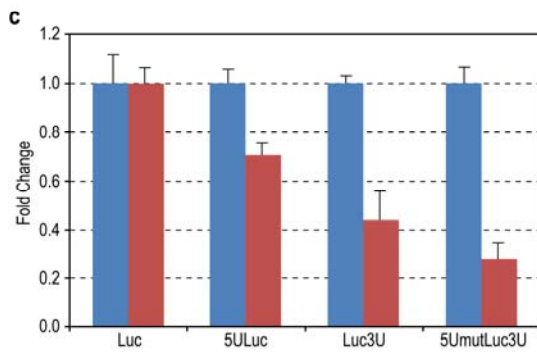
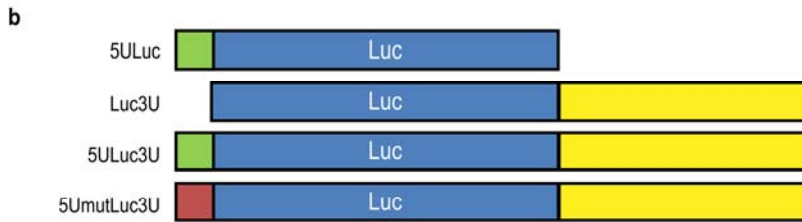
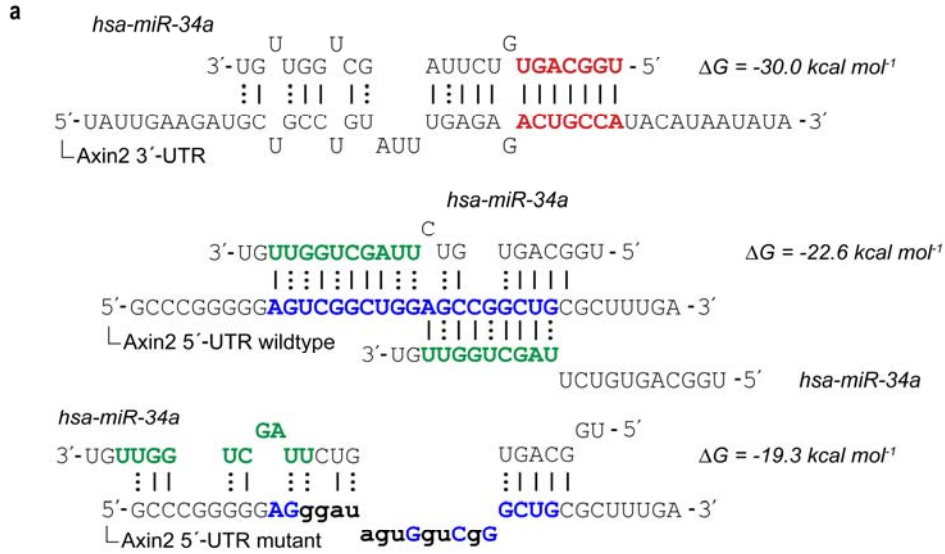
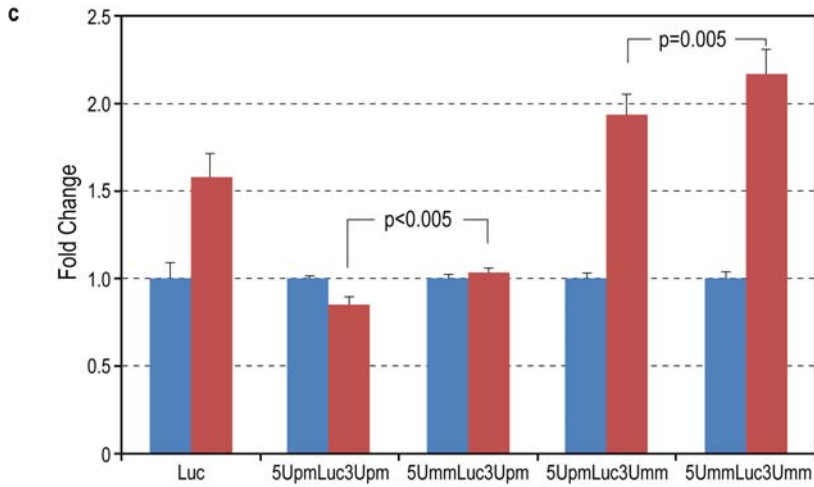
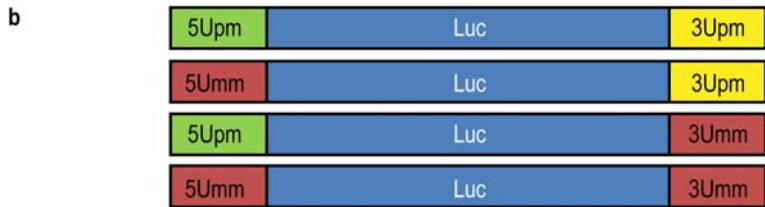
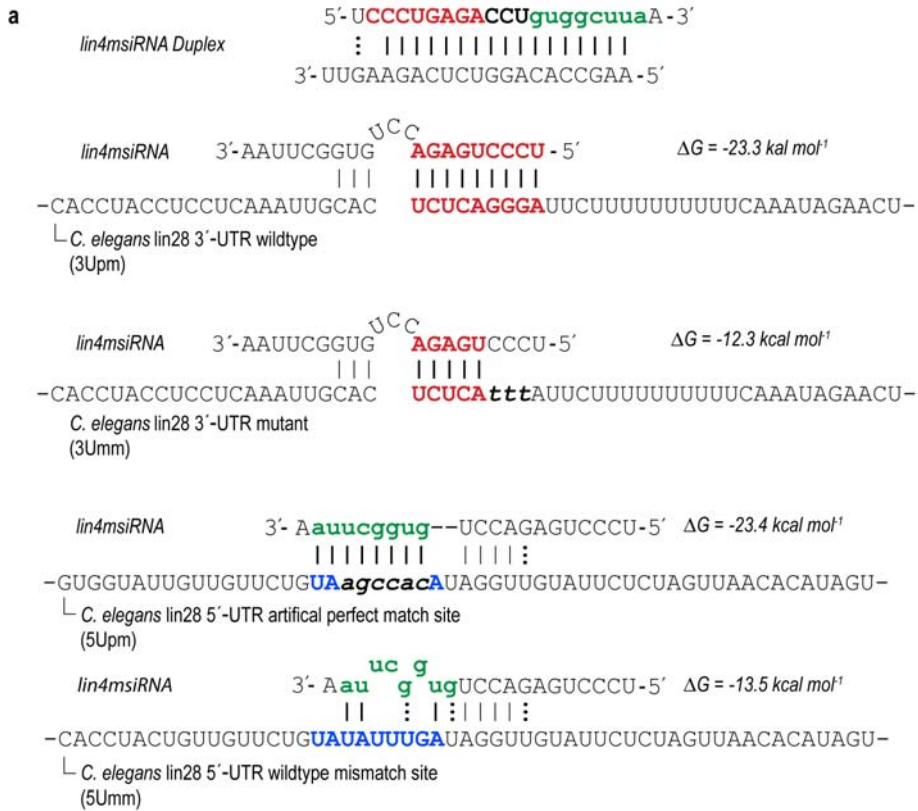


Figure 3.4 Effect of 5'-UTR interaction site for lin4msiRNA on reporter expression levels. **(a)** Predicted interactions between lin4msiRNA and lin28 UTR sequences. The functional strand of the siRNA contains an intact cel-lin-4 seed region (red) while the 3'-end is modified (green). Extended seed match between the 5'-end of lin4msiRNA and the wild-type lin28 3'-UTR binding site (bold red) is disrupted by introducing mismatches (bold and italics) to create an imperfect match with the seed region. The 3'-end of lin4msiRNA is complementary to the artificial lin28 5'-UTR binding site created by introducing a few GC base-pairs (bold italics) to form a perfect match. The wild-type lin28 5'-UTR presents an imperfect match (bold blue). Structure and energy calculations were carried out using RNAhybrid. **(b)** Schematic showing vector constructs containing firefly luciferase reporter gene used in transfection experiments. Perfectly matched sites on the lin-28 5'-UTR and 3'-UTR segments are indicated as 5Upm and 3Upm respectively, and imperfectly matched sites are indicated as 5Umm and 3Umm respectively. **(c)** Fold changes of Renilla normalized firefly luciferase expression levels with respect to non-specific hsa-miR-16 (blue bars) upon treatment with lin4msiRNA (red bars). Error bars represent standard deviation recorded from 8 pooled replicates.



Chapter 4

Post-transcriptional regulation by miRNA binding of uAUGs

4.1 Background

Translation initiation in eukaryotes is postulated to follow the ribosome scanning model (Kozak 2002), possibly constrained by multiple cis-elements on the 5'-UTR such as secondary structure (Kozak 1991b) and the 5'-terminal oligopyrimidine tracts (Avni et al. 1997) and upstream AUG (uAUG) nucleotides (Iacono et al. 2005). It is known that uAUGs cause a reduction in translational efficiency, therefore acting as a strong negative regulator of gene expression (Kozak 2002). Comparative genomic analysis has revealed that uAUGs are conserved in mammalian 5'-UTRs to a greater extent than in other segments of mRNAs, genes harboring them mainly coding for transcription factors (Churbanov et al. 2005). uAUGs may form alternative start sites forming upstream open reading frames (uORF), which are known to reduce efficiency of translation, possibly by translation of the uORF-encoded peptide (Morris and Geballe 2000). It has been noted that an uAUG/uORF can inhibit translation independent of a downstream secondary structure or its position relative to other uAUGs before the main ORF (Imataka et al. 1994; Jin et al. 2003).

Unlike the start codon of the main ORF, which in good initiation context is typically identified by the consensus Kozak sequence (Kozak 1991a), many of the uAUGs are in sub-optimal context for translation (Iacono et al. 2005). Some groups have been able to assay for *in vitro*-translated uORFs (Wang and Wessler 1998; Raney et al. 2000), which are not, however, readily detectable unless fused to a reporter gene (Kwon

et al. 2001; Song et al. 2007). One study showed that translation repression is not dependent on the encoded peptide sequence (Wang and Wessler 1998), which suggests that the peptide action may be non-specific. Further, Kwon *et al.* demonstrated that addition of a synthetic peptide encoded by an uORF did not alter translation of the protein-coding gene even though the uORF on the 5'-UTR was able to repress translation (Kwon et al. 2001).

Moreover, previous studies have reported that the uAUGs' effect on translation repression is specific to tissue type: though mRNAs containing uAUGs are expressed ubiquitously, the proteins are expressed only in specific tissues (Imataka et al. 1994; Nikolcheva et al. 2002). If indeed the translation of uORF limits downstream ORF translation, why does this repression occur only in certain cell-lines and tissues? There appears to be an additional mechanism of translation repression through uAUG other than upstream-encoded peptides.

In this report we identify certain miRNA interactions specific to the uAUG, preferentially through the 3'-end of the mature miRNA sequence. Based on our findings, we hypothesize that miRNAs expressed in one cell type but not in others may account for differences in protein expression in the cell types without changes in mRNA levels. Using miRNA expression data and results from prior work done with the *KLF9* gene in HeLa and N2A cells, we demonstrate the validity of our hypothesis. Our results suggest the role of miRNAs in cases where uAUG confers tissue-specific protein expression of the target mRNA.

4.2 Methods

4.2.1 uAUG and miRNA sequence data

Pairwise alignments between 5'-UTRs of mammalian human and mouse cDNAs were downloaded from the ftp site listed in Churbanov *et al.* (Churbanov et al. 2005). From each alignment we extracted 11-mer uAUG sequences in the human 5'-UTR beginning at position -4 and ending at position +7, with the 'A' being designated as +1 (e.g. NNNNAUGNNNN, where N is any nucleotide). When fewer than four nucleotides surround the uAUG, as in the case of a start or end of an alignment truncated n-mers ranging from 7 to 10 nucleotides in length were considered. Only uAUG sequences sharing 100% identity with the mouse homolog were categorized as conserved while others were considered as non-conserved uAUGs. Experimentally characterized uAUG sequences in Table 3 were obtained from the references listed in Table 2. For the *KLF* family of genes in Table 4, uAUG sequences were extracted from the 5'-UTR portions of the full RefSeq mRNA.

For the motif analysis, mature miRNA sequences were downloaded from miRBase (version 11.0) (Griffiths-Jones et al. 2008). miRNAs present in at least one other species (e.g. *hsa-let-7d* and *mmu-let-7d*) were categorized as conserved miRNAs (471 in total), and others as non-conserved miRNAs (206 in total). miRNAs were then split into their 5'- and 3'-halves to check for any preferential interaction with one end or the other.

4.2.2 Sequence complementarity search

A two-step strategy was employed in looking for matches between uAUG 11-mers and miRNA sequences. First, the thermodynamic search program RNAhybrid (Rehmsmeier et al. 2004) was used with $-e$ option (ΔG) set to ≤ -14 kcal mol⁻¹. Next, hits with at least seven consecutive nucleotide matches were selected.

As control miRNAs were shuffled in order to keep the nucleotide composition of the sequences intact. The search strategy above was repeated over 1000 shuffling iterations and the average number of interactions was calculated. The resulting distribution of number of interactions was assumed to be normal and significance calculated using a Z-test.

4.2.3 miRNA expression data

For miRNAs from Landgraf *et al.*'s study (Landgraf et al. 2007), we used their web visualization tool to assess the presence or absence of miRNAs in a given cell-line. For data from Chen *et al.*'s study (Chen et al. 2008), we used a p-value cutoff of 0.01 to report the miRNA as expressed. We obtained expression evidence for miRNAs of interest in N2A cells from Hohjoh *et al.*'s (Hohjoh and Fukushima 2007) study through personal communication. Expression data from Lawrie *et al.*'s (Lawrie et al. 2008) and Takada *et al.*'s studies (Takada et al. 2006) were obtained directly from the manuscripts and supplementary information.

4.3 Results

4.3.1 uAUGs are potential miRNA target sites

An earlier study of excess conservation of uAUGs used a total of 1955 pairwise alignments of human and mouse 5'-UTR sequences (Churbanov et al. 2005). The authors generated the alignments after careful pre-processing steps to remove any coding sequences that may have been mis-annotated as leader sequences. We used this alignment data to compile sequences containing uAUGs from human 5'-UTRs (see Methods), generating a total of 4009 uAUG 11-mers. The number of uAUGs per 5'-UTR ranges from one to 20, with 68% of the 1955 human 5'-UTRs containing at most two (**Fig. 4.1A**). In order to investigate conservation patterns of these n-mers we separated them into 2935 conserved and 1074 non-conserved sequences. The uAUG sequences appear to be highly conserved between both human and mouse UTRs, with all 7-mers having 100% identities and roughly 70% of 11-mers being conserved (**Fig. 4.1B**).

Mature human miRNA sequences (miRBase, version 11.0) (Griffiths-Jones et al. 2008) were downloaded and categorized as conserved (471 sequences) or non-conserved (206 sequences) miRNAs (see Methods). To reveal preferential interaction with any portion of the miRNA we split each sequence into its 5'- and 3'-ends, the former containing the seed region. We then looked for sequence matches between miRNA ends and the uAUG-containing sequences generated. This was done in two steps: 1) a thermodynamics-based search using RNAhybrid (Rehmsmeier et al. 2004) with a ΔG cutoff ≤ -14 kcal mol⁻¹ followed by 2) a filter step to look for 7 or more consecutive matches with zero or one GU wobbles. To control for spurious hits, the number of

interacting pairs was compared to the number obtained after shuffling the mature miRNAs sequences and repeating the search procedure.

We observed many predicted interactions between uAUG sequences and the two miRNA ends, characterized by a dependency on conservation of miRNAs. Only conserved miRNAs showed a significant number of interactions while non-conserved miRNAs were no better than their shuffled cohorts (**Fig 4.2A and 4.2B**). There were a number of 8-mer Watson-Crick complementary matches between the 5'-ends of conserved miRNAs and uAUG sequences (**Fig 4.2A**). Interestingly, there seemed to be a greater number of such interactions at the 3'-ends (**Fig. 4.2A and Table 4.1**), which suggests a preference for pairing between uAUGs and 3'-ends. A previous study also reported observations wherein 5'-UTR and coding regions participate in binding the 3'-end of the highly conserved miRNA, *let-7* (Forman et al. 2008). Further, when we included at most one GU wobble the only significant result that persisted was the interaction with the 3'-ends of conserved miRNAs (**Fig. 4.2B**). We conducted a genome-wide motif study of 5'-UTRs and 3'-UTRs and observed a similar propensity for interaction between 5'-UTRs and 3'-ends of miRNAs (unpublished data). The preference for interaction with 3'-ends, perhaps, suggests the importance of non-seed region matches on the 5'-UTR. This may explain the fact that there are very few known endogenous targets on the 5'-UTR that exhibit seed-matches (Xie et al. 2005). We conducted a brief GO-term investigation into the nature of genes containing the uAUGs in **Table 4.1**. Out of a total 1071 genes that contained these uAUGs annotations were retrieved for 678 genes. Majority of these 678 were found to be involved in transcription factor activity (Supplementary data).

Considering that nearly 75% of the 11-mers were found to be conserved between human and mouse 5'-UTRs (2935 out of 4009) we investigated if the interactions with conserved miRNAs were a function of uAUG sequence conservation. Results showed no dependence on uAUG conservation when not allowing GU wobbles (**Fig. 4.2C**). However, when allowing at most one GU wobble only conserved uAUGs exhibited significant interactions with 3'-ends of miRNAs (**Fig. 4.2D**).

The above results indicate that uAUGs may participate in highly sequence-specific Watson-Crick base-pairing with miRNAs, particularly towards the 3'-ends. The fact that inclusion of a GU wobble still resulted in significant number of interactions between the 3'-ends and uAUGs probably suggests functionality.

4.3.2 Expressed miRNAs may bind endogenous uAUG sites

The analyses that follow are based on experiments with genes that contain uAUGs in their 5'-UTRs, drawing upon sequence data and results from previous experiments that attribute translational repression to the uAUGs. We also used miRNA expression evidence from several sources - these references are consolidated in the form of meta-data (**Table 4.2**). We extracted 11-mer sequences containing uAUGs for these genes and looked for interactions with conserved miRNAs using the search strategy outlined above. Based on the observations in **Fig. 4.2A** and **4.2B**, we allowed one GU wobble for interactions with the 3'-end and none with the 5'-end. Many of genes contain multiple uAUGs/uORFs that have different inhibitory effects on translation. We assigned discrete values to these uAUGs that reflect their repressive capabilities on the downstream reporter. These were obtained by comparing the effect of uAUG on reporter expression

with a construct used as control. The values range from 1x to 6x, where 1x indicates that the uAUG is least repressive or does not show any effect.

We not only observed complementary matches with conserved miRNA sequences but also confirmed the presence of many of the predicted miRNAs in cell-lines where repression was observed (**Table 4.3**). There also appears to be an association between repressive strength of uAUGs and miRNA target predictions. Two uAUGs that have little or no effect on repression, indicated by '1x' in **Table 4.3**, lack miRNA interaction sites. Conversely, uAUGs with strong repressive potential (2x-6x) are complementary to expressed miRNAs except in the case of the first uAUG in the ADH5/FDH gene where expressions of the predicted miRNAs have not been detected. Note that miRNAs can act in a combinatorial manner on uAUGs to produce a net repressive effect. These observations suggest that some of the uAUG sequences are miRNA-specific and functional target sites.

4.3.3 KLF genes are probable 5'-UTR miRNA targets

Kruppel-like factors (KLFs) are transcriptional regulators that contain a characteristic zinc-finger domain and are known to play a role in differentiation and other cellular events (Bieker 2001; Black et al. 2001). There are as many as 15 members in this family, seven of them containing at least one uAUG. Using the criteria set above we identified 7-mer matches between uAUG-containing sequences and miRNAs in all seven of these genes (**Table 4.4**). Two of these, *KLF9* and *KLF13*, also called *BTEB1* and *RFLAT-1* respectively, are known to be translationally regulated by uAUGs in their 5'-UTRs (Imataka et al. 1994; Nikolcheva et al. 2002). The uAUGs in these two genes have been

implicated in cell-specific control of protein expression though their respective transcripts are present in many other tissues, suggesting a post-transcriptional mechanism of gene regulation (Imataka et al. 1994; Nikolcheva et al. 2002).

Specifically, protein expression of *KLF9*, whose 5'-UTR contains 10 uAUGs, is limited to brain tissue though its mRNA is expressed ubiquitously (Imataka et al. 1994). The 5'-UTR, particularly the portion containing uAUGs 6 and 7, suppressed reporter gene translation in HeLa cells but not in mouse neuroblastoma (N2A) cells (Imataka et al. 1994). This observation was even more intriguing because peptides from the two uORFs starting from uAUG6 and uAUG7 have not been detected (Imataka et al. 1994). Similarly, though *KLF13* mRNA is expressed in multiple tissues, protein expression was only detected in adult spleen and lung tissues (Song et al. 2000). While *KLF13* mRNA levels are constant throughout T-cell activation, KLF13 protein is only expressed later on in the activation process (Nikolcheva et al. 2002). The presence of several uAUGs in its 5'-UTR down-regulated translation of the reporter gene in Jurkat T-cells and, to a lesser degree, in HEK293 cells (Nikolcheva et al. 2002).

We decided to focus our analysis on *KLF9* uAUGs since the effects of wild-type and mutant constructs used to elucidate the roles of uAUGs were demonstrated in both cell-lines relevant to tissue specificity. We extracted uAUG 11-mers from the *KLF9* 5'-UTR sequence used in the experimental study (Imataka et al. 1994) and searched for interactions with both ends of conserved miRNAs. Since the 5'-UTR study for *KLF9* was also done in the mouse neuroblastoma (N2A) cell line, we used both mouse and human miRNAs in the analysis. All uAUGs except uAUG5 and uAUG8 interacted with at least one miRNA (Table 5). The ninth uAUG was predicted to interact with as many as five

miRNAs. Most of these predicted miRNAs are expressed in HeLa cells but not in N2A cells, including those that match uAUG6 and uAUG7. Only *mmu-miR-16* and *mmu-miR-543* were detected in N2A cells.

Regulatory roles of each uAUG/uORF may be studied by mutating one or more of the uAUGs to mitigate repression. In the case of *KLF9*, mutation of uAUG6 or 7 or both relieved translation repression (Imataka et al. 1994). However, uAUG6 inhibits translation to a greater extent compared to uAUG7, the translation efficiency of the uAUG6 mutant construct being 5 times that of the wild-type construct compared to a two-fold increase for the uAUG7 mutant, based on Imataka *et al.*'s figure 7 (Imataka et al. 1994). Interestingly, there are five human miRNAs that are predicted to interact with uAUG6, of which two are expressed in the HeLa cell lines and none in N2A cells (**Table 4.5 and Appendix C.3**). Only one expressed miRNA, *hsa-miR-31*, is predicted to bind uAUG7. If these two uAUGs are indeed miRNA interaction sites, their mutation should presumably eliminate interactions with the miRNAs predicted in **Table 4.5**. To test this assumption we repeated the interaction-expression analysis using mutated uAUG sequences that had been shown to relieve translational repression. When mutated, uAUGs implicated in mediation of translation repression in *KLF9* showed fewer predicted interactions with miRNAs (**Table 4.5**, m6 and m7) compared to wild-type sequences. Moreover, there was little evidence for expression of miRNAs matching mutated uAUG sequences.

4.4 Discussion

Though uAUGs are known to act in post-transcriptional control of gene expression there is no clear account of the mechanism involved when differences in activity of uAUGs exist across cell or tissue types. While studying uAUGs and miRNAs independent of one another, researchers observed that uAUGs affect gene expression by changes to protein levels without a notable change in mRNA levels, a phenomenon that is also a characteristic of one of the mechanisms of miRNA-mediated gene regulation.

Target sites for miRNAs have conventionally been thought to reside on conserved regions of the 3'-UTR and are predicted to bind the seed-region of a miRNA (Lewis et al. 2005). Employing a combination of thermodynamic and sequence-based searches, we found many potential uAUG 5'-UTR sites that are predicted to preferentially bind to the 3'-ends of conserved miRNAs compared to seed regions (or 5'-ends), both ends showing a significant number of interactions. This is in sharp contrast to results which show a lack of an appreciable seed-matches on 5'-UTRs (Xie et al. 2005). Forman *et al.* have also shown *in silico* that a well-conserved miRNA, *let-7*, is predicted to base-pair with the 5'-UTRs through remainder of the miRNA apart from the seed portion (Forman et al. 2008). Based on these observations, we hypothesized that the overlap in function may arise from underlying sequence-specific interactions.

Examining many genes where uAUGs have regulatory properties, we demonstrate here the connection between uAUG-mediated repression and their likelihood as binding sites for conserved miRNAs. miRNA expression data support this link by confirming the presence of miRNAs in cell-lines where reporter translation is affected by uAUGs. Further, we predict that many uAUGs in the *KLF* family of genes are miRNA-binding

sites. Two uAUGs in the well-studied *KLF9* are proven down-regulators of protein expression with regulation observed only in HeLa cells. Many miRNAs likely to interact with these two sequences were found to be expressed in the HeLa and not in N2A cells where regulation was not observed.

Many genes that contain uAUGs are known to be transcription factors (Churbanov et al. 2005). In a very interesting recent report several miRNAs and transcription factors in *C. elegans* were shown to be involved in feedback circuits (Martinez et al. 2008). It is possible that the miRNAs in this study utilize seed matches on the 3'-UTRs while other miRNAs (not necessarily activated by the transcription factors) may bind the 5'-UTRs through either seed or non-seed region matches as means to achieve repression. For instance, we found several uAUGs on the 5'-UTRs of *LIN26* that were predicted to bind miRNAs other than the *miR-43* identified by the authors (data not shown).

Orom *et al.* showed that *miR-10a* binds sequences downstream of a 5'-oligopyrimidine tract (5'-TOP) on *RPS16*, a gene encoding a ribosomal protein, to regulate its translation (Orom et al. 2008). This exact binding site on the 5'-UTR was earlier shown to be responsible for conferring cell-specific translational regulation (Avni et al. 1997). Taken together with these findings, our results suggest that miRNAs can interact with uAUG sequences and confer tissue specificity. This would constitute a unifying mechanism of translation repression for miRNAs and uAUGs. We specifically propose that the interaction of miRNAs with uAUGs may impede the progress of the scanning 40S ribosome subunit. Interestingly, primer extension (toeprint) analysis reveals the presence of a 40S ribosomal subunit alone at the start codon on miRNA-repressed

mRNAs (Wang et al. 2008). The same technique also reveals stalling of ribosomes in the vicinity of uAUGs (Gaba et al. 2001; Kwon et al. 2001; Song et al. 2007). Furthermore, Ago2, a member of the Argonaute family of proteins (Peters and Meister 2007; Tolia and Joshua-Tor 2007) and a component of the functional micro-ribonucleoprotein (miRNP) complex, was found to co-sediment with 40S-containing complexes (Wang et al. 2008). These facts indicate that miRNAs associated with miRNPs may recognize uAUG sequences as target sites and prevent translation.

In this chapter we have presented observations that suggest a miRNA role in translational control by uAUG cis-elements on the 5'-UTR. Specifically, we identified many interactions between uAUG sequences and conserved miRNAs to suggest a sequence-specific binding mechanism between these post-transcriptional regulatory factors. We also presented evidence to show that miRNAs possibly to bind uAUGs that inhibit translation of downstream reporters in cells where the miRNAs are expressed, thus explaining differential control. This expands the range of probable miRNA targets to include many endogenous sites on the 5'-UTR.

Our current knowledge has limited us to think of miRNAs and uAUGs as distinct regulatory mechanisms. While distinct functions of miRNAs or uAUGs remain in other contexts, our study unifies them as a single translational repression phenomenon where uAUGs act as miRNA target sites and translation is hindered

* The 46 miRNAs represent conserved miRNAs

§ Only the portion of uAUG11-mer that interacts with the 3'-end of miRNAs without a GU wobble is presented

Table 4.1 MicroRNAs predicted to interact with uAUG-containing motifs

miRNA*	uAUG-containing motifs[§]
hsa-let-7d	AACUAUG, ACUAUGCAA, CUAUGCAAC
hsa-miR-130a/b	AUGCCCU
hsa-miR-132	GACCAUGGCU
hsa-miR-146a	ACCCAUGG, CCCAUGGAA
hsa-miR-146b-5p	GCCUAUGG, CCUAUGGAA
hsa-miR-194	CCACAUGGA, ACAUGGAG
hsa-miR-199a-3p	ACCAAUGUG
hsa-miR-202	UCCCAUGC, CCCAUGCC
hsa-miR-219-2-3p	ACAGAUGU, CAGAUGUCC, AGAUGUCCA
hsa-miR-297	GCACAUGC
hsa-miR-299-5p	AUGUAUGUGGG
hsa-miR-31	GCUAUGCCA, CUAUGCCAG
hsa-miR-324-5p	ACCAAUGCC, CAAUGCCC
hsa-miR-33a/b	GCAAUGCA, CAAUGCAA, AUGCAAC
hsa-miR-34b	AUGGCAG
hsa-miR-363	ACAGAUGGA, AGAUGGAU, CAGAUGGAU, GAUGGAU
hsa-miR-376b	AACAUGGAUU
hsa-miR-380	AAGAUGUGG, AGAUGUGGA, GAUGUGGA
hsa-miR-431	GCAUGACG, CAUGACGG
hsa-miR-432	CCCAAUGA, CCAAUGAC
hsa-miR-448	AUGGGAC
hsa-miR-450b-3p	AUGGAUGCA, GGAUGCAA
hsa-miR-455-3p	GUAUAUGC, AUAUGCC
hsa-miR-455-5p	CGAUGUAG, GAUGUAGU
hsa-miR-487a	CUGGAUGUC
hsa-miR-487b	GUGGAUGA, UGGAUGAC
hsa-miR-490-3p	CAGCAUGGAG, AGCAUGGAGU
hsa-miR-491-5p	CCUCAUGGAAG
hsa-miR-513b	AUAAAUGACA, AUGACAC
hsa-miR-556-3p	AAAGAUGAGC, AGAUGAGCU
hsa-miR-562	GCAAAUGGU
hsa-miR-580	CCUAAUGA, AUGAUUC
hsa-miR-583	UAAUGGGA, AAUGGGAC
hsa-miR-598	GACGAUGAC, ACGAUGACA
hsa-miR-609	AGAGAUGAG, GAGAUGAGA
hsa-miR-654-3p	GGUGAUGGU
hsa-miR-654-5p	GCACAUG, ACAUGUUCU
hsa-miR-767-3p	AACCAUGGG
hsa-miR-802	AAGGAUGAAU
hsa-miR-887	CGGGAUGG
hsa-miR-889	AAUGGUUG
hsa-miR-890	ACUGAUGC, CUGAUGCC
hsa-miR-942	CACAUGGCC, ACAUGGCCA
hsa-miR-944	UCCGAUG

Table 4.2 Genes used in uAUG-binding sequence analysis along with references

Gene	Evidence showing translational control by uAUG	miRNA expression evidence(s) used for analysis
<i>KLF9/BTEB1</i>	(Imataka et al. 1994)	(Hohjoh and Fukushima 2007; Landgraf et al. 2007; Chen et al. 2008)
<i>KLF13/RFLAT-1</i>	(Nikolcheva et al. 2002)	(Takada et al. 2006; Landgraf et al. 2007; Chen et al. 2008; Lawrie et al. 2008)
<i>MOR</i>	(Song et al. 2007)	(Landgraf et al. 2007; Chen et al. 2008)
<i>CHOP</i>	(Jousse et al. 2001)	(Landgraf et al. 2007; Chen et al. 2008)
<i>MDM2</i>	(Jin et al. 2003)	(Landgraf et al. 2007; Chen et al. 2008)
<i>ADH5/FDH</i>	(Kwon et al. 2001)	(Landgraf et al. 2007; Chen et al. 2008)

* Evidence for expression of miRNAs in mouse N2A cells was acquired through personal communication with authors of (Hohjoh and Fukushima 2007).

† uAUGs shown in caps.

uAUG not present in the GenBank entry but used in reporter constructs (Nicolcheva et al. 2002).

§ Numbers in parentheses indicate the miRNA end predicted to interact. miRNAs in italics indicate matches with one GU wobble.

‡ Reference for evidence of expression: 1 (Chen et al. 2008), 2 (Landgraf et al. 2007), 3 (Lawrie et al. 2008), and 4 (Takada et al. 2006).

*Expression of the 5p arm of the precursor was detected, but that of 3p was not checked.

Table 4.3 Genes containing uAUGs predicted to interact with expressed miRNAs

Gene	uAUG [†]		Cell line used in experiments	miRNAs predicted to interact [§]	miRNA expression in cell-lines tested [‡]
<i>MOR</i>	1	gcccAUGcucc (1x)	HEK293	<i>hsa-miR-146a</i> (3') <i>hsa-miR-202</i> (3')	--- ---
	2	ggggAUGcuaa (2x)		<i>hsa-miR-324-5p</i> (5') <i>hsa-miR-517b</i> (5')	1 1
	3	aaggAUGcgcc (3x)		<i>hsa-miR-323-5p</i> (3') <i>hsa-miR-324-5p</i> (5') <i>hsa-miR-450b-3p</i> (3')	--- 2 ---
<i>CHOP</i>	1	tatcAUGuuaa (1x)	HeLa	None	---
	2	aaagAUGgagcg (6x)		<i>hsa-miR-574-3p</i> (5') <i>hsa-miR-556-3p</i> (3')	1,2 ---
	3	gcagAUGugcu (2x)		<i>hsa-miR-219-2-3p</i> (3')	219-5p*
<i>MDM2</i>	1	aaagAUGgagc (3x)	HeLa	<i>hsa-miR-363</i> (3')	1
	2	tggaAUGaucc (1x)		None	---
<i>ADH5/FDH</i>	1	gcccAUGccuc (4x)	HeLa	<i>hsa-miR-146a</i> (3') <i>hsa-miR-202</i> (3')	--- ---
	2	ccggAUGucag (4x)		<i>hsa-miR-219-1-3p</i> (3') <i>hsa-miR-219-2-3p</i> (3') <i>hsa-miR-487a</i> (3') <i>hsa-miR-489</i> (5')	219-5p* 219-5p* --- ---
<i>KLF13</i>	1	cacaAUGcgcg [#]	Jurkat	<i>hsa-miR-323-5p</i> (3') <i>hsa-miR-103</i> (5') <i>hsa-miR-107</i> (5') <i>hsa-miR-33a</i> (5') <i>hsa-miR-586</i> (5')	--- 2 2 3,4 ---
	2	ccccAUGcgcu		<i>hsa-miR-202</i> (3')	---
	3	gcggAUGcgcg		<i>hsa-miR-450b-3p</i> (3') <i>hsa-miR-324-5p</i> (5')	--- 2,3

Table 4.4 uAUGs from members of the KLF family predicted to interact with conserved miRNAs

KLF Gene[§]	uAUG[†]		miRNAs predicted to interact[‡]
<i>KLF6</i> (NM_001300)	1	uugcAUGaaac	<i>hsa-miR-93</i> (3')
<i>KLF7</i> (NM_003709)	1	cuggAUGccuc	<i>hsa-miR-450b-3p</i> (3') <i>hsa-miR-487a</i> (3')
	2	cuggAUGucug	<i>hsa-miR-450b-3p</i> (3') <i>hsa-miR-487a</i> (3')
<i>KLF8</i> (NM_007250)	1	cucuAUGauuc	<i>hsa-miR-376a</i> (5') <i>hsa-miR-376b</i> (5') <i>hsa-miR-376c</i> (5')
	2	cuuuAUGuuca	None
	3	gaggAUGggug	<i>hsa-miR-331-3p</i> (3') <i>hsa-miR-363</i> (3') <i>hsa-miR-802</i> (3') <i>hsa-miR-99b</i> (5')
	4	uuggAUGcuug	<i>hsa-miR-450b-3p</i> (3')
	5	cgcuAUGucag	<i>hsa-miR-31</i> (3')
	6	cagaAUGgggc	<i>hsa-miR-448</i> (3') <i>hsa-miR-583</i> (3') <i>hsa-miR-136</i> (5')
	7	gagtAUGagcc	<i>hsa-miR-767-3p</i> (5')
	8	cggcAUGaguu	<i>hsa-miR-574-3p</i> (5')
<i>KLF10</i> (NM_001032282, isoform a)	1	gauuAUGcaau	<i>hsa-let-7d</i> (3') <i>hsa-miR-153</i> (5')
	2	agcaAUGgcuc	<i>hsa-miR-160</i> (5')
	3	caucAUGcauu	None
	4	aagaAUGuuuu	None
	5	uuuaAUGgaaa	None
<i>KLF12</i> (NM_007249)	1	aucaAUGugac	<i>hsa-miR-199a-3p</i> (3') <i>hsa-miR-23a</i> (5') <i>hsa-miR-23b</i> (5')
	2	acaaAUGgaug	<i>hsa-miR-136</i> (5')
	3	auggAUGaaug	<i>hsa-miR-450b-3p</i> (3') <i>hsa-miR-487b</i> (3') <i>hsa-miR-802</i> (3')
	4	augaAUGaaua	None

[§] KLF13 and KLF9 are presented along with miRNA expression data in Table 4.3 and 4.5, respectively.

[†] uAUGs are shown in caps.

[‡] Numbers in parentheses indicate the miRNA end predicted to interact. miRNAs in italics indicate matches with one GU wobble.

[§] uAUG shown in caps, mutated sequences prefixed with letter ‘m’, and mutated positions shown in bold.

[†] Three letter species codes (hsa/mmu) are indicated only when one sequence interacts and omitted if both interact. Numbers in parentheses indicate the miRNA end predicted to interact. miRNAs in italics indicate matches with one GU wobble.

[‡] Reference for evidence of expression: 1 (Chen et al. 2008), 2 (Landgraf et al. 2007), 3 (Hohjoh and Fukushima 2007)

Table 4.5 KLF9 uAUGs predicted to interact with miRNAs in HeLa cells

uAUG [§]		miRNAs predicted to interact [†]	miRNA expressed in cell-lines tested? [‡]	
			HeLa	N2A
1	cauaAUGgggu	hsa-miR-583 (3') hsa-miR-490-3p (3') mmu-miR-490 (3')	1 --- ---	--- --- ---
2	aaagAUGuguc	miR-380 (3') hsa-miR-576-5p (3')	1 1	--- ---
3	gcccaAUGccag	miR-16 (3') hsa-miR-31 (3') miR-324-5p (3')	1,2 1,2 1,2	2,3 --- ---
4	aaagAUGuguc	miR-380 (3') hsa-miR-576-5p (3')	1 1	--- ---
5	uuaaAUGucag	None	---	---
6	cgugAUGggau	miR-448 (3') hsa-miR-583 (3') hsa-miR-609 (3') miR-654-3p (3') hsa-miR-605 (5') mmu-miR-325 (3')	--- 1 1 --- --- ---	--- --- --- --- --- ---
m6	cgugAAGggau	hsa-miR-491-3p (3') miR-188-5p (5') hsa-miR-211 (3') hsa-miR-520h (3')	--- 1 --- ---	--- --- --- ---
7	gagaAUGccgg	hsa-miR-31 (3')	1,2	---
m7	gagaAAGccgg	None	---	---
8	gtgaAUGuccu	None	---	---
9	guggAUGcugc	hsa-miR-450b-3p (3') hsa-miR-487b (3') miR-103 (5') miR-107 (5') miR-338-3p (5') mmu-miR-376b (3') mmu-miR-450a-3p (3')	--- --- 1 1 1,2 --- ---	--- --- 3 --- --- 3 ---
10	aaagAUGaggg	hsa-miR-556-3p (3'), hsa-miR-609 (3')	--- 1	--- ---

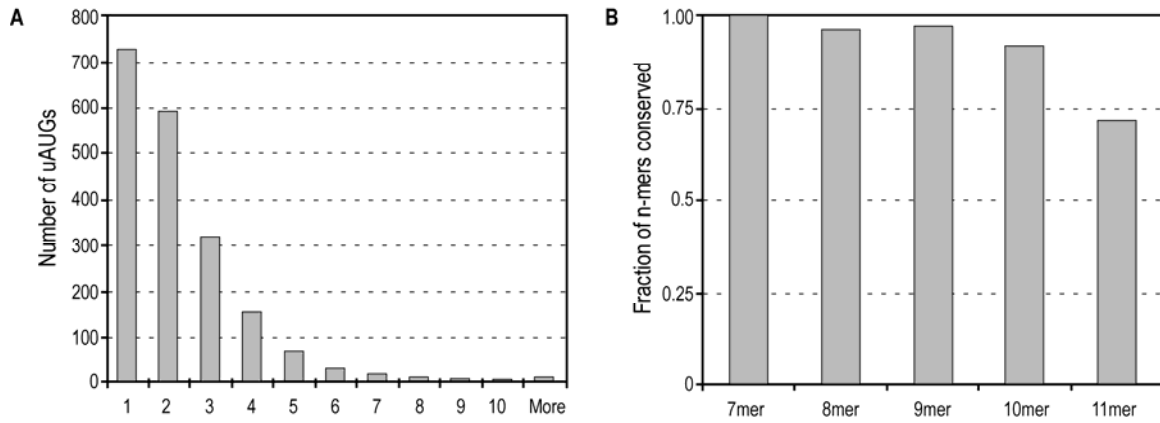


Figure 4.1 Number of uAUGs in 5'-UTRs and their conservation. **(A)** Distribution of uAUGs in human 5'-UTR sequences. **(B)** Fraction of uAUG-containing n-mer sequences conserved in human and mouse 5'-UTRs.

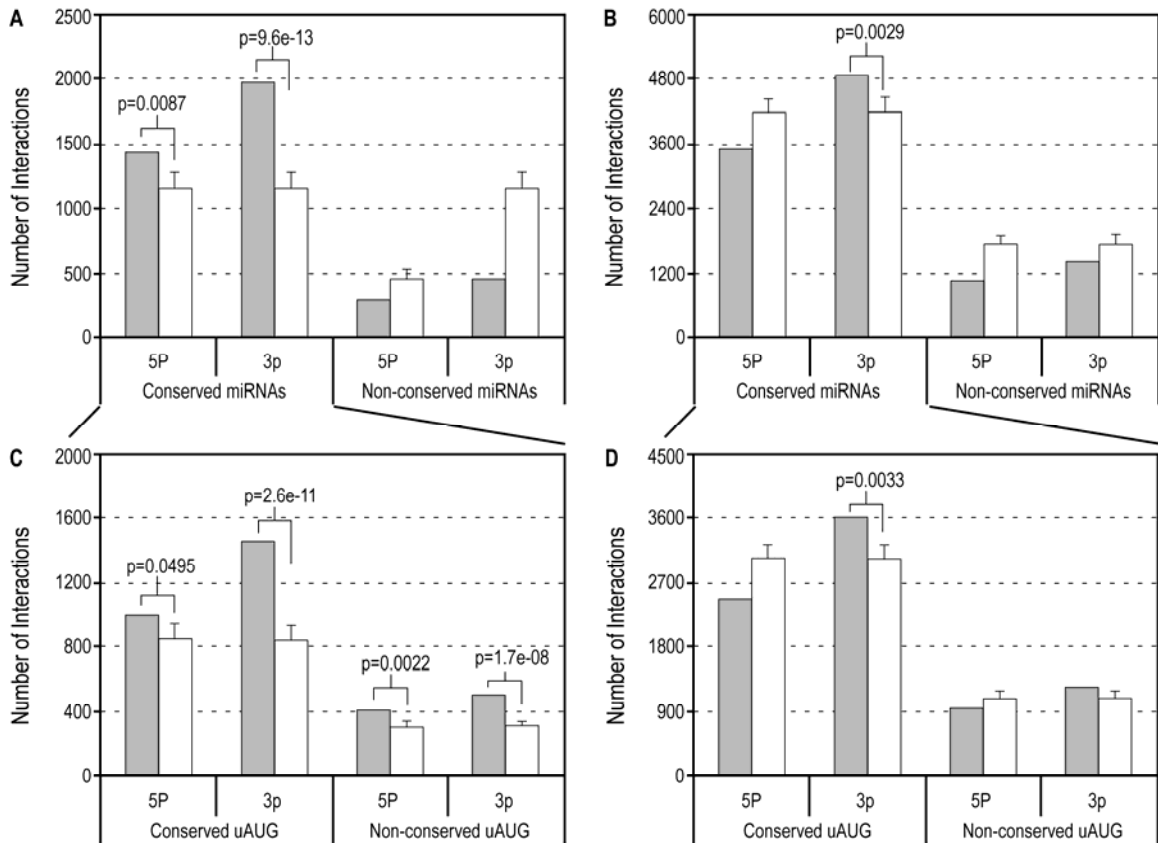


Figure 4.2 Interaction of miRNAs with uAUG sequences. Each predicted interaction is characterized by a 7-mer consecutive match between the indicated half of mature miRNA (5p and 3p for the 5'- and 3'-end respectively) and uAUG sequence with $\Delta G_{37} \leq -14$ kcal mol⁻¹. Closed bars represent actual counts and open bars represent average number of counts over 1000 repetitions of miRNA shuffling. Error bars represent the standard deviations. Significant outcomes are indicated with the corresponding p-values (**A**, **B**) Number of interactions between uAUG sequences (4009 in total) and conserved and non-conserved miRNAs (471 and 206 in total respectively) without GU wobbles (**A**) and with at most one GU wobble (**B**). (**C**, **D**) Number of interactions between conserved miRNAs and uAUG sequences (2935 conserved and 1074 non-conserved) without GU wobbles (**C**) and with at most one GU wobble (**D**).

Chapter 5

Conclusions

5.1 Summary of work

In this thesis we have examined some outstanding challenges in the field of microRNA biology, provided techniques to overcome them and demonstrated the usefulness of these novel methods. Here, we provide a synopsis of the contributions by this thesis.

Many miRNAs have been grouped into families based on sequence homology, one being no different than another in the family but for one or two nucleotides. We used the example of the *let-7* family of miRNAs to demonstrate how conventional microarray probes designed to detect these sequences fail to distinguish them. Leveraging a novel base change strategy we provided a method to eliminate cross-hybridizations between similar sequences while creating a uniform melting temperature profile. The base-change strategy takes advantage of the changes in free energies of hybridization and in melting temperatures as dictated by the nearest-neighbour thermodynamics model. These changes are then utilized in the optimization process to generate one or more probes for a given mature miRNA.

Although conservation may signify a probable functional role the opposite does not necessarily hold true. Our work exemplifies this point in case with regards to miRNA targets. Using a combination of thermodynamic and sequence-based searches we showed

that the 3'-end participates in targeting 5'-UTR sites that are not conserved. We validated the hypothesis by using *AXIN2*, a gene part of the *Wnt* signaling pathway, containing a non-conserved 5'-UTR site and three conserved sites on the 3'-UTR, both of which are functional sites for *hsa-miR-34a*. Screening for targets that contain both UTR sites can reduce the set of probable biological targets.

Upstream AUGs are regulatory elements that are known to repress protein translation, with several mechanisms being proposed for their action. However, there is no explanation for how certain AUGs can confer tissue-specific expression of the protein. Utilizing data from sequence analysis and from miRNA expression in various cell types we provide evidence to show that the 3'-ends of miRNAs preferentially interact with the uAUGs and that the repressive action of uAUGs is correlated with the expression of miRNAs that bind them. We propose that miRNAs are responsible for cell-specific action of uAUGs by preventing the progress of a scanning ribosome.

5.2 Significance and impact

The methods developed in this thesis together with results generated can potentially influence the field of miRNA biology in a positive manner. It is evident that our strategy for designing miRNA probes is superior to probes conventionally designed with perfectly-matched sequences (Lee et al. 2008). Not only can ProDeG-designed probes be used for microarray experiments but also for *in situ* hybridization experiments to observe spatial expression of miRNAs, information which microarray experiments lose. Other methods developed for *in situ* probes involve using locked-nucleic acids for increasing specificity. However, this strategy requires adjustment of experimental conditions for

LNA-incorporated probes with different melting temperatures. In combination with the use of tetramethyl ammonium chloride (TMAC), as done in an earlier study (Deo et al. 2006) for highly specific wash conditions, our strategy might be able to generate more improved results.

The base-change strategy can also be used to design probes for DNA oligonucleotide microarrays that are used to detect gene expression. Lee *et al.* established specific guidelines to incorporate changes in probe sequences. These guidelines were based on the effects of base changes to melting temperatures as a function of length of probes, position and nature of mismatches. Using these rules one can reduce the search space for candidate probes and eventually distinguish similar sequences from a family of closely related genes. Being able to correctly detect expression of coding or non-coding transcripts in a particular cell-line, tissue or sample affects the inferences that are made downstream during miRNA-target analysis, especially with respect to correlation studies between miRNA and gene expression. Errors associated with expression data are propagated down the analysis pipeline that is used to predict possible targets that are regulated.

In tackling the two-part problem, this thesis also studied aspects of miRNA targeting that, so far, have not been explored. Pan-genomic conservation has been used as a determinant in studying seed-match sites on the 3'-UTR. This strategy showed very few seed-matches on 5'-UTRs and coding regions of a miRNA. Employing conservation might be a convenient method to reduce search space of possible target sites complementary to a stretch of 6-7 nucleotides on the seed region of a miRNA. The drawback, however, is that it eliminates species-specific interactions between miRNAs

and target sites. In other words, are there sites that are specific to one species and not others?

Our studies revealed many endogenous sites on the 5'-UTR that possibly interact with 3'-ends of miRNAs. This was true of 5'-UTR sites that are conserved across multiple species. What is even more interesting, however, is the significant number of interactions with 3'-ends of miRNAs when we considered sites that are not conserved and are enriched in human sequences. In the absence of 3'-UTR, *in vitro* experiments in Chapter 3 showed that it is possible that sites on the 5'-UTR may contribute towards targeting by binding the 3'-end of the miRNA. If this is the case, it seems that current prediction strategies that use conserved 3'-UTR regions as perceived target sites might be grossly underestimating the number of genes that are under regulatory control by miRNAs.

When studying a small portion (~1%) of the human genome researchers observed that only 40% of constrained sequences mapped back to protein-coding loci and their associated UTR sequences (Birney et al. 2007). Relevant to this discussion some of the other intriguing results from their work are: 1) 5'-UTRs are more divergent, an observation that is thought to reflect positive selection and 2) a large fraction of experimentally characterized functional elements shows no evolutionary constraint at the sequence level. The authors hypothesize functional conservation of non-orthologous sequences. In keeping with the results obtained and the hypothesis, it is plausible that non-orthologous sites on the 5'-UTR are functional. It will be interesting to study the abundance of sites on both UTRs and understand under what circumstances they are functional.

As a special case, we identified many upstream AUGs that may be involved in binding the 3'-ends of miRNAs and cause cell- or tissue-specific control of translation (Chapter 4). This finding shares striking similarity with a result from the study by Orom *et al.* where *miR-10a* binds a region of the 5'-UTR of *RPS16* that was earlier found to confer cell-type specific regulation of translation (Avni *et al.* 1997; Orom *et al.* 2008). Using Orom *et al.*'s strategy of crosslinking miRNAs by UV light will shed light on binding sites and will help determine if miRNA-uAUG interactions occur as hypothesized. Majority of the genes that harbour uAUGs on 5'-UTRs are transcription factors (Churbanov *et al.* 2005). A recent report shows a network of miRNAs and transcription factors in *C. elegans* involved in a negative feedback mechanism (Martinez *et al.* 2008). Though this study primarily considered 3'-UTR sites predicted by other programs, it is possible that a different set of miRNAs might be involved in binding the 5'-UTR uAUGs.

Finally, over-expression or inhibition of miRNAs followed by microarray analysis has revealed hundreds of genes that are whose mRNA levels are regulated (Krutzfeldt *et al.* 2005; Lim *et al.* 2005). However, not all these genes may be direct miRNA targets containing seed-match sites on the 3'-UTR. Some possible scenarios are: 1) direct targets of miRNAs (regulated at the protein or mRNA level) may regulate other genes downstream which, therefore, appear differentially expressed, and 2) sites on the 5'-UTR could act independently or in conjunction with 3'-UTR sites to cause differential mRNA expression. The contribution of 5'-UTR sites may be further explored, perhaps by using an unbiased tagging method (Orom *et al.* 2008), to understand if the attribution in the 2nd scenario is valid. Further experimentation of sites on the 5'-UTR might also shed light on

the mechanistic differences of miRNA-mediated repression that currently are not fully understood.

One salient feature of the methods that we have used involves considering thermodynamics of nucleic acid binding. In some cases, we also allow G:U wobbles in the hybridizations even though they are not the most optimal in terms of free energy changes unlike Watson-Crick pairs. Stability is usually related to structure which in turn is related to function. However, it may not be that stability needs be ‘extremized’ for function. For instance, single molecule experiments show that catalytic activity of DNA polymerase depends on the tension of DNA; any lower or higher than 6 pN affects the enzyme’s activity (Wuite et al. 2000; Haynie 2001). Considering G:U wobbles may allow for flexibility that might be necessary for protein complexes associated with miRNA and mRNA duplexes to perform their functions.

Our contributions in this thesis will, no doubt, help further discoveries in the field of miRNAs and pave the way for their application in therapeutics, changing the landscape of medicine.

5.3 Future work

Though the first miRNA was discovered more than 20 years ago, bulk of the research in miRNA biology has taken place in just over 5 years. The interest that this field has garnered in such a short span of time indicates that its impact cannot be underestimated. This thesis has made important contributions to the field but our curiosity knows no bounds. Some of the areas that we wish to explore for future research include but are not limited to:

- Design and execution of experiments to test our hypothesis that unifies uAUGs and miRNAs. Validation of this hypothesis should bring us one step closer to understanding miRNA function.
- Develop machine-learning techniques to include *a priori* information and increase confidence in target predictions
- Understanding how miRNAs have evolved across species and how the process has had an effect on target site evolution.
- Use work done in this thesis and incorporate miRNA and gene expression data to build gene-miRNA regulatory networks. Incorporating high quality data from next-generation sequencing methods should produce better results.

Appendices

Appendix A

Table A.1 ProDeG probes for cDNA samples of mature miRNAs along with respective cross-hybridization(s)

Target microRNA	Probe sequence ¹	microRNA name	Target and Non-target sequence(s) ¹	T _m
Targets and non-targets differ by one or two bases at ends				
mi R-17-5p	CAAAGT a CTTACAGT t CAGGTAGT	mi R-17-5p	ACTACCTGCACTGTAAGCACTTTG	57
		mi R-106a	GCTACCTGCACTGTAAGCACTTTT	54
mi R-106a	AAAAGT c CTTACAGT c CAGGTAGC	mi R-106a	GCTACCTGCACTGTAAGCACTTTT	58
		mi R-17-5p	ACTACCTGCACTGTAAGCACTTTG	55
mi R-449	TGG c tGTGTATTGTT a cCTGGT	mi R-449	ACCAGCTAACAATACACTGCCA	57
		mi R-449b	GCCAGCTAACAATACACTGCCT	55
mi R-449b	AGGCA a T c TATTGTTAGCTGGC	mi R-449b	GCCAGCTAACAATACACTGCCT	57
		mi R-449	ACCAGCTAACAATACACTGCCA	55
mi R-517a	ATCGT t CATCCCTTTAG a aTGTT	mi R-517a	AACACTCTAAAGGGATGCACGAT	57
		mi R-517b	AACACTCTAAAGGGATGCACGA	57
		mi R-517b	AACACTCTAAAGGGATGCACGA	57

mi R-517b ²	TCGT G aATCCCTTT A tAGTGTT	mi R-517a	AACACTCTAAAGGGATGCACGAT	56
mi R-128a	TCACAGTGAAC a aGTCTCTTTT	mi R-128a	AAAAGAGACCGTTCACTGTGA	57
		mi R-128b	G AAAGAGACCGTTCACTGTGA	56
mi R-128b	TCACAGTGAAC a tGTCTCTTTC	mi R-128b	GAAAGAGACCGTTCACTGTGA	57
		mi R-128a	A AAAGAGACCGTTCACTGTGA	56
mi R-133a	TT G cTCCCCTTCAACCA t CTGT	mi R-133a	ACAGCTGGTTGAAGGGACCAA	60
		mi R-133b	T AGCTGGTTGAAGGGACCAA	56
mi R-133b	TTGGTCCCCTT C a t CC c GCTA	mi R-133b	T AGCTGGTTGAAGGGACCAA	59
		mi R-133a	A CAGCTGGTTGAAGGGACCAA	60
mi R-520c	A tAGTGCTTCCTTTTAGA a GGTT	mi R-520c	AACCCTCTAAAAGGAAGCACTTT	60
		mi R-520f	AACCCTCTAAAAGGAAGCACTT	60
		mi R-520b	CCCTCTAAAAGGAAGCACTTT	58
		mi R-526b*	G CCTCTAAAAGGAAGCACTTT	58
mi R-520f ²	t AGTGCTTCCTTTTAGA a GGTT	mi R-520f	AACCCTCTAAAAGGAAGCACTT	60
		mi R-520c	AACCCTCTAAAAGGAAGCACTT	60
		mi R-520b	CCCTCTAAAAGGAAGCACTT	58
		mi R-526b*	G CCTCTAAAAGGAAGCACTT	58
		mi R-520b	CCCTCTAAAAGGAAGCACTTT	60

mi R-520b ²	AAAGTGCTTCCTTTT A AGGG	mi R-520c mi R-526b* mi R-520f mi R-520e	<u>AA</u> CCCTCTAAAAGGAAGCACTTT GCCTCTAAAAGGAAGCACTTT <u>AA</u> CCCTCTAAAAGGAAGCACTT CCCTC AAAA AGGAAGCACTTT	61 59 61 56
mi R-526b*	AAAGT a CTTCCTTTTAGAGGC	mi R-526b* mi R-520c mi R-520b mi R-520f	GCCTCTAAAAGGAAGCACTTT <u>AA</u> CCCTCTAAAAGGAAGCACTTT CCCTCTAAAAGGAAGCACTTT <u>AA</u> CCCTCTAAAAGGAAGCACTT	59 56 56 55
mi R-520h ²	AC g AAGTGCTTCC C TTAGAGT	mi R-520h mi R-520g mi R-519d	ACTCTAAAGGAAGCACTTTGT <u>AC</u> ACTCTAAAGGAAGCACTTTGT <u>AC</u> ACTCTAAAGGGAGGCACTTTG	59 60 54
mi R-520g	ACAAAGT t CTTCCTTT c GAGTGT	mi R-520g mi R-520h mi R-519d	ACACTCTAAAGGAAGCACTTTGT ACTCTAAAGGAAGCACTTTGT ACACTCTAAAGGGAGGCACTTTG	60 56 54
mi R-518c	CAAAGCG C cTCTCTTT c GAGTG	mi R-518c mi R-518f	CACTCTAAAGAGAAGCGCTTTG TCCTCTAAAGAGAAGCGCTTT	57 52
mi R-518f	AAA t CGCTTCTCTTTAG g GGA	mi R-518f mi R-518c	TCCTCTAAAGAGAAGCGCTTT C ACTCTAAAGAGAAGCGCTTT G	58 54

mi R-518f*	CTCTAGAcGGAAGCagTTTCTCT	mi R-518f*	AGAGAAAGTGCTTCCCTCTAGAG	57
		mi R-526a	AGAAAGTGCTTCCCTCTAGAG	54
mi R-526a ²	CTCTAGAGaGAAGCACTTTCT	mi R-526a	AGAAAGTGCTTCCCTCTAGAG	59
		mi R-518f*	<u>AG</u> AGAAAGTGCTTCCCTCTAGAG	60
		mi R-518c*	<u>C</u> AGAAAGTGCTTCCCTCCAGAGA	55
		mi R-526b	<u>AAC</u> AGAAAGTGCTTCCCTCAAGAG	55
Targets and non-targets differ by one or two bases at positions near chain end				
mi R-103	AGCA t CATT c TACAGGGCTATGA	mi R-103	TCATAGCCCTGTACAATGCTGCT	57
		mi R-107	T G ATAGCCCTGTACAATGCTGCT	53
mi R-107	AGCA t CATT c TACAGGGCTATCA	mi R-107	TGATAGCCCTGTACAATGCTGCT	57
		mi R-103	TCATAGCCCTGTACAATGCTGCT	53
mi R-215	ATGACCTAT Gg ATTGAC g GAC	mi R-215	GTCTGTCAATTCATAGGTCAT	57
		mi R-192	GGCTGTCAATTCATAGGTC AG	54
mi R-376b	ATCATAG g GGAAAAT g CATGTT	mi R-376b	AACATGGATTTTCCTCTATGAT	57
		mi R-376a	ACGTGGATTTTCCTCTATGAT	53
mi R-520e	AAAGTGCTTCC a TT g TGAGGG	mi R-520e	CCCTCAAAAAGGAAGCACTTT	59
		mi R-520c	<u>AA</u> CCCTCTAAAAGGAAGCACTTT	53

		mi R-520f	<u>AA</u> CCCTCTAAAAGGAAGCACTT	52
mi R-527	aTGCAAAcGGAAGCCCTTTCT	mi R-527 mi R-520d*	AGAAAGGGCTTCCCTTTGCAG <u>C</u> AGAAAGGGCTTCCCTTTGTAG <u>A</u>	62 57
mi R-18a	TAAGGTGgATCTAGTGCgGATA	mi R-18a mi R-18b	TATCTGCACTAGATGCACCTTA TAACTGCACTAGATGCACCTTA	60 58
mi R-18b	TAAGGTcCATCTAGTGCAGTTt	mi R-18b mi R-18a	TAACTGCACTAGATGCACCTTA TATCTGCACTAGATGCACCTTA	60 57
mi R-23b	ATCACAgTGCCAGaGATTACC	mi R-23b mi R-23a	GGTAATCCCTGGCAATGTGAT GGAATCCCTGGCAATGTGAT	58 52
mi R-27b	TTCACAtTGGaTAAGTTCTGC	mi R-27b mi R-27a	GCAGAACTTAGCCACTGTGAA GCGAACTTAGCCACTGTGAA	57 53
Non-target sequence and probe pair contains interior G-U wobble				
mi R-20a	TAAtGTGCTTATAGTGCAGGTAG	mi R-20a mi R-20b mi R-106a mi R-17-5p	CTACCTGCACTATAAGCACTTTA CTACCTGCACTATGAGCACTTTG <u>G</u> CTACCTGCACTGTAAGCACTTTT <u>A</u> CTACCTGCACTGTAAGCACTTTG	64 61 63 63
mi R-19a	TGTGtAAATCTATGgAAAACCTGA	mi R-19a	TCAGTTTTGCATAGATTTGCACA	59

		mi R-19b	TCAGTTTTGCATGGATTTGCACA	55
mi R-135a	TATGGCTTTTTATTaCTAgGTGA	mi R-135a	TCACATAGGAATAAAAAGCCATA	57
		mi R-135b	CACATAGGAATGAAAAGCCATA	53
mi R-30a-5p	TaTAAACATCCTCGACTaGAAG	mi R-30a-5p	CTTCCAGTCGAGGATGTTTACA	57
		mi R-30d	CTTCCAGTCGGGATGTTTACA	54
mi R-30e-5p	gGTAAACcTCCTTGACTGGA	mi R-30e-5p	TCCAGTCAAGGATGTTTACA	57
		mi R-30a-5p	<u>CT</u> TCCAGTCGAGGATGTTTACA	53
mi R-517c	ATCGTGCATCCTTTTTtGAcTGT	mi R-517c	ACACTCTAAAAGGATGCACGAT	58
		mi R-517a	<u>A</u> ACACTCTAAAAGGATGCACGAT	52
mi R-519e	AAA <u>t</u> GCCTCCTTTTAG <u>t</u> GTGT	mi R-519e	ACACTCTAAAAGGAGGCACTTT	58
		mi R-519d	ACACTCTAAAAGGAGGCACTTT <u>G</u>	52
mi R-29c	T <u>t</u> GCACCATTTGAAATCGGT	mi R-29c	ACCGATTTCAAATGGTGCTA	66
		mi R-29a	<u>A</u> ACCGATTTCAAGATGGTGCTA	62
		mi R-29b	<u>AAC</u> ACTGATTTCAAATGGTGCTA	60

¹ all sequences are shown from 5' to 3' direction.

² miRNAs that are shorter than and identical to another miRNA as shown.

Appendix B

Table B.1 Conserved miRNAs predicted to target both 5' and 3' UTR 8-mers.

miRNA	5' UTR Motif¹	3' UTR Motif¹
<i>hsa-let-7i</i>	GGCGGCAC (0, 48)	CTACCTCA (139, 263), ACTACCTC (63, 160), TTACCTCA (99, 262), GCTACCTC (48, 152), ATTACCTC (40, 156)
<i>hsa-miR-16</i>	GCCAGTGT (1, 53)	TGCTGCTA (124, 380)
<i>hsa-miR-17</i>	GCCTGCAC (0, 66), CCTGCACT (1, 63)	AGCACTTT (190, 601), GCACTTTG (119, 398), AAGCACTT (123, 483), GGCACTTT (64, 276)
<i>hsa-miR-18b</i>	GACTGCGC (0, 54)	GTGCCTTA (147, 271), GCACTTTA (193, 405), TGCACCTT (244, 596), GCACTTTG (119, 398), ATGCACTT (82, 302)
<i>hsa-miR-20a</i>	GCCTGCAC (0, 66), CCTGCACT (1, 63)	GCACTTTA (193, 405), AGCACTTT (190, 601), AAGCACTT (123, 483), GGCACTTT (64, 276)
<i>hsa-miR-20b/93</i>	GCCTGCAC (0, 66), CCTGCACT (1, 63)	AGCACTTT (190, 601), GCACTTTG (119, 398), GGCACTTT (64, 276)
<i>hsa-miR-25</i>	TCAGGCCG (0, 37), CGGGCTGA (1, 69), GACTGAGA (1, 57), GACCGGGG (1, 50)	AGTGCAAT (90, 273), GGTGCAAT (33, 116), AAGTGCAA (81, 306), GTGCAATG (46, 183)
<i>hsa-miR-93</i>	GCCTGCAC (0, 66),	AGCACTTT (190, 601), GCACTTTG (119, 398), GGCACTTT (64, 276)
<i>hsa-miR-106a</i>	GCCTGCAC (0, 66), CCTGCACT (1, 63)	AGCACTTT (190, 601), AAGCACTT (123, 483), GGCACTTT (64, 276)
<i>hsa-miR-125a-3p</i>	CTCCTAGG (0, 47)	GCCTTACT (36, 172)
<i>hsa-miR-128</i>	AGGGGACC (1, 64), GAGACCGG (1, 49)	CACTGTGA (132, 414), TACTGTGA (99, 354)
<i>hsa-miR-133b</i>	TGGCTGGT (1, 51)	GGGACCAA (44, 214)
<i>hsa-miR-139-5p</i>	TGGGGGCA (1, 63)	GTACTGTA (136, 338), TGTACTGT (129, 506), TGCACCTG (90, 418), GTACTGTG (55, 265)
<i>hsa-miR-196a/b</i>	CCCAGCGA (1, 57)	AACTACCT (43, 194)

<i>hsa-miR-199a-3p</i>	GCCAGTGT (1, 53)	ACTACTGT (59, 268)
<i>hsa-miR-199b-3p</i>	GCCAGTGT (1, 53)	ACTACTGT (59, 268)
<i>hsa-miR-202</i>	TCTGTGCC (1, 74)	TATACCTC (35, 161)
<i>hsa-miR-330-5p</i>	CTGAGACA (1, 60)	CTCAGGGA (129, 451)
<i>hsa-miR-362-5p</i>	CTTGCACC (0, 37)	TTCAGGGA (81, 395)
<i>hsa-miR-373</i>	GCCCTGAA (0, 56), CCCCAAGA (1, 49)	AGCACTTT (190, 601), AAGCACTT (123, 483), GGCACTTT (64, 276)
<i>hsa-miR-503</i>	TGCGGGAC (0, 47), AGAGCTGT (1, 54)	TGCTGCTA (124, 380), TTGCTGCT (145, 664)
<i>hsa-miR-506</i>	TGCTCGGG (0,45)	GTGCCTTA (147, 271), GTGCCTTG (133, 355), GGTGCCTT (82, 281), GGTGCTTT (85, 340)
<i>hsa-miR-509-3p</i>	CCCGCAGA (0, 55), ACTCACAG (0, 46), TCTACAGA (0, 38), CCCACAGG (1, 66)	GTGCCAAT (40, 142)
<i>hsa-miR-517a/b</i>	GCGCTCTG (1, 61)	GTGCATGA (38, 170)
<i>hsa-miR-517c</i>	GCGCTCTG (1, 61)	GTGCATGA (38, 170)
<i>hsa-miR-519a</i>	GCGCTCTG (1, 61)	TGCACTTT (244, 596), ATGCACTT (82, 302)
<i>hsa-miR-520a-3p</i>	AGTCCAGA (1, 52)	AAGCACTT (123, 483)
<i>hsa-miR-520d-3p</i>	ACCCACCA (0, 38), CTCGCCGA (0, 37), CGCCAGAG (1, 59)	AAGCACTT (123, 483)
<i>hsa-miR-520g</i>	GCGCTCTG (1, 61)	AGCACTTT (190, 601), GCACTTTG (119, 398), AAGCACTT (123, 483), GGCACTTT (64, 276)
<i>hsa-miR-524-3p</i>	CCGGAGGG (1, 90)	GTGCCTTT (179, 482), GTGCCTTC (107, 361), AGTGCCTT (227, 473), GGTGCCTT (82, 281) AAGTGCCT (196, 430),
<i>hsa-miR-608</i>	GCTGTCCT (0, 70), CGGGGTTG (0, 41)	ACTACCTC (63, 160), CTACCTCT (96, 284), GCTACCTC (48, 152)
<i>hsa-miR-613</i>	GGCGAAGG (0, 64), GGCAAGGG (1, 56)	ACATTCCT (85, 405)
<i>hsa-miR-650</i>	CTGAGGGT (0, 67), TCTGAGGG (1, 75)	GTTGCCTT (66, 319)
<i>hsa-miR-652</i>	GCGACCCT (0, 46), CGACCCTG (0, 44)	TGGTGCTA (116, 272), GGTGCTAT (59, 167), GTGCCATT (61, 277)
<i>hsa-miR-661</i>	TGCGGGCC (0, 59), CGCGTGGG (0, 43), CGTGGGCC (1, 61)	CTCAGGTA (39, 156), ACTCAGGT (37, 175)

<i>hsa-miR-770-5p</i>	GGTTCTGA (0, 44), CTTGGCGC (1, 52), CCTTGGCA (1, 52)	TGGTGCTG (118, 525)
<i>hsa-miR-885-3p</i>	GTCCGCTG (0, 38), TCCAATGC (1, 59), CCACTGCA (1, 58)	TTGCTGCT (145, 664)

¹Numbers within parentheses indicate conserved instances and number of human occurrences

B.1 Sequences used in *hsa-miR-34a* and AXIN2 assay

AXIN2 5'-UTR (NM_004655). Sequence cloned upstream of the luciferase coding region is shown in italics with predicted overlapping binding sites for the 3'-end of miR-34a shown in bold blue italics.

*cggctgtgattggcgcggcgggatcactggctccgcgagcctggcccgggggagtcggctggagc
cggctgcgctttgataaggtcctggcaactcagtaacagcccgagagccgggaaataaaaaaac
ccctcagagcgatggatttcggggccgcccggcgccgagggcggccgcccgaaggccctgctgtaa
aagagaggagggttcagatgagcccctgctgacttgagagagacagagagaccacgccgattgctg
agaggaactggaagaagaaaaatcccagactcagtgggaagagctccctcacc*

AXIN2 3'-UTR (NM_004655). Seed match sites are shown in bold underlined red and

3'-end interaction sites in blue italics. Seed match site with no GU wobble is in caps.

*gccctggggctctggctttgggtgaactggttgagcccgaagctcttgtgaactgtcttggctgtga
gcaactgcgacaaaacattttgaaggaaaattaaaccaatgaagaagacaaagtcctaaggaagaa
t**cggccagt**gggacctcgggagggcggggggaggttgattttcatgattcatgagctgggtactg
actgagataagaaaagcctgaactatttataaaaacatgaccactcttggctattga**agatgct**
gcctgattttgagag**ACTGCCA**tacataatatatgacttcctagggatctgaaatccataaacta
agagaaactgtgtatagcttacctgaacaggaatccttactgatatttatagaacagttgatctc
ccccatccccagtttatggat**atgctgct**ttaaacttgggaagggggagacaggaagtttaattg
ttctgactaaacttaggagttgagctaggagtgcgttcatggtttcttactaacagaggaatta
tgctttgcaactacgtccctccaagtgaagacagactgttttagacagactttttaaagtgtgcc
ctaccattgacacatgcagaaattgggtgctgtttgttttttttttctatgctgctctgttttg
tcttaaaggctctgaggggtgaccatgttgcgtcatcatcaacattttgggggttggttgatg
ggatgatctgttgagagggagagggcaggggaacctgctcctcggggcccaggttgatcctgtg
actgaggctccccctcatgtagctccccagggcccagggcccagggcctgctagaat**cactgcc**
gctgtgctttcgtggaaatgacagttccttggtttttttgtttctgtttttgttttacattagtc
attggacc**acagcca**tcaggaactaccccctgccccacaaagaaatgaacagttgtagggagac
ccagcagcacctttcctccacacaccttcattttgatgttcgggtttttgtgttaagttaatctg
tacattctgtttgccattgttacttgtactatacatctgtataatagtgtagggcaaaagagatt
aatccactatctctagtgtcttgactttaaatcagtacagctacctgtacctgcacggtcaccgct
ccgtgtgtcgcctatattgagggctcaagctttcccttggttttttgaaaggggtttatgtataa
atatattttatgcctttttattacaagctttgtactcaatgacttttgtcatgacattttgttct
acttatactgtaaatatgcattataaagagttcatttaaggaaaattacttggtacaataatta
ttgtaattaagagatgtagcctttattaaaattttatatttttcaaaa*

B.2 Multiple alignments of AXIN2 UTRs

B.2.1 Alignment of Axin2 5'-UTR sequences from 4 mammalian species (CLUSTAL

2.0.8 multiple sequence alignment). Predicted 5'-UTR target sites for the 3'-end of miR-

34a are shown in bold blue italics.

```

Human  -----CGGCTGTGATTGGCGCGGCGGGATCACTGGCTCCGCGAGC  40
Dog    -----
Mouse  GCGCGGCGGGATCACTGGCTCCCCGAGCCCGGCCCGGGGGAGTCGGCTGGAGCCGGCTGC  60
Rat    -----

Human  CTGGCCCGGGGGAGTCGGCTGGAGCCGGCTGCGCTTTGATAAGGTCCTGGCAACTCAGTA  100
Dog    -----
Mouse  GCTTTGATAAGGTCCTGGCAACTCAGTAACAGCCCAAGAACCGGGAAATAAAAATAAGCA  120
Rat    -----

Human  ACAGCCCGAGAGCCGGGAAATAAAAATAACCCCTCAGAGCGATGGATTTCTGGGGCCGCCC  160
Dog    -----
Mouse  GCCGTTTCGCGATGGATTTCTGGGGCCACCCGGAGGCCGAGGCGTCCGCCTCCCCAAAGGAG  180
Rat    -----

Human  GGCGGCCGAGGCGCCCGCCGAAGGCCCTGCTGTAAAAGAGAGGAGGTTTCAGATGAGCCCC  220
Dog    -----
Mouse  AGCTTTGCTGTAAAAGAGAGGAGGCTCACATGAGCCCCTGCTGACTTAAGAGAGACCAAG  240
Rat    -----

Human  TGCTGACTTGAGAGAGACAGAGAGACCACGCCGATTGCTGAGAGGAACTGGAAGAAGAAA  280
Dog    -----GAGAGAGAAAGAGAGACCACGCTGATTGCTGAGAGGAACTGGGGGAAGGGA  51
Mouse  CCGATTGCTGAGAGGAACTGGAAGAAGAAAAAGGAGGAGGAGGGAAAA-AAAGCAAACA  299
Rat    -----TGAGAGGAACTGGAAGAAGAAAAAGGAAGAGGAAAAAAAA-AAAGCAAACA  51
                ***** * * *** * * * ** ** ** **

Human  AATCCCAGACTCAGTGGGAAGAGCTCCCTCACC  314
Dog    ACAAACAAACTCCGTCGCGAAGAACTCCCTCACC  85
Mouse  AAATCCAAACTCAGT-GAGACGCTCTCCCTCACC  332
Rat    AAACCCAAACTCAGT-GAGACGCTCTCCCTCACC  84
                * * * * * ** * *****

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B.2.2 Alignment of Axin2 3'-UTR sequences from 4 mammalian species (CLUSTAL

2.0.8 multiple sequence alignment). Predicted seed match sites are shown in bold red and

the 3'-end interaction sites in blue italics.

```

Human -----GCCCTGGGGTCTGGCTTTGGTGAAGTGTGGAGCCCGAAG 40
Dog -----GCCTCGGGGGTTCGGGCCCGGCGGACGC---GGGGCCACCG 38
Mouse CCTTGGCCTCCTCGGCGTGCAACCTGGGCAAGCACCTCGGCGTGCACCATGGAGCCGAAG 60
Rat CCTCGGCCTCCGCCGCGTGCA-CCTCCGCGTGCACCTCCGCGTGCACCACGGAGCCGGAG 59
          * * * * * * * * * *

Human CTC-TTGTGAAGTGTCTTGGCTGTGAGCAACTGCGACAAAACATTTTGAAGGAAAATTAA 99
Dog CCC-GCGCCACCAGCCTGGGCCATGACCGACCGGACGAGACCTTTTGAAGGAAAACGAA 97
Mouse CCCAGAGAC-CCTGTCTCAGGCCTACGCAACAGCCACGAAATATTCTGAAGGAAAATGAA 119
Rat CCCAGAGAGACCTGTCTCAGGCCTACACAACAGCCATGAAATATTTTGAAGGAAAATGAA 119
  * * * * * * * * * * * * * * * * * * * * * * * * * * * * * *

Human ACCAATGAAGAAGACAAAGTCTAAGGAAGAATCGGCCAGTGGGCCTTCGGGA-----GG 153
Dog ACCAATGAAGAAGACAGAGTCTAGGGAAGACTTGGCCACTGGCCACGCGGGGAGGGCGGG 157
Mouse ACCAATTAAGAAGACAAAGCCTAGGGAGGGACTGGCGCCTGGGCCTTCAGGA-----G 172
Rat ACCAATTAAGAAGACAAAGCCTAGGGAGGGACTGGCCCCTGGGCCTTCAGGA-----G 172
  * * * * * * * * * * * * * * * * * * * * * * * * * * * * *

Human GCGGGGGGAGGTTGATTTTCATGATTCATGAGC-TGGGTACTGACTGAGATAAGAAAAGC 212
Dog GAGGGGGGAGGTTGGTTTTTCATTATTCACGAGC-TGGGTACT----GAGATAAGAAAAGC 212
Mouse GGCGGGGGTAGTTGATCTTCAGTCTCCAGGAGCCTGGGTACC----GAGATGAGAAAAGC 228
Rat GGCGGGGGTGGTTGGTTTTCAATATCCACGAGC-TGGGTACT----GAGATCAGAAAAGC 227
  * * * * * * * * * * * * * * * * * * * * * * * * * * * * *

Human CTGAAGTATTTATTAATAAACATGACCACTCTTGGCTATTGAAGATGCTGCCTGTATTTGA 272
Dog CTGAAGTATTTATTAATAAACATGACCACTCTTGGCTATTGAAGATGCTGCCTGTATTTGA 272
Mouse CTGAAGTATTTATTAATAAACATGACCACTCTGGGCTATAGAAGATGCTGAGTGTGTTTGA 288
Rat CCGAAGTATTTATTAATAAACATGACCACTCTGGGCTATAGAAGATGCTGAGTGC--TCGA 285
  * * * * * * * * * * * * * * * * * * * * * * * * * * * * *

Human GAGACTGCCATACATAATATATGACTTCCTAGGGATCTGAAATCCATAAACTAAGAGAAA 332
Dog GAGACTGCCATACATAATATATGACTGCCTAGGGATCTGAAATCCATAAACTAAGAGAAA 332
Mouse GAGACTGACATACATAATAGATGACTTCCTAGGGTTCTGAAATTCATAGACTAAGAGAAA 348
Rat GAGACTGCCATACATAATAGATGGCTTCCTAGGGATCTGAAATCCATAGACTAAGAGAAA 345
  * * * * * * * * * * * * * * * * * * * * * * * * * * * * *

Human -CTGTGTATAGCTTACCTGAACAGGAATCCTTACTGATATTTATAGAACAGTTGATTTCC 391
Dog -CTGTGTATAGCTTACCTGAACAGGAGTCCTTACTGCTATTTATTGAACAATTGATTCCC 391
Mouse ACTGTGTATAGCTTGCCCGAACAGGAGTCCTTACTGATATTTATTGAACAGTCGATTCCC 408
Rat ACTGTGTATAGCTTGCCCGAACAGGAGTCCTTACTGATATTTATTGAACAGTCGATTCCC 405
  * * * * * * * * * * * * * * * * * * * * * * * * * * * * *

Human CC-----CA-TCCCCAGTTTATGGAT-ATGCTGCTTTT-AAACTTGGAAAG 432
Dog CC-----CAGCCCCAGTTTATGGAT-ATGCTGCTTTT-AAACACGGAAG 433
Mouse CTACCCGCC-----CTCCCTACCCCCAGCCCCAGTTTATGCTGCTTTTAAACCTGGAAG 463
Rat CTACCCCACTCCCACCCCAACCCCAACCCCAAGTTTATGCTGCTTTT-AAACCTGGAAA 464
  * * * * * * * * * * * * * * * * * * * * * * * * * * * * *

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Human GGGGAGACA---GGAAGTTTTAATTGTTCTGACTA----AACTTAGGAGTTGAGCTAGGA 485
Dog GGGGAGAGGAGGGGAAGTTTTAATTGTCCTATCTATCCCAGCTTGGGAGTGGAGCGAGGG 493
Mouse TGGGAGTGA----GAAGTTTGGATTG--CTGTCCA----CGCTTAGGAGCCAAGCCGGGA 513
Rat TGAGAGAGA----GAAGTTTGGTTTG--CTGTCTA----TGCTTAAGAGCCAAGCCGGGA 514
* ** * ** * ** * ** * ** * ** * ** * ** * ** * **

Human GTGCGTTCATGGTTTCTTCACTAACAGAGGAATTAT---GCTTTGCACTACGTCCCTCCA 542
Dog GCGCGTTAATGATTTCTTCGTTAAGAGGGGAATTATTATGCTTGGCCCTGCATTTCTCCG 553
Mouse ATGCATTAATCATTTCCTTCGTTAACAGAGGAATCT---GCTCTGCATGGCATTTCCTCCA 569
Rat ACGCATTAAATCATTTCCTTCGTTAACAGAGGAATCC---GCTCTGCATGGCATTTCCTCCA 570
* ** * ** * ** * ** * ** * ** * ** * ** * ** * **

Human AGTGAAGACAGACTGTTTTAGACAGACTTTTTAAAATGGTG--CCCTACCATTGACACAT 600
Dog AGTGAGGATAGACT-----TGTTTTAAATGGTG--CCCTACCATTAACACAC 597
Mouse AGTGAAGACAGGCTTCTTTTTTTTTTTTTTAAATGGTGCCCGCCCCACCCATCGACACAT 629
Rat AGTGAAGACAGGCTTCTTTAC----- 591
***** ** ** **

Human GCAGAAATTGGTGCCTTTTTGTTTTTTTTTTTCCCTATGCTGCTCTGTTTTGTCT-TAAAGG 659
Dog GC-GAAATTGGTGCATTTTTTTTTTTTTTTTCCCTATGCTGCTCTGTTTTGTCT-TAAAGG 655
Mouse GCAGAAATGGGTCACCCCCACCCACCCACCCCGCCATGCTGCTCTGCTTGTACACG 689
Rat -----

Human TCTTGAGGGTTGACC-ATGTTGCGTCATCATCAACATTTTGGGG-GTTGTGTTGGATGGG 717
Dog TCTTGAGGATTGATTTATGTTGCAACATCACCGCCATTTGGGGCCATCGTGTGGGACTGG 715
Mouse ACGTCCTGTGGGTTGGTTGTGACAGCATCTTACCACCTTTGGGG----- 733
Rat -----

Human ATGATCTGTTGCAGAGGGAGAGGCAGGGAACCTGCTCCTTCGGGCCCCAGGTTGATCCT 777
Dog ATCCATCGT--GAGGGTGGGAGGGGGGAAGCCTCATTTGGAGGACCCAGATTAACTCT 773
Mouse ----ACCATCCAGAGTGGGGGAGTGGGGGAGACTTACCCTGGAGCCAAAGGCTA----- 784
Rat -----

Human G--TGACTGAGGCTCCCCCTCATGTAGCCTCCCCAGGCCAGGGCCCTGAGGCCTGCTAG 835
Dog AACTTCTCTTAACTCCCCACCAAGG-----CCCAGTGTCCAGTGCC-TGAGGCCCTAG 827
Mouse -----CACCGTACGTGTAGTCCCAGAGCCCCTGTCAC 814
Rat -----

Human AATC---ACTGCCGCT-GTGCTTTCGTGGAAATGACAGTTCCTTGTTTTTTTTTGTT--- 887
Dog AACCTTGTAGTTCAACTCGTGCTTGTATCGAAACAACAGTTCCTTGGAGTGTGGTTGGT 887
Mouse AGCC---CTTGTGGTTCAAGCTTCTTCTGCCTCTTTAGGAAGTGAGGGTTTCTTGT--- 867
Rat -----

Human ---TCTGTTTTTGTTTTACATTAGTCATTGGACCACAGCCAATTCAGGAA-----CTAC 937
Dog TGGTTGATTTTCATTTTTAAATTAGTCTTTGGACCACCACCATTCTGGAAACCACCACCAC 947
Mouse -----TCTCCTTTAAAAATCAGTCTCTAGACTACGGCCATCAGGAAT-----CTAC 913
Rat -----

Human CC-CCTGCCCCACAAAGAAATGAACAGTTGTAGGGAGACCCAGCAGCACC-TTTCCTCCA 995
Dog CCGCTTGCCCTGCAAAGAAGCGGACAGTTGTGGGAAGACCTAGCAGCACCCTTTCCTCCA 1007
Mouse CC-----TCGCCCACCTGACCCTGCGAGGACACGGGCACCCAGCAGCACCCTCTCCTCTGT 968
Rat -----

Human CACACCTTCATTTTGGATGTTTCGGGTTTTTGTGTTAAGTTAATCTGTACATTCTGTTTGCC 1055
 Dog GACACCTTCATTTTGGACGTTTCGGGTTTTTGTGTTAAGTTAATCTGTACATTCTGTTTGCC 1067
 Mouse TACCTTCCCCTTGGCGATCGCTCGGGTTTTGTGTTAAGTTAATCTGTATGTCCTGTCTGCC 1028
 Rat -----

Human ATTGTTACTTGTACTATACATCTGTATATAGTGTACGGCAAAAGAGTATTAATCCACTAT 1115
 Dog ATTGTTACCTGTACTATACGTCTGTATATATTGTACGACAGAAGAGTATTAATCCACTAT 1127
 Mouse AGCGTTCCTGTACTATAGGCCTGTGTATAGTGTAGGGCA---GAGCGTTGACCCACTGG 1085
 Rat -----

Human CTCTAGTGCTTGACTTTA-AATCAGTACAGTACCTGTACCTGCACGGTCACCCGCTCCGT 1174
 Dog CTCTAGTGCTTGACTTGA-AATCAGTACAGTACCTGTACCTGCACGGCGCCCCGCTCCGT 1186
 Mouse CT--AGTGCTTGACTTGGGAATCAGGACAGTACCTGTACAGGCACGGGGACCCGCTCCGT 1143
 Rat -----

Human ----GTGTCGCCCTATATTGAGGGCTCAAGCTTCCCTTGTTTTTTGAAAGGGGTTTATG 1230
 Dog ----GTGTCGCCCTATATTGAGGGCTCCAACCTTCCCTTGTTTTTTGAAAGGGGTTTATG 1242
 Mouse CCGTGCGCCGCCCTATATTGAGGGCTCCAGCTCTCCCTTGTTTTTTGAAAGGGGTTTATG 1203
 Rat -----

Human TATAAATATATTTTATGCCTTTTTATTACAAGTCTTGT-ACTCAATGACTTTTGTTCATGA 1289
 Dog TATAAATATATTTTATGCCTTTTTATTACAAGTCTTGT-ACTCAATGACTTTTGTTCATGG 1301
 Mouse TATAAATATATTTTATGCCTTTTTATTACAAGTCTTGTACTCAATGACTTTTGTTCATGG 1263
 Rat -----

Human CATTTTGTCTACTT-ATACTGTAAATTATGCATTATAAAGAGTTCATTTAAGGAAAATT 1348
 Dog CATTTTGTCTACTT-ATACTGTAAATTATGCATTATAAAGAGTTCATTTAAGGAAAATT 1360
 Mouse CAGTTTGTCTACTTTAGACTGTAAATTATGCATTATAAAGAGTTCATTTAAGGAAAATT 1323
 Rat -----

Human ACTTGGTACAATAATTATTGTAATTAAGAGATGTAGCCTTTATTTAAATTTTATATTTTT 1408
 Dog ACTTGGTACAATAATTATTGTAATTAAGAGATGTAGCCTTTATTTAAATTTTATATTTTT 1420
 Mouse ACTTGGTACAATAATTATTGTAATTAAGAGATGTAGCCTTTATTTAAATTTTATATTTTT 1383
 Rat -----

Human CAAAA 1413
 Dog C---- 1421
 Mouse C---- 1384
 Rat -----

B.3 Sequences used in lin28 assay

lin28, miRNA, and siRNA sequences used in reporter gene assays are shown below.

Predicted binding sites and miRNA interaction sites are in bold; mutated sites are in bold small case.

lin28 3UTR with perfectly matched site (3Upm, wild-type sequence)

5'- CACCTACCTCCTCAAATTGCACTCTC**AGGG**ATTCTTTTTTTTTTTCAAATAGAACT- 3'

lin28 3UTR with imperfectly matched site (3Umm)

5'- CACCTACCTCCTCAAATTGCACTCTC**Att**tATTCTTTTTTTTTTTCAAATAGAACT- 3'

lin28 5UTR with perfectly matched target site (5Upm)

5'- GTGGTATTGTTGTTCTGT**Aagccac**ATAGGTTGTATTCTCTAGTTAACACATAGT- 3'

lin28 5UTR with mismatched site (5Umm, wild-type sequence)

5'- GTGGTATTGTTGTTCTGT**TAT**TTTGATAGGTTGTATTCTCTAGTTAACACATAGT- 3'

cel-lin-4 miRNA 5'- **UCCUGAGACCU**CAAGUGUGA - 3'

lin4msiRNA 5'- **UCCUGAGACCUgugGcuUgA** - 3' (functional strand)
5'- AAGCCACAGGUCUCAGAAGUU - 3' (opposing strand)

hsa-miR-16 5'- UAGCAGCACGUAAAUAUUGGCG - 3'

Appendix C

C.1 GO-term analysis for genes containing targeted uAUGs

C.1.1 Genes containing uAUGs in Table 4.1 (Total 1071)

<i>AICF</i>	<i>ARF6</i>	<i>B4GALT2</i>	<i>C14orf100</i>	<i>CASD1</i>	<i>CITED2</i>	<i>CRYAB</i>
<i>ABCF2</i>	<i>ARHGEF12</i>	<i>BACH2</i>	<i>C14orf147</i>	<i>CASK</i>	<i>CKAP5</i>	<i>CRYGC</i>
<i>ABCG1</i>	<i>ARHGEF9</i>	<i>BAIL1</i>	<i>C15orf41</i>	<i>CASP8AP2</i>	<i>CLCF1</i>	<i>CSDE1</i>
<i>ACCN1</i>	<i>ARID4A</i>	<i>BALAP2</i>	<i>C18orf1</i>	<i>CBLL1</i>	<i>CLCN3</i>	<i>CSK</i>
<i>ACTL6B</i>	<i>ARL15</i>	<i>BALAP2L2</i>	<i>C1orf119</i>	<i>CBX4</i>	<i>CLCN5</i>	<i>CSMD3</i>
<i>ACTR1A</i>	<i>ARL4C</i>	<i>BANF1</i>	<i>C1orf164</i>	<i>CBX6</i>	<i>CLDN23</i>	<i>CSNK1D</i>
<i>ACVR2A</i>	<i>ARL5A</i>	<i>BAP1</i>	<i>C1orf25</i>	<i>CBX7</i>	<i>CLDND1</i>	<i>CSNK2A1</i>
<i>ADC</i>	<i>ARL8A</i>	<i>BARHL1</i>	<i>C1orf27</i>	<i>CBX8</i>	<i>CLIC1</i>	<i>CSNK2A2</i>
<i>ADCK1</i>	<i>ARNTL</i>	<i>BARHL2</i>	<i>C1orf76</i>	<i>CCDC109A</i>	<i>CMTM4</i>	<i>CTDSP1</i>
<i>ADIPOR1</i>	<i>ARPC4</i>	<i>BAT1</i>	<i>C1QL2</i>	<i>CCDC53</i>	<i>CNIH2</i>	<i>CTDSPL2</i>
<i>ADRA1B</i>	<i>ARPC5</i>	<i>BBC3</i>	<i>C20orf24</i>	<i>CCNB2</i>	<i>CNKSR2</i>	<i>CTNNA2</i>
<i>ADRA2C</i>	<i>ASB8</i>	<i>BBX</i>	<i>C20orf67</i>	<i>CCND1</i>	<i>CNOT4</i>	<i>CTNNBIP1</i>
<i>ADRM1</i>	<i>ASCC2</i>	<i>BCL11A</i>	<i>C2orf25</i>	<i>CCNI</i>	<i>CNOT7</i>	<i>CTNND1</i>
<i>AFTPH</i>	<i>ASH1L</i>	<i>BCL11B</i>	<i>C2orf33</i>	<i>CCNJ</i>	<i>CNTN4</i>	<i>CUL5</i>
<i>AGBL5</i>	<i>ASPH</i>	<i>BCL3</i>	<i>C3orf10</i>	<i>CD2AP</i>	<i>CNTN6</i>	<i>CUX1</i>
<i>AHSA1</i>	<i>ATAD2B</i>	<i>BCL6</i>	<i>C4orf18</i>	<i>CD37</i>	<i>COIL</i>	<i>CXorf6</i>
<i>AJAP1</i>	<i>ATF4</i>	<i>BCL7C</i>	<i>C5orf41</i>	<i>CDC2L1</i>	<i>COL1A1</i>	<i>CYBA</i>
<i>AKR1B10</i>	<i>ATF7</i>	<i>BCOR</i>	<i>C5orf5</i>	<i>CDH24</i>	<i>COL3A1</i>	<i>DAB1</i>
<i>ALDOA</i>	<i>ATG5</i>	<i>BDNF</i>	<i>CA10</i>	<i>CDH8</i>	<i>COL4A1</i>	<i>DCTN2</i>
<i>ALX1</i>	<i>ATG9A</i>	<i>BDP1</i>	<i>CABIN1</i>	<i>CDK5RAP3</i>	<i>COLQ</i>	<i>DDEF2</i>
<i>AMD1</i>	<i>ATOH8</i>	<i>BHLHB3</i>	<i>CABYR</i>	<i>CDX1</i>	<i>COPS3</i>	<i>DDX25</i>
<i>AMFR</i>	<i>ATP10A</i>	<i>BHLHB5</i>	<i>CACNA1E</i>	<i>CDYL2</i>	<i>COPS4</i>	<i>DGCR2</i>
<i>AMPH</i>	<i>ATP2A2</i>	<i>BMP2</i>	<i>CACNA1G</i>	<i>CENTA2</i>	<i>CPEB3</i>	<i>DGCR8</i>
<i>ANKFY1</i>	<i>ATP2C1</i>	<i>BMP2K</i>	<i>CACNA2D2</i>	<i>CENTD1</i>	<i>CPSF3</i>	<i>DGKI</i>
<i>ANKH</i>	<i>ATP8A2</i>	<i>BMP6</i>	<i>CACNG3</i>	<i>CFL1</i>	<i>CRABP1</i>	<i>DGKZ</i>
<i>ANKS1A</i>	<i>ATXN1</i>	<i>BMPER</i>	<i>CADM1</i>	<i>CHD2</i>	<i>CRBN</i>	<i>DHCR24</i>
<i>ANP32A</i>	<i>ATXN3</i>	<i>BRD2</i>	<i>CALB2</i>	<i>CHD4</i>	<i>CREB1</i>	<i>DICER1</i>
<i>ANP32B</i>	<i>ATXN7</i>	<i>BRD4</i>	<i>CALU</i>	<i>CHMP7</i>	<i>CREB3L2</i>	<i>DLX1</i>
<i>ANP32E</i>	<i>AZIN1</i>	<i>BTBD10</i>	<i>CAMK2B</i>	<i>CHST11</i>	<i>CREBL2</i>	<i>DLX3</i>
<i>AP1G1</i>	<i>B3GALNT2</i>	<i>BTG1</i>	<i>CAMK2G</i>	<i>CHSY1</i>	<i>CRK</i>	<i>DLX5</i>
<i>ARF1</i>	<i>B3GALT2</i>	<i>C13orf7</i>	<i>CAPRIN1</i>	<i>CHUK</i>	<i>CRKRS</i>	<i>DNAJA2</i>
<i>DNAJB12</i>	<i>DOC2A</i>	<i>DOK5</i>	<i>DOK7</i>	<i>DOT1L</i>	<i>DPYSL2</i>	<i>DSCAM</i>
<i>DNAJB5</i>	<i>DOC2B</i>	<i>DOK6</i>	<i>DOLPP1</i>	<i>DPP4</i>	<i>DRP2</i>	<i>DSG1</i>

<i>DTNA</i>	<i>ENAH</i>	<i>FLRT3</i>	<i>GRK1</i>	<i>HOXD9</i>	<i>KCND2</i>	<i>LCE1B</i>
<i>DTX3</i>	<i>ENTPD7</i>	<i>FMO1</i>	<i>GSC</i>	<i>HPCA</i>	<i>KCNH2</i>	<i>LCE1E</i>
<i>DULLARD</i>	<i>EPC1</i>	<i>FMR1</i>	<i>GTF3C2</i>	<i>HR</i>	<i>KCNIP1</i>	<i>LCE3D</i>
<i>DUSP15</i>	<i>EPHA3</i>	<i>FOXA1</i>	<i>GTPBP1</i>	<i>HRB</i>	<i>KCNJ2</i>	<i>LCORL</i>
<i>DUSP16</i>	<i>EPHA4</i>	<i>FOXG1</i>	<i>HAND1</i>	<i>HS2ST1</i>	<i>KCNJ8</i>	<i>LDB1</i>
<i>DUSP6</i>	<i>EPHB2</i>	<i>FOXJ1</i>	<i>HCCA2</i>	<i>HS6ST1</i>	<i>KCNK3</i>	<i>LDB2</i>
<i>DVL3</i>	<i>ERF</i>	<i>FOXJ3</i>	<i>HCN2</i>	<i>HS6ST3</i>	<i>KCNN3</i>	<i>LDLRAP1</i>
<i>DYRK1A</i>	<i>ERGIC3</i>	<i>FOXN3</i>	<i>HDAC2</i>	<i>HSD11B2</i>	<i>KCNN4</i>	<i>LEPROTL1</i>
<i>DYRK1B</i>	<i>ERRF11</i>	<i>FRS2</i>	<i>HDAC4</i>	<i>HSDL1</i>	<i>KCNS2</i>	<i>LG11</i>
<i>EBF1</i>	<i>ETF1</i>	<i>FRS3</i>	<i>HDAC5</i>	<i>HSP90AB1</i>	<i>KCNS3</i>	<i>LHX5</i>
<i>EDA</i>	<i>ETV1</i>	<i>FURIN</i>	<i>HDGFRP3</i>	<i>ICK</i>	<i>KCTD10</i>	<i>LIN28</i>
<i>EDC4</i>	<i>ETV2</i>	<i>FYN</i>	<i>HEATR3</i>	<i>ID2</i>	<i>KCTD15</i>	<i>LMO1</i>
<i>EEF1D</i>	<i>ETV5</i>	<i>G3BP1</i>	<i>HELZ</i>	<i>ID3</i>	<i>KCTD17</i>	<i>LMO2</i>
<i>EEF1G</i>	<i>EXOC1</i>	<i>GABRB2</i>	<i>HERC4</i>	<i>IHPK1</i>	<i>KHDRBS3</i>	<i>LMO4</i>
<i>EFNA1</i>	<i>EXOC5</i>	<i>GABRG2</i>	<i>HERPUD2</i>	<i>IKZF1</i>	<i>KHK</i>	<i>LOXL1</i>
<i>EFNA3</i>	<i>EXT1</i>	<i>GADD45A</i>	<i>HES1</i>	<i>IL1RAPL1</i>	<i>KIAA0082</i>	<i>LRFN2</i>
<i>EFNA5</i>	<i>EYA1</i>	<i>GALNT7</i>	<i>HEXIM1</i>	<i>IL7</i>	<i>KIAA0427</i>	<i>LRP2</i>
<i>EFNB1</i>	<i>FA2H</i>	<i>GATAD2B</i>	<i>HGS</i>	<i>ILK</i>	<i>KIAA0562</i>	<i>LRRC4</i>
<i>EFTUD2</i>	<i>FAF1</i>	<i>GDF5</i>	<i>HHIP</i>	<i>ING3</i>	<i>KIAA1219</i>	<i>LRRC4C</i>
<i>EGLN2</i>	<i>FAM110B</i>	<i>GGNBP2</i>	<i>HIP1R</i>	<i>INHBA</i>	<i>KIAA1715</i>	<i>LRRTM3</i>
<i>EHBP1</i>	<i>FAM129A</i>	<i>GJB1</i>	<i>HIP2</i>	<i>INHBB</i>	<i>KIF3C</i>	<i>LRRTM4</i>
<i>EIF1</i>	<i>FAM33A</i>	<i>GLIS3</i>	<i>HMBOX1</i>	<i>INPP5A</i>	<i>KIF5B</i>	<i>LTBP1</i>
<i>EIF1B</i>	<i>FAM70A</i>	<i>GNA11</i>	<i>HMG2L1</i>	<i>IPO13</i>	<i>KIT</i>	<i>LUC7L</i>
<i>EIF2S2</i>	<i>FAM98A</i>	<i>GNAI2</i>	<i>HMGB1</i>	<i>IRF2</i>	<i>KITLG</i>	<i>LYAR</i>
<i>EIF3B</i>	<i>FBXL3</i>	<i>GNAI3</i>	<i>HMGB3</i>	<i>IVNS1ABP</i>	<i>KLF12</i>	<i>MAFB</i>
<i>EIF4A2</i>	<i>FBXL4</i>	<i>GNAT1</i>	<i>HNRNPC</i>	<i>JAK1</i>	<i>KLF13</i>	<i>MAG13</i>
<i>EIF4G2</i>	<i>FBXO42</i>	<i>GNAZ</i>	<i>HNRNPR</i>	<i>JAKMIP2</i>	<i>KLF4</i>	<i>Magmas</i>
<i>EIF4G3</i>	<i>FBXW11</i>	<i>GOLM4</i>	<i>HNRPAB</i>	<i>JARID2</i>	<i>KLF7</i>	<i>MAML3</i>
<i>EIF4H</i>	<i>FBXW2</i>	<i>GPBP1</i>	<i>HOXA1</i>	<i>JAZF1</i>	<i>KLF9</i>	<i>MAP2K2</i>
<i>EIF5A</i>	<i>FEM1B</i>	<i>GPD1L</i>	<i>HOXA11</i>	<i>JDP2</i>	<i>KLHL10</i>	<i>MAP3K11</i>
<i>EIF5A2</i>	<i>FEN1</i>	<i>GPHN</i>	<i>HOXA3</i>	<i>JMJD1A</i>	<i>KLHL18</i>	<i>MAP3K2</i>
<i>ELAVL1</i>	<i>FEV</i>	<i>GPR26</i>	<i>HOXA4</i>	<i>JMJD1C</i>	<i>KLHL20</i>	<i>MAP3K7IP2</i>
<i>ELAVL2</i>	<i>FEZF2</i>	<i>GPR61</i>	<i>HOXA9</i>	<i>JPH1</i>	<i>KLHL24</i>	<i>MAPK1</i>
<i>ELK3</i>	<i>FGD1</i>	<i>GPR85</i>	<i>HOXA13</i>	<i>JPH4</i>	<i>KLHL28</i>	<i>MAPK10</i>
<i>ELL2</i>	<i>FGD6</i>	<i>GPSM2</i>	<i>HOXB3</i>	<i>JUN</i>	<i>KPNA3</i>	<i>MAPK8IP3</i>
<i>ELOVL1</i>	<i>FGF14</i>	<i>GRIA2</i>	<i>HOXB6</i>	<i>KATNB1</i>	<i>KPNA4</i>	<i>MAPKAP1</i>
<i>ELOVL6</i>	<i>FGF8</i>	<i>GRIA3</i>	<i>HOXC13</i>	<i>KBTBD4</i>	<i>KRTAP4-5</i>	<i>MARCKS</i>
<i>EML5</i>	<i>FGFR1</i>	<i>GRID1</i>	<i>HOXC6</i>	<i>KBTBD8</i>	<i>LAD1</i>	<i>MAST1</i>
<i>EMX2</i>	<i>FIS1</i>	<i>GRIN2A</i>	<i>HOXC8</i>	<i>KCNA4</i>	<i>LASS6</i>	<i>MATR3</i>
<i>EN1</i>	<i>FLII</i>	<i>GRIPAP1</i>	<i>HOXD4</i>	<i>KCNB1</i>	<i>LBX1</i>	<i>MAX</i>

<i>MBD2</i>	<i>MTPN</i>	<i>NRN1</i>	<i>PDE1B</i>	<i>PLEKHA2</i>	<i>PSMB3</i>	<i>RBM12B</i>
<i>MBNL1</i>	<i>MYBL2</i>	<i>NRSN1</i>	<i>PDE7B</i>	<i>PLK3</i>	<i>PSMC4</i>	<i>RBM18</i>
<i>MBNL2</i>	<i>MYBPC1</i>	<i>NRXN2</i>	<i>PDGFA</i>	<i>PLP1</i>	<i>PSME3</i>	<i>RBM39</i>
<i>MBOAT2</i>	<i>MYC</i>	<i>NRXN3</i>	<i>PDGFC</i>	<i>PLSCR3</i>	<i>PTEN</i>	<i>RCAN2</i>
<i>MBTD1</i>	<i>MYL3</i>	<i>NTF5</i>	<i>PDPK1</i>	<i>PNKD</i>	<i>PTGES3</i>	<i>REEP1</i>
<i>MBTSP1</i>	<i>MYST2</i>	<i>NTNG1</i>	<i>PDXDC1</i>	<i>PNRC2</i>	<i>PTP4A1</i>	<i>REEP5</i>
<i>MCF2</i>	<i>MYST3</i>	<i>NTRK3</i>	<i>PDZD2</i>	<i>POLR3F</i>	<i>PTPLAD1</i>	<i>RELA</i>
<i>MCRS1</i>	<i>MYST4</i>	<i>NUDT3</i>	<i>PELI2</i>	<i>PORCN</i>	<i>PTPN23</i>	<i>RELL2</i>
<i>MED31</i>	<i>MYT1</i>	<i>NUMBL</i>	<i>PEX11B</i>	<i>POU2F1</i>	<i>PTPRK</i>	<i>REPS2</i>
<i>MED7</i>	<i>NAP1L1</i>	<i>NUS1</i>	<i>PEX5</i>	<i>POU2F2</i>	<i>PUM2</i>	<i>RER1</i>
<i>MEF2C</i>	<i>NAT12</i>	<i>NUTF2</i>	<i>PFN1</i>	<i>POU4F2</i>	<i>PVRL4</i>	<i>REV1</i>
<i>MEIS1</i>	<i>NBR1</i>	<i>NXN</i>	<i>PGM5</i>	<i>POU6F2</i>	<i>PYGO2</i>	<i>RFTN2</i>
<i>MEMO1</i>	<i>NCK2</i>	<i>OAZ2</i>	<i>PGRMC1</i>	<i>PPAP2A</i>	<i>RAB10</i>	<i>RGL2</i>
<i>MEN1</i>	<i>NCOA2</i>	<i>ODF2</i>	<i>PH-4</i>	<i>PPAPDC3</i>	<i>RAB13</i>	<i>RHOA</i>
<i>METTL3</i>	<i>NDEL1</i>	<i>OPA3</i>	<i>PHACTR1</i>	<i>PPARGC1A</i>	<i>RAB14</i>	<i>RHOB</i>
<i>MEX3C</i>	<i>NDUFAB1</i>	<i>ORMDL2</i>	<i>PHACTR3</i>	<i>PPFIA2</i>	<i>RAB1A</i>	<i>RHOBTB2</i>
<i>MFSD2</i>	<i>NEK11</i>	<i>OTUB1</i>	<i>PHEX</i>	<i>PPM1A</i>	<i>RAB2A</i>	<i>RHOG</i>
<i>MGAT2</i>	<i>NEK6</i>	<i>PACSI</i>	<i>PHF1</i>	<i>PPM1B</i>	<i>RAB31</i>	<i>RIC8B</i>
<i>MGAT3</i>	<i>NELF</i>	<i>PAFAH1B1</i>	<i>PHF10</i>	<i>PPM1D</i>	<i>RAB33A</i>	<i>RICH2</i>
<i>MGAT4B</i>	<i>NEUROD6</i>	<i>PAK1</i>	<i>PHF12</i>	<i>PPM1G</i>	<i>RAB35</i>	<i>RLBP1L1</i>
<i>MGC4172</i>	<i>NF1</i>	<i>PAK3</i>	<i>PHF2</i>	<i>PPP1R10</i>	<i>RAB39B</i>	<i>RND3</i>
<i>MIDN</i>	<i>NF2</i>	<i>PAPOLG</i>	<i>PHF21A</i>	<i>PPP1R16A</i>	<i>RAB5A</i>	<i>RNF10</i>
<i>MIER1</i>	<i>NFAT5</i>	<i>PARD6A</i>	<i>PHF21B</i>	<i>PPP1R7</i>	<i>RAB6A</i>	<i>RNF126</i>
<i>MINK1</i>	<i>NFATC3</i>	<i>PARK2</i>	<i>PHF23</i>	<i>PPP2CA</i>	<i>RAC1</i>	<i>RNF139</i>
<i>MKRN1</i>	<i>NFATC4</i>	<i>PARP6</i>	<i>PHF3</i>	<i>PPP2CB</i>	<i>RAC3</i>	<i>RNF144A</i>
<i>MLF2</i>	<i>NFE2L1</i>	<i>PARP8</i>	<i>PHOX2A</i>	<i>PPP2R2B</i>	<i>RAD23A</i>	<i>RNF41</i>
<i>MLL5</i>	<i>NFIA</i>	<i>PAX3</i>	<i>PHTF1</i>	<i>PPP2R5E</i>	<i>RAD50</i>	<i>RNPEPL1</i>
<i>MLLT3</i>	<i>NFIB</i>	<i>PAX6</i>	<i>PI4K2A</i>	<i>PPP3CA</i>	<i>RAI1</i>	<i>ROD1</i>
<i>MME</i>	<i>NFIX</i>	<i>PBRM1</i>	<i>PIAS1</i>	<i>PPP3CB</i>	<i>RALBP1</i>	<i>RORC</i>
<i>MNT</i>	<i>NKD1</i>	<i>PBX1</i>	<i>PIAS3</i>	<i>PPP4C</i>	<i>RALGPS2</i>	<i>RPIA</i>
<i>MORF4L1</i>	<i>NKIRAS2</i>	<i>PBX3</i>	<i>PIAS4</i>	<i>PPP4R1L</i>	<i>RALYL</i>	<i>RPL12</i>
<i>MOSPD1</i>	<i>NKX2-8</i>	<i>PCBP2</i>	<i>PICALM</i>	<i>PRKCA</i>	<i>RANBP9</i>	<i>RPL13</i>
<i>MOSPD3</i>	<i>NLGN3</i>	<i>PCDH7</i>	<i>PIK3CG</i>	<i>PRKCE</i>	<i>RAP2A</i>	<i>RPL21</i>
<i>MPP5</i>	<i>NLK</i>	<i>PCGF1</i>	<i>PIK3R3</i>	<i>PRKD3</i>	<i>RARB</i>	<i>RPL29</i>
<i>MRV1</i>	<i>NOC3L</i>	<i>PCGF2</i>	<i>PITX1</i>	<i>PRKG1</i>	<i>RASD1</i>	<i>RPLP0</i>
<i>MSL3L1</i>	<i>NR1D1</i>	<i>PCSK1N</i>	<i>PKIG</i>	<i>PROX1</i>	<i>RASGRP1</i>	<i>RPP25</i>
<i>MSX1</i>	<i>NR2C2</i>	<i>PCTK1</i>	<i>PLAG1</i>	<i>PRPH2</i>	<i>RAX</i>	<i>RPS2</i>
<i>MTA1</i>	<i>NR4A2</i>	<i>PCYT1B</i>	<i>PLCB1</i>	<i>PRRX1</i>	<i>RBBP5</i>	<i>RPS6KA1</i>
<i>MTCP1</i>	<i>NRBP1</i>	<i>PDAP1</i>	<i>PLCH1</i>	<i>PSCD2</i>	<i>RBM10</i>	<i>RTN2</i>
<i>MTMR14</i>	<i>NRIP1</i>	<i>PDCD10</i>	<i>PLD5</i>	<i>PSKH1</i>	<i>RBM12</i>	<i>RUNX1T1</i>

<i>RUSC1</i>	<i>SLC43A2</i>	<i>ST6GALNAC5</i>	<i>TLL1</i>	<i>TSC22D3</i>	<i>USP19</i>	<i>ZC3H10</i>
<i>RXRA</i>	<i>SLC4A10</i>	<i>ST6GALNAC6</i>	<i>TLOC1</i>	<i>TSC22D4</i>	<i>USP2</i>	<i>ZC3H15</i>
<i>RXRG</i>	<i>SLC4A3</i>	<i>ST8SIA2</i>	<i>TMCO6</i>	<i>TSHZ2</i>	<i>USP42</i>	<i>ZC3H7B</i>
<i>RYBP</i>	<i>SLC6A8</i>	<i>ST8SIA3</i>	<i>TMEFF2</i>	<i>TSPAN12</i>	<i>USP46</i>	<i>ZCCHC14</i>
<i>SATB2</i>	<i>SLCO3A1</i>	<i>ST8SIA4</i>	<i>TMEM1</i>	<i>TSPAN17</i>	<i>USP48</i>	<i>ZCCHC17</i>
<i>SBDS</i>	<i>SMAD5</i>	<i>STAG1</i>	<i>TMEM121</i>	<i>TSPAN18</i>	<i>USP49</i>	<i>ZCCHC6</i>
<i>SBF1</i>	<i>SMAD6</i>	<i>STK36</i>	<i>TMEM161B</i>	<i>TSPAN5</i>	<i>USP52</i>	<i>ZDHHC14</i>
<i>SCAMP1</i>	<i>SMAD7</i>	<i>STRN3</i>	<i>TMEM49</i>	<i>TSPAN9</i>	<i>VANGL2</i>	<i>ZDHHC3</i>
<i>SCARF2</i>	<i>SMCR7L</i>	<i>STX1B</i>	<i>TMOD4</i>	<i>TSSK6</i>	<i>VAPA</i>	<i>ZDHHC5</i>
<i>SCN3A</i>	<i>SMURF1</i>	<i>SUMO2</i>	<i>TMSB10</i>	<i>TTC9B</i>	<i>VEGFA</i>	<i>ZFAND3</i>
<i>SCN5A</i>	<i>SMURF2</i>	<i>SURF4</i>	<i>TMTC2</i>	<i>TTL11</i>	<i>VEZF1</i>	<i>ZFAND5</i>
<i>SCYL1</i>	<i>SNCA</i>	<i>SUSD4</i>	<i>TNFAIP1</i>	<i>TTL5</i>	<i>VPS26B</i>	<i>ZFAND6</i>
<i>SELI</i>	<i>SNCAIP</i>	<i>SUV420H1</i>	<i>TNFRSF11A</i>	<i>TULP4</i>	<i>VPS33B</i>	<i>ZFH3</i>
<i>SEMA4G</i>	<i>SNCB</i>	<i>SV2A</i>	<i>TNFSF8</i>	<i>TWIST1</i>	<i>VPS36</i>	<i>ZFH34</i>
<i>SEMA7A</i>	<i>SND1</i>	<i>SYNCRIP</i>	<i>TNMD</i>	<i>TWIST2</i>	<i>VPS4A</i>	<i>ZFP161</i>
<i>SENP2</i>	<i>SNF1LK2</i>	<i>SYT13</i>	<i>TNPO1</i>	<i>TXNIP</i>	<i>VSX2</i>	<i>ZFR</i>
<i>SERP1</i>	<i>SNIP</i>	<i>TAF10</i>	<i>TNPO2</i>	<i>TYRO3</i>	<i>VWC2</i>	<i>ZFYVE27</i>
<i>SERTAD2</i>	<i>SNN</i>	<i>TAF5L</i>	<i>TNRC4</i>	<i>UBA1</i>	<i>WAC</i>	<i>ZIC1</i>
<i>SF3B14</i>	<i>SNRPB</i>	<i>TAF9</i>	<i>TOLLIP</i>	<i>UBAC1</i>	<i>WAPAL</i>	<i>ZIC3</i>
<i>SFN</i>	<i>SNRPD1</i>	<i>TAGLN3</i>	<i>TOX4</i>	<i>UBAP1</i>	<i>WASF2</i>	<i>ZIC5</i>
<i>SFRS15</i>	<i>SNRPD2</i>	<i>TAOK2</i>	<i>TPD52L2</i>	<i>UBAP2L</i>	<i>WDR44</i>	<i>ZMIZ1</i>
<i>SFRS16</i>	<i>SNRPD3</i>	<i>TBC1D15</i>	<i>TPM1</i>	<i>UBE2E1</i>	<i>WNT10A</i>	<i>ZMYND11</i>
<i>SFRS9</i>	<i>SNUPN</i>	<i>TBL1XR1</i>	<i>TPM2</i>	<i>UBE2E2</i>	<i>WNT11</i>	<i>ZNF148</i>
<i>SH3GL1</i>	<i>SNX24</i>	<i>TBPL1</i>	<i>TRA2A</i>	<i>UBE2M</i>	<i>WNT2</i>	<i>ZNF219</i>
<i>SH3GLB2</i>	<i>SNX5</i>	<i>TBR1</i>	<i>TRAF4</i>	<i>UBE2Q1</i>	<i>WNT9A</i>	<i>ZNF238</i>
<i>SH3RF1</i>	<i>SOCS3</i>	<i>TBX2</i>	<i>TRAM1</i>	<i>UBE2R2</i>	<i>WRNIP1</i>	<i>ZNF282</i>
<i>SH3RF2</i>	<i>SORCS3</i>	<i>TBX3</i>	<i>TRIM11</i>	<i>UBE4A</i>	<i>WSB1</i>	<i>ZNF318</i>
<i>SLAH2</i>	<i>SOX21</i>	<i>TCEB2</i>	<i>TRIM2</i>	<i>UBE4B</i>	<i>WSCD1</i>	<i>ZNF32</i>
<i>SIRPA</i>	<i>SOX4</i>	<i>TCF7L2</i>	<i>TRIM3</i>	<i>UBL7</i>	<i>WWP1</i>	<i>ZNF410</i>
<i>SIX2</i>	<i>SP1</i>	<i>TEAD1</i>	<i>TRIM33</i>	<i>UBOX5</i>	<i>XPO1</i>	<i>ZNF491</i>
<i>SIX3</i>	<i>SP4</i>	<i>TEAD2</i>	<i>TRIM37</i>	<i>UBP1</i>	<i>XPR1</i>	<i>ZNF503</i>
<i>SKP1</i>	<i>SPA17</i>	<i>TEK</i>	<i>TRIM46</i>	<i>UBQLN2</i>	<i>YES1</i>	<i>ZNF521</i>
<i>SLC20A1</i>	<i>SPAG7</i>	<i>TESK1</i>	<i>TRIM62</i>	<i>UBTD1</i>	<i>YIPF4</i>	<i>ZNF532</i>
<i>SLC25A36</i>	<i>SPII</i>	<i>TFAP2E</i>	<i>TRIM66</i>	<i>UCHL3</i>	<i>YWHAE</i>	<i>ZNF592</i>
<i>SLC25A5</i>	<i>SRPK1</i>	<i>TFE3</i>	<i>TRIM8</i>	<i>UCK2</i>	<i>YWHAQ</i>	<i>ZNF627</i>
<i>SLC26A9</i>	<i>SRRM1</i>	<i>THAP1</i>	<i>TRIOBP</i>	<i>UGCG</i>	<i>YY1</i>	<i>ZNF638</i>
<i>SLC35A4</i>	<i>SSBP2</i>	<i>THOC4</i>	<i>TRPM3</i>	<i>UPF2</i>	<i>ZBTB2</i>	<i>ZNF710</i>
<i>SLC35E1</i>	<i>SSNA1</i>	<i>THRA</i>	<i>TRPS1</i>	<i>USF1</i>	<i>ZBTB20</i>	<i>ZNF804A</i>
<i>SLC39A13</i>	<i>ST3GAL3</i>	<i>TIA1</i>	<i>TSC1</i>	<i>USF2</i>	<i>ZBTB33</i>	<i>ZNRF1</i>
<i>SLC41A1</i>	<i>ST5</i>	<i>TLE4</i>	<i>TSC22D1</i>	<i>USP12</i>	<i>ZBTB7B</i>	<i>ZZZ3</i>

C.1.2 GO-term analysis

Number of genes among 1071 (above) with available annotations = Number of genes in test set (X) = 678

Number of genes in reference set (N) = 8649

x indicates the number of genes in test set in the functional category listed

n indicates the number of genes in reference set in the functional category listed

p-values calculated using hypergeometric test.

GO-ID	p-value	corr p-value	x	n	X	N	Description
30528	1.1933E-17	7.6612E-15	145	923	678	8649	transcription regulator activity
3700	5.5821E-11	1.7919E-8	84	520	678	8649	transcription factor activity
16564	4.0031E-10	8.5667E-8	39	168	678	8649	transcription repressor activity
5488	3.7291E-9	5.9853E-7	527	5881	678	8649	binding
8134	1.9686E-8	2.5155E-6	59	356	678	8649	transcription factor binding
3676	2.3510E-8	2.5155E-6	138	1132	678	8649	nucleic acid binding
3702	4.2668E-7	3.9133E-5	36	189	678	8649	RNA polymerase II transcription factor activity
3677	6.9153E-7	5.5495E-5	104	836	678	8649	DNA binding
3924	1.5696E-6	1.1197E-4	27	128	678	8649	GTPase activity
5515	2.0281E-6	1.3020E-4	430	4753	678	8649	protein binding
4722	1.2510E-5	7.3011E-4	11	31	678	8649	protein serine/threonine phosphatase activity
16462	1.7399E-5	9.3085E-4	42	274	678	8649	pyrophosphatase activity
16817	2.0819E-5	9.5472E-4	42	276	678	8649	hydrolase activity, acting on acid anhydrides
16818	2.0819E-5	9.5472E-4	42	276	678	8649	hydrolase activity, acting on acid anhydrides, in phosphorus-containing anhydrides
17111	2.3087E-5	9.8813E-4	40	259	678	8649	nucleoside-triphosphatase activity
3712	3.3140E-5	1.3298E-3	40	263	678	8649	transcription cofactor activity
3714	4.9684E-5	1.8763E-3	20	97	678	8649	transcription corepressor activity
4674	1.3454E-3	4.7985E-2	30	215	678	8649	protein serine/threonine kinase activity

C.2 GO-term analysis for genes containing uAUGs and not targeted by miRNAs

C.2 Genes that do not exhibit Watson-Crick interactions with 3'-ends of conserved miRNAs (Total 716)

<i>ABI2</i>	<i>ARMC8</i>	<i>C12orf30</i>	<i>CDH2</i>	<i>CTR9</i>	<i>DYNLL2</i>	<i>FGF9</i>
<i>ABLIM1</i>	<i>ARMCX3</i>	<i>C14orf4</i>	<i>CDH7</i>	<i>CTTNBP2</i>	<i>E2F4</i>	<i>FGFR10P</i>
<i>ACSL4</i>	<i>ARPC1B</i>	<i>C14orf43</i>	<i>CDK5</i>	<i>CTTNBP2NL</i>	<i>EED</i>	<i>FHIT</i>
<i>ACTR2</i>	<i>ARPC2</i>	<i>C17orf28</i>	<i>CDK8</i>	<i>CUGBP1</i>	<i>EFCBP2</i>	<i>FLI1</i>
<i>ACTR3</i>	<i>ASF1A</i>	<i>C1GALT1C1</i>	<i>CDKN2C</i>	<i>CUL1</i>	<i>EHD1</i>	<i>FLOT1</i>
<i>ACTR6</i>	<i>ASTN1</i>	<i>C1orf58</i>	<i>CEBPE</i>	<i>CUL3</i>	<i>EIF2C3</i>	<i>FLOT2</i>
<i>ACVR1B</i>	<i>ATAD1</i>	<i>C1orf77</i>	<i>CENTG2</i>	<i>CXCL14</i>	<i>EIF2S1</i>	<i>FOSB</i>
<i>ADAMTS10</i>	<i>ATN1</i>	<i>C20orf52</i>	<i>CFL2</i>	<i>CXXC5</i>	<i>ELF1</i>	<i>FOSL2</i>
<i>AFF4</i>	<i>ATP11B</i>	<i>C5orf13</i>	<i>CHCHD3</i>	<i>DAZAP2</i>	<i>ENC1</i>	<i>FOXB1</i>
<i>AHCYL1</i>	<i>ATP1B2</i>	<i>C6orf62</i>	<i>CHD6</i>	<i>DCUN1D1</i>	<i>ENOX2</i>	<i>FOXD2</i>
<i>AIFM1</i>	<i>ATP2A1</i>	<i>C7orf23</i>	<i>CHMP4B</i>	<i>DDDEF1</i>	<i>ENSA</i>	<i>FOXMI</i>
<i>AIP</i>	<i>ATP6V1C1</i>	<i>C9orf126</i>	<i>CITED1</i>	<i>DDX3X</i>	<i>EPB41L4A</i>	<i>FOXN2</i>
<i>AK3L1</i>	<i>B3GAT1</i>	<i>CABP7</i>	<i>CKS1B</i>	<i>DDX6</i>	<i>EPB41L4B</i>	<i>FOXP2</i>
<i>AKAP10</i>	<i>B3GAT3</i>	<i>CACNA2D1</i>	<i>CLPTM1</i>	<i>DENND4A</i>	<i>EPC2</i>	<i>FRAP1</i>
<i>AKT3</i>	<i>B4GALT5</i>	<i>CACNB3</i>	<i>CNBP</i>	<i>DES</i>	<i>EPHA7</i>	<i>FRMD5</i>
<i>ALDH9A1</i>	<i>B4GALT7</i>	<i>CACNG2</i>	<i>CNN2</i>	<i>DHX30</i>	<i>ERH</i>	<i>G3BP2</i>
<i>ALX4</i>	<i>BAI2</i>	<i>CAMK1</i>	<i>CNOT10</i>	<i>DHX40</i>	<i>ETS1</i>	<i>GABRA1</i>
<i>AMBN</i>	<i>BCL2L1</i>	<i>CAMK4</i>	<i>CNOT2</i>	<i>DHX9</i>	<i>ETV3</i>	<i>GABRA4</i>
<i>AMELX</i>	<i>BCL2L11</i>	<i>CAMKK2</i>	<i>CNOT3</i>	<i>DIS3L</i>	<i>ETV6</i>	<i>GABRB1</i>
<i>AMMECR1</i>	<i>BCL7A</i>	<i>CAMTA2</i>	<i>CNOT6</i>	<i>DLG1</i>	<i>EWSR1</i>	<i>GALNT1</i>
<i>ANKMY2</i>	<i>BEX1</i>	<i>CAPN6</i>	<i>CNOT6L</i>	<i>DLG3</i>	<i>EXOC4</i>	<i>GALNT5</i>
<i>ANKRD11</i>	<i>BLCAP</i>	<i>CAPZA2</i>	<i>COL1A2</i>	<i>DMRT3</i>	<i>EXOSC1</i>	<i>GALNTL4</i>
<i>ANXA1</i>	<i>BM11</i>	<i>CASC3</i>	<i>COL4A3BP</i>	<i>DMTF1</i>	<i>EZH2</i>	<i>GAP43</i>
<i>AP1S2</i>	<i>BMP7</i>	<i>CCBL2</i>	<i>COPG2</i>	<i>DNAJA4</i>	<i>FAM108B1</i>	<i>GARNL4</i>
<i>AP2M1</i>	<i>BNC2</i>	<i>CCDC130</i>	<i>COPZ2</i>	<i>DNAJB4</i>	<i>FAM126B</i>	<i>GBF1</i>
<i>AP3M1</i>	<i>BNIP2</i>	<i>CCDC55</i>	<i>CPEB4</i>	<i>DNAJC11</i>	<i>FAM134A</i>	<i>GBX2</i>
<i>AP3S1</i>	<i>BRD7</i>	<i>CCM2</i>	<i>CPS1</i>	<i>DNAJC6</i>	<i>FBLN5</i>	<i>GDI2</i>
<i>APBB2</i>	<i>BRDT</i>	<i>CCNG1</i>	<i>CREBBP</i>	<i>DOCK3</i>	<i>FBXL2</i>	<i>GGA1</i>
<i>APBB3</i>	<i>BTBD14A</i>	<i>CDC2L6</i>	<i>CRISPLD1</i>	<i>DPF2</i>	<i>FBXL5</i>	<i>GJC2</i>
<i>APPL1</i>	<i>BTF3</i>	<i>CDC42BPB</i>	<i>CRY1</i>	<i>DPH5</i>	<i>FBXO36</i>	<i>GLCE</i>
<i>ARHGAP30</i>	<i>BTG2</i>	<i>CDC73</i>	<i>CSNK1G2</i>	<i>DSCR3</i>	<i>FBXO46</i>	<i>GLRA2</i>
<i>ARHGEF7</i>	<i>BUB3</i>	<i>CDGAP</i>	<i>CSNK1G3</i>	<i>DTD1</i>	<i>FBXW7</i>	<i>GLTP</i>
<i>ARL2</i>	<i>BZW1</i>	<i>CDH11</i>	<i>CTCF</i>	<i>DYNCIL11</i>	<i>FGF12</i>	<i>GNAI3</i>
<i>ARL8B</i>	<i>C11orf73</i>	<i>CDH13</i>	<i>CTPS</i>	<i>DYNCIL12</i>	<i>FGF17</i>	<i>GNAQ</i>

<i>GNB2</i>	<i>HOXB7</i>	<i>KDELRI</i>	<i>MAP2K6</i>	<i>NCAM1</i>	<i>PDE6D</i>	<i>PTBP2</i>
<i>GNB5</i>	<i>HOXB8</i>	<i>KDELR2</i>	<i>MAP4K3</i>	<i>NCAM2</i>	<i>PDIKIL</i>	<i>PTP4A2</i>
<i>GNPDA2</i>	<i>HOXB9</i>	<i>KIAA0494</i>	<i>MAPK14</i>	<i>NCOA5</i>	<i>PDP2</i>	<i>PTPN11</i>
<i>GOLGA1</i>	<i>HOXC11</i>	<i>KIAA1267</i>	<i>MAPK6</i>	<i>NDP</i>	<i>PFN2</i>	<i>PTPN12</i>
<i>GPC3</i>	<i>HOXC5</i>	<i>KIF13A</i>	<i>MAPK8</i>	<i>NEDD8</i>	<i>PHC3</i>	<i>PTPN4</i>
<i>GRASP</i>	<i>HOXC9</i>	<i>KIF2A</i>	<i>MAPK8IP2</i>	<i>NEK9</i>	<i>PHF14</i>	<i>PTPRG</i>
<i>GRB2</i>	<i>HOXD10</i>	<i>KIFAP3</i>	<i>MAPRE3</i>	<i>NEUROD2</i>	<i>PHF17</i>	<i>PUM1</i>
<i>GRHL2</i>	<i>HOXD3</i>	<i>KLHDC3</i>	<i>MARCH5</i>	<i>NFATC1</i>	<i>PHF20</i>	<i>PURA</i>
<i>GRIK5</i>	<i>HSF2</i>	<i>KPNA1</i>	<i>MARCKSL1</i>	<i>NIT1</i>	<i>PHIP</i>	<i>PURB</i>
<i>GRIN3A</i>	<i>HSP90AA1</i>	<i>KRT16</i>	<i>MARK3</i>	<i>NKX2-1</i>	<i>PHOX2B</i>	<i>PVRL1</i>
<i>GRIP1</i>	<i>HSPA4</i>	<i>L3MBTL3</i>	<i>MBD3</i>	<i>NKX2-2</i>	<i>PITPNA</i>	<i>QKI</i>
<i>GRK5</i>	<i>IBSP</i>	<i>LARP5</i>	<i>MCTS1</i>	<i>NMNAT2</i>	<i>PJA2</i>	<i>RAB11A</i>
<i>GSK3B</i>	<i>IBTK</i>	<i>LATS2</i>	<i>MDH1</i>	<i>NMT2</i>	<i>POLG</i>	<i>RAB1B</i>
<i>GTPBP2</i>	<i>ID4</i>	<i>LCOR</i>	<i>MDM1</i>	<i>N-PAC</i>	<i>POLR2J2</i>	<i>RAB2B</i>
<i>H1F0</i>	<i>IFRD1</i>	<i>LDLRAD3</i>	<i>MECP2</i>	<i>NPTXR</i>	<i>POLS</i>	<i>RAB30</i>
<i>H1FX</i>	<i>IGF2BP1</i>	<i>LENG1</i>	<i>MEF2D</i>	<i>NR2E1</i>	<i>POU2AF1</i>	<i>RAB6B</i>
<i>H2AFZ</i>	<i>IGF2BP2</i>	<i>LHFPL2</i>	<i>METT10D</i>	<i>NR2F1</i>	<i>PPARG</i>	<i>RAB8A</i>
<i>HAS2</i>	<i>IGSF9</i>	<i>LHX1</i>	<i>MFSD5</i>	<i>NR2F2</i>	<i>PPARGC1B</i>	<i>RABL3</i>
<i>HBP1</i>	<i>ILF2</i>	<i>LHX2</i>	<i>MGAT5</i>	<i>NRAS</i>	<i>PPL</i>	<i>RAF1</i>
<i>HDGF</i>	<i>IMMP2L</i>	<i>LIM2</i>	<i>MGAT5B</i>	<i>NUP93</i>	<i>PPM1E</i>	<i>RANBP2</i>
<i>HDLBP</i>	<i>IMP3</i>	<i>LINGO2</i>	<i>MIER3</i>	<i>OAZ1</i>	<i>PPMIH</i>	<i>RAP2B</i>
<i>HESX1</i>	<i>ING4</i>	<i>LLGL1</i>	<i>MIR16</i>	<i>OAZ3</i>	<i>PPP1CA</i>	<i>RAP2C</i>
<i>HGD</i>	<i>INSM1</i>	<i>LMBR1L</i>	<i>MLLT10</i>	<i>ODF1</i>	<i>PPP1CB</i>	<i>RASIP1</i>
<i>HIPK1</i>	<i>INTS12</i>	<i>LMBRD2</i>	<i>MOBKLI1A</i>	<i>OGDH</i>	<i>PPP2R2C</i>	<i>RBBP6</i>
<i>HIPK3</i>	<i>IRX2</i>	<i>LRFN5</i>	<i>MOBKLI3</i>	<i>OLIG3</i>	<i>PPP2R4</i>	<i>RBBP7</i>
<i>HIST2H2AA3</i>	<i>IRX4</i>	<i>LRP1</i>	<i>MORF4L2</i>	<i>ONECUT2</i>	<i>PPP5C</i>	<i>RBM35B</i>
<i>HMGB2</i>	<i>ISL1</i>	<i>LRP1B</i>	<i>MOV10</i>	<i>OPHN1</i>	<i>PPRC1</i>	<i>RBM4B</i>
<i>HNRNPA2B1</i>	<i>ISL2</i>	<i>LRRC42</i>	<i>MRLC2</i>	<i>OTP</i>	<i>PPTC7</i>	<i>RBM5</i>
<i>HNRPF</i>	<i>ITGB8</i>	<i>LRRC59</i>	<i>MSI1</i>	<i>OTUB2</i>	<i>PRKAA2</i>	<i>RBPMS</i>
<i>HNRPH2</i>	<i>ITPR1</i>	<i>LRRC8D</i>	<i>MTCH2</i>	<i>OTX1</i>	<i>PRKACA</i>	<i>RDH10</i>
<i>HNRPM</i>	<i>KBTBD7</i>	<i>LRRTM1</i>	<i>MTDH</i>	<i>OTX2</i>	<i>PRKCB1</i>	<i>REEP2</i>
<i>HNT</i>	<i>KCNA6</i>	<i>LZIC</i>	<i>MYCBP</i>	<i>OXSRI</i>	<i>PRKCI</i>	<i>RFC1</i>
<i>HOMER1</i>	<i>KCNC1</i>	<i>MAB21L1</i>	<i>MYF6</i>	<i>PAIP2</i>	<i>PRPSAP2</i>	<i>RGS3</i>
<i>HOMER2</i>	<i>KCNC4</i>	<i>MAB21L2</i>	<i>MYLIP</i>	<i>PALMD</i>	<i>PSIP1</i>	<i>RLF</i>
<i>HOXA10</i>	<i>KCNG3</i>	<i>MACROD1</i>	<i>MYNN</i>	<i>PAX9</i>	<i>PSMA1</i>	<i>RNF122</i>
<i>HOXA2</i>	<i>KCNH5</i>	<i>MAF1</i>	<i>MYOT</i>	<i>PCDHB8</i>	<i>PSMA7</i>	<i>RNF20</i>
<i>HOXA5</i>	<i>KCNJ3</i>	<i>MAFG</i>	<i>NACA2</i>	<i>PCDHGC3</i>	<i>PSMC6</i>	<i>RNPS1</i>
<i>HOXA7</i>	<i>KCNK1</i>	<i>MAML2</i>	<i>NALCN</i>	<i>PCGF3</i>	<i>PSMD11</i>	<i>RPL10A</i>
<i>HOXB4</i>	<i>KCNMB2</i>	<i>MANIA1</i>	<i>NARG1</i>	<i>PCMT1</i>	<i>PSMD14</i>	<i>RPL15</i>
<i>HOXB5</i>	<i>KCTD4</i>	<i>MAP2K4</i>	<i>NAVI</i>	<i>PCMTD1</i>	<i>PSMD3</i>	<i>RPL27A</i>

<i>RPL30</i>	<i>SMAP1L</i>	<i>SYN2</i>	<i>TRIP4</i>	<i>WNT7A</i>
<i>RPL31</i>	<i>SMARCC2</i>	<i>SYT14</i>	<i>TRPM7</i>	<i>WNT7B</i>
<i>RPN2</i>	<i>SMARCE1</i>	<i>SYT9</i>	<i>TSN</i>	<i>WT1</i>
<i>RPS8</i>	<i>SMYD5</i>	<i>TACC2</i>	<i>TSPAN15</i>	<i>WWP2</i>
<i>RRAGC</i>	<i>SNRPA1</i>	<i>TAF12</i>	<i>TUB</i>	<i>XKR6</i>
<i>SAP18</i>	<i>SNRPN</i>	<i>TAF5</i>	<i>TUBB6</i>	<i>XPNPEP1</i>
<i>SAPS3</i>	<i>SNX8</i>	<i>TAOK1</i>	<i>TUBG2</i>	<i>XPO7</i>
<i>SARIA</i>	<i>SORBS2</i>	<i>TBC1D19</i>	<i>TUSC2</i>	<i>XYLT1</i>
<i>SARS</i>	<i>SOX17</i>	<i>TBC1D22B</i>	<i>TXNDC11</i>	<i>YBX1</i>
<i>SAT1</i>	<i>SOX18</i>	<i>TCEB3</i>	<i>U2AF1L4</i>	<i>YTHDF2</i>
<i>SATB1</i>	<i>SOX2</i>	<i>TCF20</i>	<i>UBE2D3</i>	<i>YTHDF3</i>
<i>SEMA6A</i>	<i>SOX6</i>	<i>TCF4</i>	<i>UBE2L3</i>	<i>YWHAG</i>
<i>SEPT5</i>	<i>SOX9</i>	<i>TFAP2B</i>	<i>UBE2N</i>	<i>ZBTB1</i>
<i>SERBP1</i>	<i>SPARC</i>	<i>TFAP2C</i>	<i>UBE2S</i>	<i>ZBTB10</i>
<i>SFRS10</i>	<i>SPATA6</i>	<i>TFAP2D</i>	<i>UBE2V2</i>	<i>ZBTB12</i>
<i>SFRS12</i>	<i>SPOP</i>	<i>TFDP2</i>	<i>UBE3A</i>	<i>ZBTB16</i>
<i>SFRS6</i>	<i>SPRY2</i>	<i>TGFB3</i>	<i>UBN1</i>	<i>ZBTB26</i>
<i>SGIP1</i>	<i>SPTLC2</i>	<i>THAP7</i>	<i>UBXD8</i>	<i>ZBTB37</i>
<i>SGMS2</i>	<i>SRF</i>	<i>TIAL1</i>	<i>UGP2</i>	<i>ZBTB39</i>
<i>SH3BGR1</i>	<i>SRGAP1</i>	<i>TLK1</i>	<i>USP25</i>	<i>ZBTB7A</i>
<i>SH3BGR13</i>	<i>SRP54</i>	<i>TMED1</i>	<i>USP28</i>	<i>ZCCHC5</i>
<i>SHC1</i>	<i>SRPK2</i>	<i>TMEM108</i>	<i>USP5</i>	<i>ZDHHC23</i>
<i>SHOC2</i>	<i>SRR</i>	<i>TMEM135</i>	<i>USP8</i>	<i>ZEB1</i>
<i>SIRT1</i>	<i>SSBP3</i>	<i>TMEM164</i>	<i>UTX</i>	<i>ZEB2</i>
<i>SIX1</i>	<i>STAG2</i>	<i>TMEM185A</i>	<i>VCPIP1</i>	<i>ZHX1</i>
<i>SLC10A7</i>	<i>STC1</i>	<i>TMEM39B</i>	<i>VIM</i>	<i>ZMAT2</i>
<i>SLC12A5</i>	<i>STK32B</i>	<i>TMEM59</i>	<i>VKORC1L1</i>	<i>ZMYM3</i>
<i>SLC15A2</i>	<i>STK39</i>	<i>TMEM60</i>	<i>VPRBP</i>	<i>ZMYND8</i>
<i>SLC22A4</i>	<i>STK40</i>	<i>TMEM93</i>	<i>VPS25</i>	<i>ZNF24</i>
<i>SLC22A5</i>	<i>STMN2</i>	<i>TMSB4X</i>	<i>VPS26A</i>	<i>ZNF275</i>
<i>SLC25A13</i>	<i>STOML2</i>	<i>TNFAIP3</i>	<i>VPS54</i>	<i>ZNF281</i>
<i>SLC25A14</i>	<i>STRBP</i>	<i>TOP1</i>	<i>VPS72</i>	<i>ZNF384</i>
<i>SLC35B4</i>	<i>STT3A</i>	<i>TOX</i>	<i>WBP2</i>	<i>ZNF428</i>
<i>SLC39A10</i>	<i>STUB1</i>	<i>TPH2</i>	<i>WDFY3</i>	<i>ZNF496</i>
<i>SLIT3</i>	<i>STX5</i>	<i>TPM3</i>	<i>WDR1</i>	<i>ZNF512</i>
<i>SLITRK2</i>	<i>STX8</i>	<i>TRAIP</i>	<i>WDR48</i>	<i>ZNF513</i>
<i>SLITRK5</i>	<i>STXBP6</i>	<i>TRAPPC3</i>	<i>WDR67</i>	<i>ZNF706</i>
<i>SLK</i>	<i>SUMO1</i>	<i>TRAPPC6B</i>	<i>WDR68</i>	<i>ZNF76</i>
<i>SMAD9</i>	<i>SUMO3</i>	<i>TRDN</i>	<i>WNT10B</i>	
<i>SMAP1</i>	<i>SUZ12</i>	<i>TRIB2</i>	<i>WNT3</i>	

C.2.2 GO-term analysis

Number of genes among 716 (above) with available annotations = Number of genes in test set (X) = 448

Number of genes in reference set (N) = 8648

x indicates the number of genes in test set in the functional category listed

n indicates the number of genes in reference set in the functional category listed

p-values calculated using hypergeometric test.

GO-ID	p-value	corr p-value	x	n	X	N	Description	Genes in test set
30528	9.1528E-8	4.9059E-5	84	919	448	8648	transcription regulator activity	
5488	2.2855E-7	6.1252E-5	352	5879	448	8648	binding	
5515	3.5780E-7	6.3927E-5	297	4753	448	8648	protein binding	
3676	2.2083E-6	2.9592E-4	93	1131	448	8648	nucleic acid binding	
3700	1.2579E-5	1.3485E-3	50	519	448	8648	transcription factor activity	
3677	5.0034E-5	4.4697E-3	69	835	448	8648	DNA binding	
48027	1.3814E-4	1.0578E-2	3	3	448	8648	mRNA 5'-UTR binding	
3723	4.3415E-4	2.9088E-2	29	288	448	8648	RNA binding	
8134	7.5201E-4	4.0469E-2	33	355	448	8648	transcription factor binding	
3702	7.5501E-4	4.0469E-2	21	189	448	8648	RNA polymerase II transcription factor activity	

C.3 Predicted interactions between uAUG 6 and 7 of *KLF9* and conserved miRNAs

Shown below is a portion of the 5'-UTR of *KLF9* that contain uAUGs6 and 5. The interactions and the associated free energy of binding were predicted using 11-mers and miRNA 5'- or 3'-ends. Full miRNAs and sequences surrounding the uAUGs are shown for clarity.



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