Unusually effective microRNA targeting within repeat-rich coding regions of mammalian mRNAs

Michael Schnall-Levin,[1,2,8] Olivia S. Rissland,[3,4,5,8] Wendy K. Johnston,[3,4,5] Norbert Perrimon,[6,7] David P. Bartel,[3,4,5,9] and Bonnie Berger[1,2,9]

[1]Department of Mathematics, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA; [2]Computer Science and Artificial Intelligence Laboratory, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA; [3]Whitehead Institute for Biomedical Research, Cambridge, Massachusetts 02139, USA; [4]Howard Hughes Medical Institute, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA; [5]Department of Biology, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA; [6]Howard Hughes Medical Institute, Harvard Medical School, Boston, Massachusetts 02115, USA; [7]Department of Genetics, Harvard Medical School, Boston, Massachusetts 02115, USA

MicroRNAs (miRNAs) regulate numerous biological processes by base-pairing with target messenger RNAs (mRNAs), primarily through sites in 3′ untranslated regions (UTRs), to direct the repression of these targets. Although miRNAs have sometimes been observed to target genes through sites in open reading frames (ORFs), large-scale studies have shown such targeting to be generally less effective than 3′ UTR targeting. Here, we show that several miRNAs each target significant groups of genes through multiple sites within their coding regions. This ORF targeting, which mediates both predictable and effective repression, arises from highly repeated sequences containing miRNA target sites. We show that such sequence repeats largely arise through evolutionary duplications and occur particularly frequently within families of paralogous C_2H_2 zinc-finger genes, suggesting the potential for their coordinated regulation. Examples of ORFs targeted by miR-181 include both the well-known tumor suppressor *RBI* and *RBAK*, encoding a C_2H_2 zinc-finger protein and transcriptional binding partner of RBI. Our results indicate a function for repeat-rich coding sequences in mediating post-transcriptional regulation and reveal circumstances in which miRNA-mediated repression through ORF sites can be reliably predicted.

[Supplemental material is available for this article.]

MicroRNAs (miRNAs) are ~22-nucleotide RNAs that direct the post-transcriptional repression of target messenger RNAs (mRNAs) (Bartel 2009; Ghildiyal and Zamore 2009). An important component of gene regulation in higher eukaryotes, miRNAs are bound by the effector protein Argonaute to form the mature silencing complex. Watson-Crick base-pairing between the 5′ end of the miRNA—the so-called "seed" region—and a target message elicits silencing of the target mRNA primarily through mRNA decay (Bartel 2009; Guo et al. 2010). Target sites can be grouped by the extent to which they match the region of the miRNA seed (nucleotides 2–7). The weakest site, with base-pairing to these six nucleotides (6mer site), usually confers only mild repression and is frequently augmented in sites conferring substantial down-regulation. Those with an adenosine opposite nucleotide 1 (7mer-A1 site) generally confer more repression, followed by those with base-pairing to nucleotide 8 of the miRNA (7mer-m8 site), followed by those with both (8mer site) (Lewis et al. 2005; Grimson et al. 2007). Other context factors, such as local AU-content, also influence the repression mediated by an individual site (Grimson et al. 2007; Nielsen et al. 2007).

The majority of characterized miRNA target sites are in the 3′ untranslated regions (UTRs) of mRNAs, and large-scale studies examining the effects of introducing or deleting a miRNA have

shown that sites in 3′ UTRs generally are more effective than those in either 5′ UTRs or open reading frames (ORFs) (Bartel 2009). The reduced efficacy of 5′ UTR and ORF sites is attributed to displacement of the miRNA silencing complex within the 5′ UTR by the scanning machinery, as it passes from the cap to the start codon, and within the coding region by translocating ribosomes (Grimson et al. 2007; Gu et al. 2009). Supporting this model, 3′ UTR sites that lie within ~15 nucleotides of the stop codon are no more effective than ORF sites, as expected if the silencing complex were displaced by the ribosome leading edge as the stop codon approached the ribosome A site (Grimson et al. 2007).

Although ORF sites generally are less effective, enough ORF sites mediate repression to observe a signal above background in large-scale functional studies (Lim et al. 2005; Grimson et al. 2007; Baek et al. 2008; Selbach et al. 2008), and even more sites appear to bind the silencing complex sufficiently to mediate enrichment of the mRNA (or a cross-linked fragment of the mRNA) during immunoprecipitation of the silencing complex (Easow et al. 2007; Hendrickson et al. 2008; Chi et al. 2009; Hafner et al. 2010; Zisoulis et al. 2010). Supporting the biological function of some of these ORF sites, bioinformatic approaches have shown that many ORF sites are preferentially conserved (Lewis et al. 2005; Stark et al. 2007; Forman et al. 2008; Schnall-Levin et al. 2010). Reporter assays have also confirmed that sites in both 5′ UTRs and ORFs can mediate repression (Easow et al. 2007; Lytle et al. 2007; Duursma et al. 2008; Forman et al. 2008; Orom et al. 2008; Shen et al. 2008; Tay et al. 2008; Elcheva et al. 2009; Huang et al. 2010; Schnall-Levin et al. 2010).

The efficacy of miRNA-mediated repression increases with the number of sites (Doench and Sharp 2004; Grimson et al. 2007;

Bartel 2009), suggesting that targeting might be substantial if a gene contained many sites in its coding region, as could arise from coding-sequence repeats. Repeats of various types are prevalent within many human genes. Particularly widespread are simple classes of repeats, such as microsatellites, which have been shown to cause important phenotypic effects through action at both the nucleotide and protein levels (Mirkin 2007). Of interest in the present study are repeated sequences of greater complexity, a striking case of which occurs within the C_2H_2 class of zinc-finger genes. These genes have undergone extensive expansion over the course of vertebrate evolution and constitute the largest group of human transcription factors (Ding et al. 2009). Typically, C_2H_2 genes contain a significant number of tandemly repeated C_2H_2 amino acid domains, each of which coordinates a zinc ion and has the potential to bind DNA in a sequence-specific manner (Wolfe et al. 2000). The emergence of highly repeated amino acid domains creates instances of highly repeated short nucleotide sequences in a large fraction of such genes.

Here, we show that the ORFs of many repeat-rich genes contain strikingly large numbers of target sites of particular miRNAs. Moreover, these genes with many sites are frequently strongly repressed. For seven miRNA families, this type of targeting appears to be extensive. In the most notable cases, four miRNA families (miR-23, miR-181, miR-188, and miR-199) have seed sites that match repeated sequences within C_2H_2 zinc-finger genes. Three others (miR-370, miR-766, and miR-1248) have seed sites that match simpler repeats. Effective targeting of coding-region repeats is highly predictable, and, due to the large number of target sites within a single ORF, down-regulation observed in reporter assays can be stronger than that of many 3′ UTR targets. For the C_2H_2 class of zinc-finger genes, targeting is shared among paralogous genes, suggesting the potential for their coordinate regulation. mRNAs of both RB1 and its accessory protein, RBAK, are targeted by miR-181 primarily through ORF sites, suggesting an unappreciated role in carcinogenesis for miR-181, which has previously been implicated in hematopoiesis and in tumorigenesis through its regulation of NFKB activity (Chen et al. 2004; Iliopoulos et al. 2010), and underscoring the potential importance of ORF sites in understanding miRNA biology.

Results

### miR-181 represses mRNAs with repeated ORF sites

While re-analyzing previously published microarray data from miR-181a transfection in HeLa cells (Baek et al. 2008), we observed that some of the most strongly down-regulated mRNAs contained miR-181 seed sites in their coding regions. We found this result intriguing because, although miRNA targeting has been observed in ORFs, it usually confers only subtle repression. Further investigation revealed that the enrichment for strong down-regulation was largely confined to a group of mRNAs containing numerous miR-181 sites (Fig. 1A,B). Genes that contained a single 8mer site in their coding region were only slightly, though statistically significantly, down-regulated (mean $\log_2$ fold-change: −0.07; $p < 2 \times 10^{-4}$; Mann-Whitney U-test) and significantly less so than those with a single 8mer site in their 3′ UTR (mean $\log_2$ fold-change: −0.07 vs. −0.17; $p < 0.01$; Mann-Whitney U-test). However, those genes with an increasing number of ORF sites showed increasingly strong down-regulation. In particular, the 52 genes with at least four 8mer ORF sites were nearly all repressed and, even when restricted to the subset of 18 of 52 genes with no 3′ UTR sites, showed significantly stronger repression than those genes with a single 8mer 3′ UTR site

(mean $\log_2$ fold-change: −0.51 vs. −0.17; $p < 5 \times 10^{-3}$; Mann-Whitney U-test). Many of these genes had even more than four 8mers sites as well as equally large numbers of 7mer sites (Supplemental Table 2). Perhaps most surprising, considering the strikingly large number of sites, was not that such genes were strongly down-regulated, but that genes should have so many sites to a single mRNA. Indeed, miR-181 was exceptional in this regard (Fig. 1C). Whereas for most miRNAs, few or no genes contained large numbers of 8mer sites, for miR-181 there were many such genes.

Having observed the impact of miR-181 on a large class of endogenous transcripts, we aimed to confirm the direct, miRNA-mediated repression of a number of specific genes. To do so, we generated reporter proteins in which firefly luciferase was fused in-frame to the C terminus of the protein product of each of five genes: ZNF573, ZFP37, ZNF20, ZNF791, and RBAK (Fig. 1D). These genes contained nine, eight, six, five, and nine miR-181 8mer sites and two, seven, two, one, and 10 miR-181 7mer sites, respectively. Repression by miR-181a was evaluated by comparing normalized luciferase values from cells cotransfected with miR-181a to those with miR-23a, a noncognate miRNA. For each gene tested, we observed significant and robust repression by miR-181a ($p < 10^{-6}$; Mann-Whitney U-test; Fig. 1D). To confirm that the measured signal in each case was coming from the full-length fusion proteins, we disrupted the reading frame register by inserting or deleting one nucleotide in the zinc-finger coding sequence of the mRNA (within a few hundred nucleotides of the start codon), upstream of both the miRNA sites and the firefly luciferase sequence. As expected, these frame shift mutations significantly reduced luciferase activity for each fusion construct (Supplemental Fig. 1).

To confirm that the observed repression was directly mediated by the ORF sites, we generated a ZNF20-luciferase mutant in which each of the six miR-181 8mer and two miR-181 7mer seed sites within the ORF were mutated with two synonymous point substitutions. Compared with this mutated construct, the wild-type ZNF20 reporter was significantly and specifically repressed by miR-181a ($p < 10^{-6}$; Fig. 1E). The repression attributed to these sites increased from 2.5-fold to 6.3-fold when the fragment containing the sites was incorporated as part of the reporter 3′ UTR (Supplemental Fig. 2A). This difference between the efficacy of ORF sites and 3′ UTR sites was significant ($p < 10^{-4}$) and consistent with the general observation of ORFs being more refractory to miRNA targeting than are 3′ UTRs (Grimson et al. 2007).

Similarly, we tested whether the repression of RBAK, observed in our luciferase assays (Fig. 1D) and in the previous microarray study (Baek et al. 2008), was directly mediated by its miR-181 sites. In addition to its 19 ORF sites (nine 8mers and 10 7mers), the 3′ UTR of RBAK contains a conserved 7mer-m8 site and a poorly conserved 7mer-A1 site (Friedman et al. 2009). A panel of constructs was generated, expressing either the RBAK ORF with a C-terminal luciferase tag or the RBAK 3′ UTR following the luciferase reporter (Fig. 1F). Although the 3′ UTR sites mediated statistically significant repression (1.3-fold; $p = 0.0009$), the ORF sites gave far stronger repression (3.2-fold repression; $p < 10^{-6}$). As with ZNF20, the repression mediated by these ORF sites increased significantly when they were incorporated as part of the reporter 3′ UTR ($p < 10^{-4}$; Supplemental Fig. 2B). When both the ORF and 3′ UTR sites were monitored in combination, 3.3-fold repression was observed ($p < 10^{-6}$; Supplemental Fig. 3), which was not significantly different from that observed with the ORF sites alone ($p = 0.59$). Although further experiments will be required to understand why additional repression was not observed in the combined reporter, these results indicate that the repression of RBAK
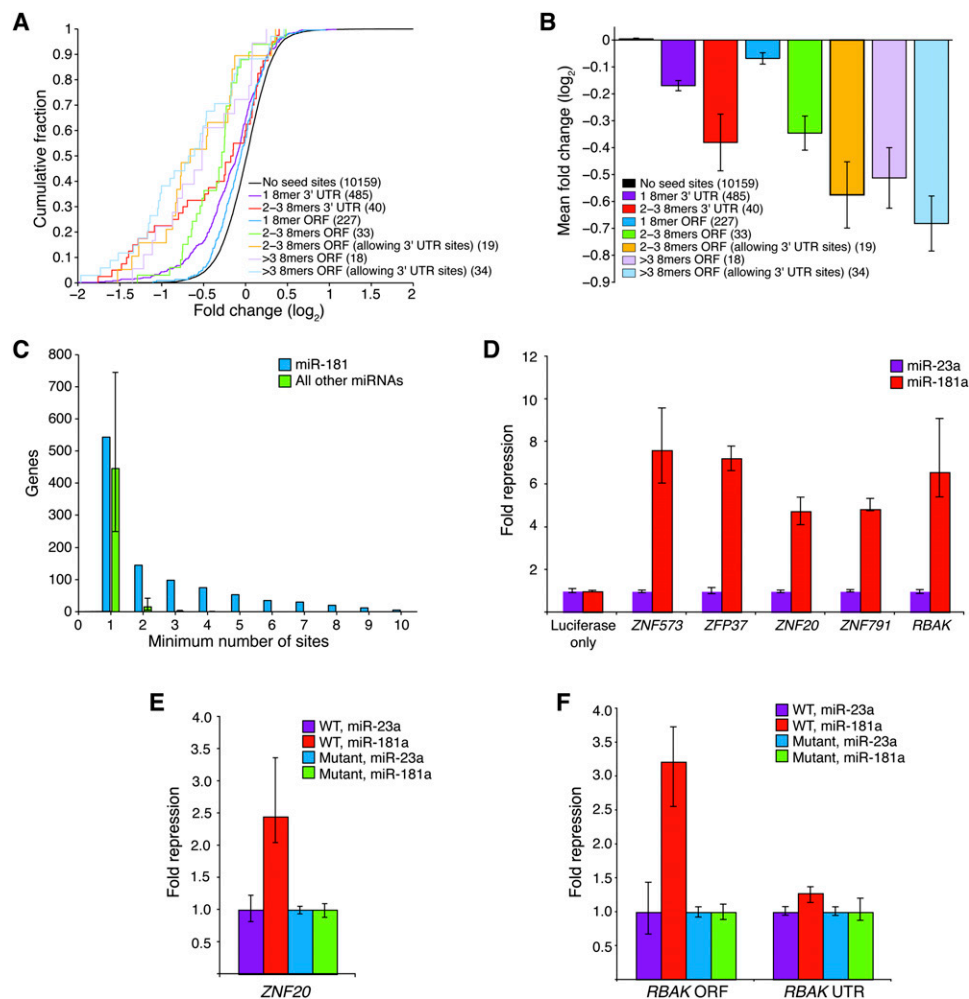
Figure 1. miR-181 targets genes with multiple coding-region sites. (*A*) Response of mRNAs to the introduction of miR-181a into HeLa cells. Plotted are cumulative distributions of fold-changes for mRNAs with the indicated numbers and types of sites. Except for the two categories indicated, categories with ORF sites excluded mRNAs with 3′ UTR sites, and those with 3′ UTR sites excluded mRNAs with ORF sites. (*B*) Mean fold-changes for the categories of *A*. Error bars show standard deviation from bootstrapping. (*C*) The propensity of miR-181 to have many ORF sites. Plotted are numbers of genes containing at least the indicated number of sites for either miR-181 (green) or the median across all miRNAs (blue). Error bars show the interquartile range. (*D*) miR-181a-mediated repression of reporters with miR-181 ORF sites. Reporters included the luciferase ORF following the ORF of the indicated mRNA. Fold repression was calculated relative to that of the noncognate miRNA, miR-23a (see Methods). Plotted are the normalized values, with error bars representing the third largest and third smallest values ($n = 12$; $p < 10^{-6}$, except for the control, luciferase-only reporter, for which $p = 0.32$). (*E*) Dependence of *ZNF20* repression on miR-181 ORF sites. Repression was calculated and depicted as in *D*, additionally normalizing repression of the reporter with wild-type sites (WT) to that of a reporter in which the eight ORF sites were mutated ($n = 12$; $p < 10^{-6}$). (*F*) Direct repression of *RBAK* ORF and 3′ UTR mediated by miR-181a, as assayed by luciferase assays. Repression was calculated and depicted as in *D*, additionally normalizing repression of the reporter with wild-type sites (WT) to that of the mutant reporter in which the 19 ORF or two 3′ UTR sites were mutated ($n = 12$; $p = 7 \times 10^{-7}$ and $p = 0.0009$, respectively).

by miR-181a was direct and that the majority of the miR-181a-mediated repression of *RBAK* was due to targeting through its ORF sites.

Additional miRNA seeds match repeated coding-region motifs

To find other miRNAs that might affect ORF targets similarly, we searched for all 8mers highly repeated within human ORFs, and for each 8mer we counted the number of nonoverlapping occurrences within each ORF. Because four ORF sites mediated robust repression by miR-181, we chose this as a threshold, and for each 8mer recorded the number of genes with four or more instances of that 8mer (Fig. 2A). The majority (77%) of 8mers did not occur four or more times in any coding region, and the vast majority (97%) occurred four or more times in only five or fewer coding regions. At

the tail of the distribution, 334 8mers appeared at least four times in at least 25 genes, among which were seven miRNA 8mer seed matches (Table 1). For each of the seven corresponding miRNA seed families, we compiled potential target sets containing genes with at least four 8mer sites (Supplemental Tables 1–7).

Based on the sets of predicted targeted genes, these miRNA families split into two main groups (Fig. 2B). For four of the miRNAs (miR-23, miR-181, miR-188, and miR-199), the target sets were almost entirely C_2H_2 zinc-finger genes, and sites in these genes mostly occurred within tandemly repeated C_2H_2 amino acid domains. For the other three annotated miRNAs (miR-370, miR-766, and miR-1248), the predicted targets were more varied, and sites largely occurred within highly prevalent amino acid pairs or triplets, though in some cases they occurred within long stretches of simple
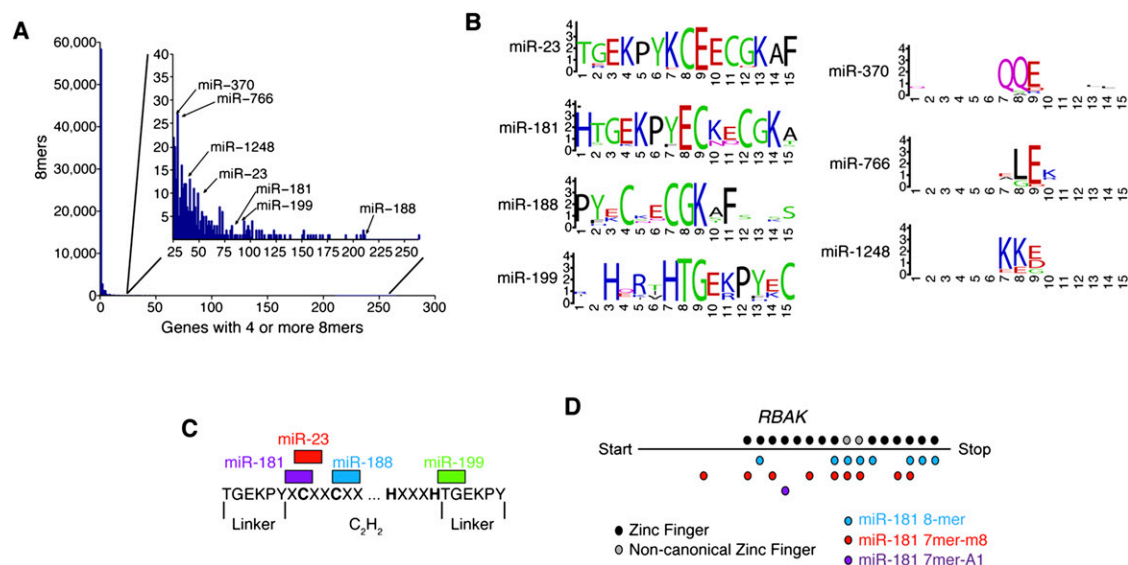
Figure 2. Potential targeting of frequent ORF repeats by additional miRNAs. (*A*) Motifs frequently repeated in ORFs of many mRNAs. The histogram considers all 65,536 possible 8-nt motifs and plots the number of these 8mers that match the indicated number of unique ORF at least four times. Also indicated are the seven miRNAs with 8mer sites among the 334 motifs that appeared at least four times in at least 25 genes. (*B*) The amino acid sequence coded by regions flanking 8mer ORF sites corresponding to the miRNA indicated. Sites overlap codons 7–9. Letter size indicates enrichment, visualized using WebLogo (weblogo.berkeley.edu). (*C*) Locations of 8mer sites within the repeated C_2H_2 domain. (*D*) Locations of C_2H_2 domains and miR-181 sites within the *RBAK* gene. Two C_2H_2 domains in which one of the histidines has been lost are shown as noncanonical zinc fingers. In cases where a single zinc finger contains both 8mer and 7mer sites, the 7mer overlaps the second cysteine in the motif.

nucleotide repeats. Because of their limited conservation, low expression levels and questionable status as authentic miRNAs (Chiang et al. 2010; Kozomara and Griffiths-Jones 2011), two of these three miRNAs (miR-766 and miR-1248) were not considered further.

The most common form of the repeated C_2H_2 amino acid domain is $XCX_{[2]}CX_{[12]}HX_{[3]}H$ (X represents any amino acid) (Emerson and Thomas 2009). Typically, C_2H_2 zinc-finger genes contain many tandem repeats of the finger motif (8.5 on average in humans), which are connected by a specific linker sequence most commonly of the form TGEKPY (Emerson and Thomas 2009). The 8mer sites for the four miRNA families each occurred within specific amino acid realizations at specific locations in this motif (Fig. 2C). Because of the large numbers of paralogous motifs within a single gene, the number of seed sites can be large. A typical example is the gene *RBAK*, which contains 14 C_2H_2 domains, eight miR-181 8mers and 10 miR-181 7mers (Fig. 2D).

## Predicted ORF targets are subject to miRNA-mediated repression

From the list of predicted miR-23 targets (Supplemental Table 1), we chose three genes (*ZNF225*, *ZNF486*, and *ZNF85*) for experimental follow-up. Fusion constructs with a C-terminal luciferase tag were made as before, and disruption of the reading frame by a nucleotide insertion substantially decreased luciferase expression, confirming that the majority of signal came from the full-length protein (Supplemental Fig. 1). The constructs were transfected in the presence of miR-23a or a noncognate miRNA, miR-181a (Fig. 3A). For all three targets, normalized luciferase

values were significantly reduced in the presence of miR-23a when compared with those with the noncognate miRNA ($p < 10^{-6}$). The magnitudes of repression were particularly notable because miR-23 has high target abundance and thus generally weaker targeting efficacy (Arvey et al. 2010).

We extended this analysis to predicted targets of either miR-199 or miR-370. *ZNF20* and *ZNF791*, experimentally supported targets of miR-181 (Fig. 1), also contain multiple seed matches to miR-199 and were examined for their response to miR-199a (Fig. 3B). *ZNF791*, which contains six miR-199 8mer sites and one 7mer site, was significantly repressed ($p < 10^{-5}$). Similarly, in the case of miR-370, we probed the response of two targets, *IVL* and *HDAC5*, both of which were significantly repressed ($p < 10^{-7}$ and $p = 0.009$, respectively; Fig. 3C). When we generated a mutant *IVL* construct, wherein all miR-370 sites were disrupted, we observed significant, direct repression by miR-370 ($p < 10^{-4}$; Fig. 3D). In contrast, the luciferase control was either unaffected by these miRNAs or, in the case of miR-199a, significantly less repressed than the *ZNF791*-luciferase fusion ($p = 0.0003$; Supplemental Fig. 4). Taken together, although individual ORF sites are less effective than 3′ UTR sites (Grimson et al. 2007), these results indicate that highly repetitive

Table 1. Annotated miRNAs with repeated coding-region sites in many genes

Family	miRNAs	8mer site	miRNA conservation	Genes with ≥4 sites	Target family
miR-23	miR-23a/b	AATGTGAA	Vertebrates	43	C_2H_2 zinc fingers
miR-181	miR-181a/b/c/d	TGAATGTA	Vertebrates	75	C_2H_2 zinc fingers
miR-188	miR-188-3p	TGTGGGAA	Mammals	210	C_2H_2 zinc fingers
miR-199	miR-199a/b-5p	ACACTGGA	Vertebrates	82	C_2H_2 zinc fingers
miR-370	miR-370	CAGCAGGA	Mammals	25	Varied
miR-766	miR-766	GCTGGAGA	Human	27	Varied
miR-1248	miR-1248	AAGAAGGA	Human	34	Varied
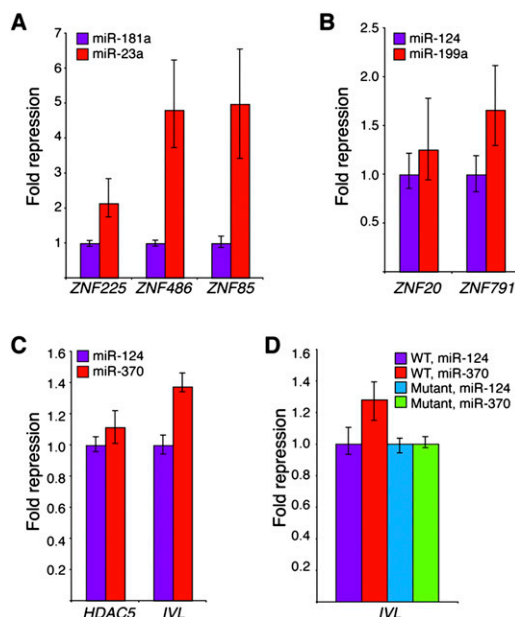
Figure 3. ORF target predictions recover functional targets for additional miRNAs. (*A*) miR-23a-mediated repression of reporters with miR-23 ORF sites. Reporters were constructed and assayed as in Figure 1E, except miR-23a was the cognate miRNA and miR-181a was the noncognate miRNA ($n = 12$; $p < 10^{-6}$). (*B*) miR-199a-mediated repression of a reporter with miR-199 ORF sites, otherwise as in *A* ($n = 12$; $p = 2 \times 10^{-6}$ and 0.08, for *ZNF791* and *ZNF20*, respectively). (*C*) miR-370-mediated repression of reporters with miR-370 ORF sites. miR-124 was the noncognate miRNA, otherwise as in *A* ($n = 15$; $p = 0.0009$ and 10^{-8}, for *HDAC5* and *IVL*, respectively). (*D*) Direct miR-370-mediated repression of an *IVL* reporter. Repression was calculated and depicted as in *A*, additionally normalizing repression of the reporter with wild-type sites (WT) to that of a reporter in which the ORF sites were mutated ($n = 12$; $p < 10^{-4}$).

ORFs containing many miRNA sites can generally be subject to significant and, in some cases, substantial repression by the cognate miRNA.

miRNAs target multiple paralogous families of C_2H_2 zinc-finger genes

Having observed the extent and, in some cases, surprising magnitude of targeting arising from ORF repeats, we considered the evolutionary processes giving rise to this phenomenon. Our focus was on C_2H_2 zinc-finger genes because these formed the most dramatic and frequent instances of this phenomenon. Among the predicted targets, most C_2H_2 genes (>80%) contained the general transcriptional repressor KRAB domain (Fig. 4A). KRAB-containing C_2H_2 genes display particularly interesting patterns of evolution, having high rates of gene duplication and loss as well as a dramatic expansion over the course of vertebrate and mammalian evolution (Huntley et al. 2006). To understand the role that these duplications played in forming miRNA targets sets, we collected sequences of all KRAB domains annotated in human and used these to create a multiple alignment of KRAB domains. From this alignment, the inferred phylogeny of KRAB-containing genes provided a context for considering the four miRNA target sets (Fig. 4B; Supplemental Fig. 5). For this analysis, we again defined each target set as those genes containing at least four 8mer sites for the given miRNA.

The analysis revealed that the four miRNAs target multiple clades, each of which has emerged from significant expansions through gene duplication. Combined over the four miRNA families, the target sets covered the majority of KRAB-containing C_2H_2 genes with varying amounts of overlap between each set (Fig. 4C). Whereas the miR-188 target set spanned nearly the entire phylogeny, the other three miRNAs each targeted more specific subfamilies of genes. For instance, the miR-23 targets were nearly all members of one clade: the recently duplicated *ZNF91* subfamily, which has undergone a significant expansion in the primate lineage (Hamilton et al. 2006).

Sequence analysis suggested that two duplication processes contributed to the creation of such extensive repeat-containing subfamilies. In one process, individual C_2H_2 domains were duplicated multiple times within a single zinc-finger gene. In a second process, genes were duplicated to form an extensive gene subfamily with high nucleotide similarity among many members. Due to the intragenic duplication process, the sequences of individual zinc fingers within a gene were far more similar to each other than expected by chance. To verify the importance of this effect, we implemented a randomization procedure for nucleotide sequences within C_2H_2 domains that preserved amino acid sequences and average codon usage over all domain instances. Even when fixing the observed amino acid sequences, real instances of C_2H_2 domains from within the same gene showed significantly higher nucleotide similarity than expected by chance (Supplemental Fig. 6). When C_2H_2 domains with randomized sequences were mapped back to genes, far fewer of these genes contained large numbers of miRNA sites than did the real genes (Fig. 5A). It was tempting to speculate that the similarity in nucleotide sequences across C_2H_2 domains within a gene represented an additional selective pressure to maintain miRNA seed sites in these genes. We observed marginal evidence for this model but could not detect such an effect at high confidence (data not shown).

The initial intragenic duplication of individual C_2H_2 domains allowed for the founding nucleotide-sequence choice to be amplified. After repeated duplication, a gene would ultimately include either many sites or no sites at all, depending on the presence or absence of a target site within a founding C_2H_2 domain. Such duplication contributed to the modularity of miRNA target sets; even for subfamilies of genes with C_2H_2 domains containing similar amino acid sequences, genes from one subfamily often contain many target sites, whereas those from another contain almost none. For example, although miR-188 sites are prevalent throughout the set of KRAB genes, they are almost entirely absent from the *ZNF91* subfamily of genes, despite these genes encoding comparable numbers of instances of the amino acid triplet (CGK) within which the miR-188 seed site appears.

The presence of large numbers of miRNA sites within coding regions also provided an opportunity to gain miRNA sites in the 3′ UTR through the acquisition of nonsense mutations. For all four miRNAs, we observed clear evidence of this process. For each miRNA, the set of predicted target genes was far more likely to contain 3′ UTR target sites than was the overall set of genes ($p < 10^{-7}$ for all comparisons except miR-199 7mers; binomial test; Fig. 5B). Moreover, regions flanking 3′ UTR sites of predicted ORF targets had high similarity to the regions flanking the corresponding ORF sites, which suggested that many of these 3′ UTR sites resided in the remnants of zinc-finger domains that had been lost to the 3′ UTR (Fig. 5C). Although the average number of 3′ UTR sites in these genes was modest compared with the number of ORF sites (mean total number of 7mer and 8mer sites: miR-23, 2.7; miR-181,
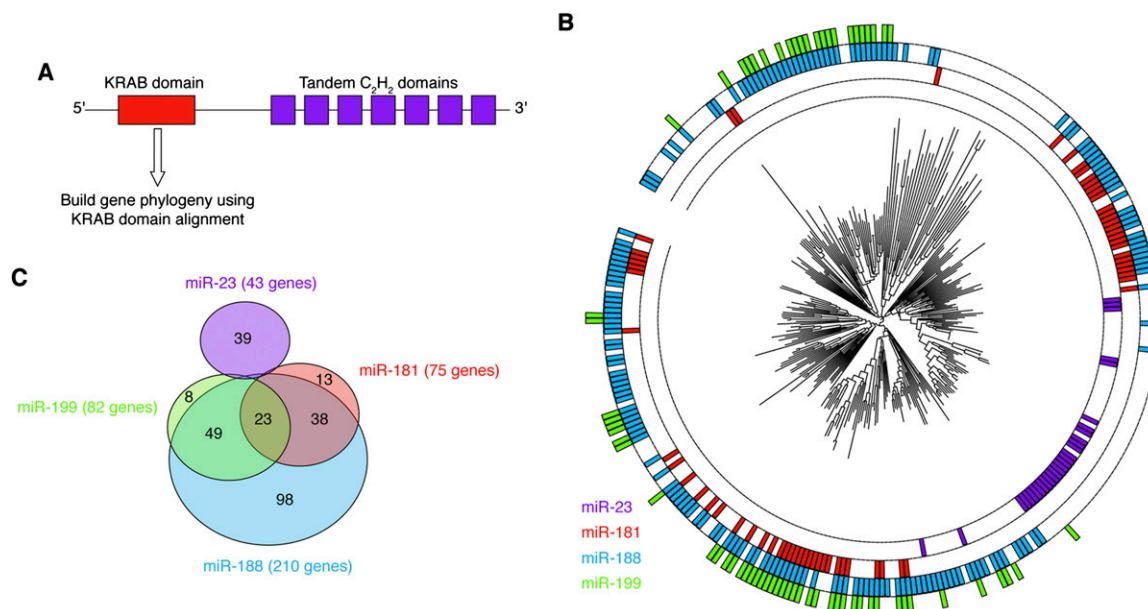
Figure 4. MicroRNA targeting of paralogous C_2H_2 genes. (*A*) Diagram of domain structure of C_2H_2 zinc-finger genes. (*B*) The relationship between shared ancestry of KRAB-containing C_2H_2 genes and shared miRNA sites. The phylogeny inferred from alignment of the KRAB domains is shown, marking at the perimeter those with at least four 8mer sites to the indicated miRNA. (*C*) Overlap between the predicted targets of the indicated miRNAs.

1.2; miR-199, 0.6; miR-188, 0.6), due to the greater efficacy of the 3′ UTR sites, their presence presumably enhances the targeting of some genes.

Discussion

In animals, miRNAs target many genes through sites in their 3′ UTRs but cause only modest repression of most of these targets. Compared with this generally modest targeting within 3′ UTRs, most targeting within ORFs is substantially weaker still. Nonetheless, we have shown that significant numbers of substantially repressed ORF targets exist and that such targets can be easily identified by the presence of large numbers of sites to the same miRNA. Recently, a similar observation of ORF targeting was independently observed to occur in the case of a single miRNA (Huang et al. 2010). Our work, going significantly further, provides a systematic examination of this phenomenon and gives the first bioinformatic evidence and experimental verification of the widespread nature of this type of targeting. Indeed, we have found that this targeting involves multiple miRNAs and, likely, hundreds of genes. While some of the target sites we have identified show the potential for supplemental 3′ base-pairing to the miRNA, none exhibit the extensive complementarity required for cleavage of the mRNA. It therefore appears likely that the mechanism of repression for these genes is identical to that for most 3′ UTR targets.

Interestingly, although there are examples of both 5′ and 3′ UTRs containing repeats, none of the highly repeated motifs matched known miRNA seeds, which indicates that repeat-mediated targeting is largely ORF specific. Moreover, although repeats in coding regions are prevalent in numerous animal clades, the presence of miRNA sites within these repeats appeared to be vertebrate-specific. Here, we focused on those miRNAs with at least four sites in large sets of genes, but there were many other miRNAs with at least this many sites in a handful of genes (Fig. 1). In addition, many genes contained multiple ORF sites to multiple miRNAs. The eventual determination of expression patterns for

these miRNAs at cellular resolution should enable prediction of additional targets in which ORF sites combine to achieve substantial repression.

The most striking cases of repeat-rich targeting occurred within the KRAB-domain C_2H_2 zinc-finger genes, which constitute the largest collection of human transcription factors. Our results indicate that a single miRNA can target entire families of these genes, thereby simultaneously regulating large numbers of evolutionarily related transcription factors. The targeting of such a large number of transcription factors by a miRNA has the potential to cause significant and widespread downstream effects. Through phylogenetic analysis we have shown how repeat-mediated targeting arises in these genes under an extensive evolutionary duplication process. Analysis of KRAB-domain-containing families indicates positive selection toward diversification of DNA-binding residues (Emerson and Thomas 2009). Hence, following duplication, individual genes frequently gain new downstream regulatory roles, while most members of the family retain the potential for upstream miRNA-mediated regulation. With a few exceptions, the functions of KRAB-domain genes remain unknown (Huntley et al. 2006). While a few show tissue-specific expression, most are widely expressed (Vaquerizas et al. 2009), and most predicted target genes appear to have expression patterns overlapping that of the corresponding miRNA (data not shown), suggesting that the targeting described here is likely to affect their in vivo expression.

One ORF target of miR-181, *RBAK*, is reported to function as an RB1-associated transcriptional repressor (Skapek et al. 2000). Suggestive of coordinate regulation, *RB1*, which encodes the well-characterized tumor-suppressor protein (Hanahan and Weinberg 2000; Classon and Harlow 2002), also contains sites to miR-181 in both its ORF (two 8mers and one 7mer) and 3′ UTR (one nonconserved 7mer). Although no repression was observed for the 3′ UTR site, significant repression by miR-181a was observed for the *RB1* ORF-luciferase fusion (1.4-fold; $p < 10^{-6}$; Supplemental Fig. 7). This newly recognized miR-181 targeting of *RB1* and *RBAK* had not been appreciated from previous analyses focusing only on 3′ UTR
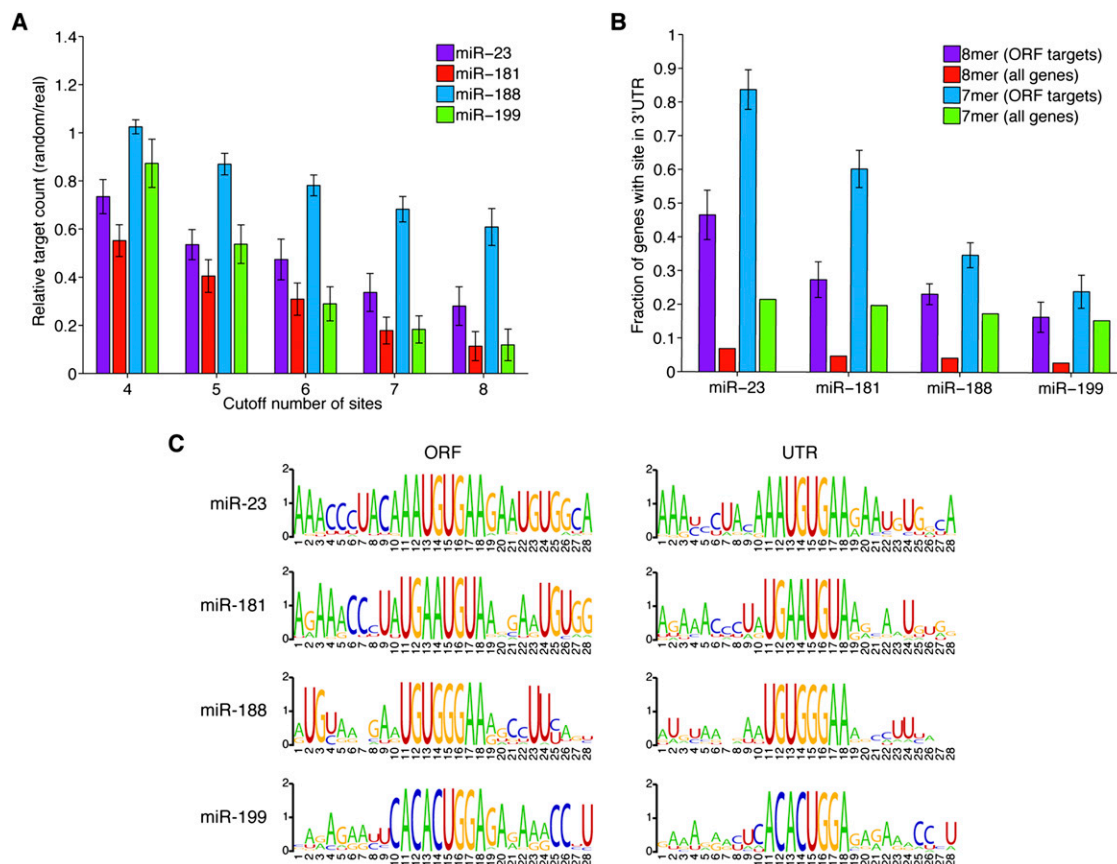
Figure 5. Impact of evolutionary processes on microRNA targeting of C_2H_2 genes. (*A*) Increased targeting due to intragenic C_2H_2 domain similarity. Shown are ratios giving the numbers of genes containing the indicated minimum number of 8mers for codon-randomized genes divided by the number of genes containing that many 8mers for real gene sequences. Values shown are the mean ratios across 50 codon-randomization trials. Error bars show standard deviation across the trials. All but three values were statistically significant (genes with four sites for miR-23, $p < 0.01$; genes with four or five values for miR-188, $p > 0.05$; genes with four sites for miR-199, $p > 0.05$; all other sets, $p < 10^{-4}$; paired Student's *t*-test with Bonferroni correction). (*B*) Propensity of ORF target genes to also contain 3′ UTR target sites. Shown are fractions of genes containing either 8mer or 7mer sites for the indicated miRNA within their 3′ UTRs, comparing the ORF target sets with the background of all genes. Error bars show standard deviations from 100 bootstrapping trials ($p < 10^{-7}$ for all comparisons except miR-199 7mers; binomial test). (*C*) Evidence that 3′ UTR sites derived from ORF sites. Shown are nucleotide compositions flanking miRNA sites in both ORFs and 3′ UTRs of mRNAs with ORF sites. Letter size indicates nucleotide enrichment, visualized using WebLogo.

sites and is intriguing when considering that miR-181 is up-regulated in some cancers and is important for maintaining cancer stem cells in hepatocellular carcinoma (Schetter et al. 2008; Cervigne et al. 2009; Ji et al. 2009). Even transient induction of miR-181b is sufficient to mediate an epigenetic switch to cancer, and inhibition of miR-181b reduces colony formation in several cancer cell lines, observations proposed to result from direct targeting of the tumor-suppressor CYLD (Iliopoulos et al. 2010). Because both RB1 and RBAK repress activation of E2F-dependent promoters and decrease DNA synthesis (Skapek et al. 2000), the ability of miR-181 to repress *RB1* and *RBAK* might provide an additional mechanism by which this miRNA mediates transformation.

Our work also suggests a general role of coding-sequence repeats in post-transcriptional regulation. For transcription regulation, the accumulation and clustering of multiple transcription factor binding motifs has been used for some time to predict functional regulatory relationships (Hannenhalli 2008). Given the large number of post-transcriptional regulatory processes that exist beyond miRNAs (Garneau et al. 2007; Parker and Sheth 2007) and the vast extent of sequence repeats within many protein-coding genes, miRNAs might not be the only regulatory process utilizing this phenomenon.

Methods

Luciferase assays

HEK293 cells (ATCC) were plated in 24-well plates and transfected 24 h later using Lipofectamine 2000 (Invitrogen) and Opti-MEM (Sigma) with 50 ng of *Renilla* luciferase control reporter plasmid pIS1 (Grimson et al. 2007), 400 ng of firefly luciferase reporter plasmid, and 25 nM miRNA duplex (Supplemental Table 9) per well. After 12 h, transfection media was replaced with DMEM containing 10% fetal bovine serum and penicillin-streptomycin. Cells were harvested 48 h post-transfection. Luciferase activities were measured using dual-luciferase assays (Promega), as described by the manufacturer. Four to five biological replicates, each with three technical replicates, were performed. Firefly activity was first normalized to *Renilla* activity to control for transfection efficiency, and then normalized values were analyzed as described previously (Grimson et al. 2007). If a mutant construct was generated, *Renilla*-normalized firefly values were normalized to the geometric mean of values from the reporter in which the miRNA sites were mutated. To control for variability in plasmid preparation, the value plotted for each construct was the geometric mean of normalized firefly values from transfections with the cognate miRNA divided

by that from transfections with the noncognate miRNA. To combine replicate values from independent experiments for which no mutant construct was generated, each *Renilla*-normalized firefly value was normalized to the geometric mean of values from transfections with the noncognate miRNA. Statistical significance was determined using the Mann-Whitney *U*-test. Plasmids (deposited at Addgene) were constructed as described (see Supplemental Methods).

Gene sequences

RefSeq sequences for human ORFs were downloaded from the UCSC Genome Browser (www.genome.ucsc.edu), version hg19, Feb. 2009. In cases of multiple transcript variants for a single gene, one variant was chosen at random as a representative. 3′ UTR sequences were downloaded from the TargetScan website (www.targetscan.org), version 5.1. For analysis of k-mers and generation of target sets, only nonoverlapping k-mer instances were considered, and all transcripts with coding region length >10 kilobases were excluded. Note that there was a single nucleotide difference between the *RBAK* clone used in luciferase assays and the RefSeq sequence, resulting in an additional 8mer in the clone sequence. In Figure 2 and Supplemental Table 2, we referred to the counts from the RefSeq sequence.

Microarray data

The microarray data examining the response of introducing miR-181a into HeLa cells (GM302995) (Baek et al. 2008) were analyzed using Agilent Feature Extraction software. $\log_2$ fold-change values for genes were obtained by taking the median value of $\log_2$ fold-change for all probes against that gene (excluding any probes not flagged by the Feature Extraction software as "Well Above Background"). Down-regulation of a group of genes was taken as the mean of $\log_2$ fold-changes across the genes, with errors in these means estimated using 100 bootstrap trials.

Phylogenetic reconstruction

The sequences of all KRAB-A domain instances, as well as the Uni-Prot identifier for the protein in which each domain occurred, were downloaded from the Pfam website (pfam.sanger.ac.uk), version 24, Oct. 2009. UniProt identifiers were mapped to the corresponding genes using conversion files from the HUGO Gene Nomenclature Committee (www.genenames.org). Of the resulting 311 genes containing KRAB-A domains, all but four (*ZNF862*, *ZNF560*, *ZNF333*, and *ZFP28*) contained a single copy of the domain. For those four genes, a single instance of the domain was chosen at random to use in the phylogenetic analysis. A multiple alignment was inferred on the amino acid sequences of the 311 KRAB-A domains, based on which a phylogenetic tree of the corresponding genes was reconstructed, using ClustalX software (version 2.0.12) under default parameter settings. Visualization of the tree and overlap with miRNA target sets was done using the Interactive Tree of Life software tool (itol.embl.de).

Randomization of C₂H₂-domain sequences

Instances of a C_2H_2 domain of the form $XCX_{[2]}CX_{[12]}HX_{[3]}H$, as well as the six residues N-terminal of this motif (to capture the linker sequence) were recorded from within all KRAB-containing genes. For each position in this 28-amino-acid motif, and each possible amino acid within this position, empirical codon usage frequencies combined across all C_2H_2 domains were calculated. For each instance of a C_2H_2 domain, randomized nucleotide versions of this C_2H_2 domain were generated by maintaining the amino acid sequence of each motif instance but randomly sampling with replacement from the empirical codon frequencies for each amino acid at each position in the domain. To generate C_2H_2 genes with randomized nucleotide sequences, the above randomization procedure was repeated for all of the C_2H_2 domains in the gene, and the randomized nucleotide sequences for each C_2H_2 domain were used to replace the true nucleotide sequences.

References

Arvey A, Larsson E, Sander C, Leslie CS, Marks DS. 2010. Target mRNA abundance dilutes microRNA and siRNA activity. *Mol Syst Biol* **6:** 363. doi: 10.1038/msb.2010.24.

Baek D, Villen J, Shin C, Camargo FD, Gygi SP, Bartel DP. 2008. The impact of microRNAs on protein output. *Nature* **455:** 64–71.

Bartel DP. 2009. MicroRNAs: Target recognition and regulatory functions. *Cell* **136:** 215–233.

Cervigne NK, Reis PP, Machado J, Sadikovic B, Bradley G, Galloni NN, Pintilie M, Jurisica I, Perez-Ordonez B, Gilbert R, et al. 2009. Identification of a microRNA signature associated with progression of leukoplakia to oral carcinoma. *Hum Mol Genet* **18:** 4818–4829.

Chen CZ, Li L, Lodish HF, Bartel DP. 2004. MicroRNAs modulate hematopoietic lineage differentiation. *Science* **303:** 83–86.

Chi SW, Zang JB, Mele A, Darnell RB. 2009. Argonaute HITS-CLIP decodes microRNA-mRNA interaction maps. *Nature* **460:** 479–486.

Chiang HR, Schoenfeld LW, Ruby JG, Auyeung VC, Spies N, Baek D, Johnston WK, Russ C, Luo S, Babiarz JE, et al. 2010. Mammalian microRNAs: Experimental evaluation of novel and previously annotated genes. *Genes Dev* **24:** 992–1009.

Classon M, Harlow E. 2002. The retinoblastoma tumor suppressor in development and cancer. *Nat Rev Cancer* **2:** 910–917.

Ding G, Lorenz P, Kreutzer M, Li Y, Thiesen HJ. 2009. SysZNF: the C2H2 zinc finger gene database. *Nucleic Acids Res* **37:** D267–D273. doi: 10.1093/nar/gkn782.

Doench JG, Sharp PA. 2004. Specificity of microRNA target selection in translational repression. *Genes Dev* **18:** 504–511.

Duursma AM, Kedde M, Schrier M, le Sage C, Agami R. 2008. miR-148 targets human DNMT3b protein coding region. *RNA* **14:** 872–877.

Easow G, Teleman AA, Cohen SM. 2007. Isolation of microRNA targets by miRNP immunopurification. *RNA* **13:** 1198–1204.

Elcheva I, Goswami S, Noubissi FK, Spiegelman VS. 2009. CRD-BP protects the coding region of betaTrCP1 mRNA from miR-183-mediated degradation. *Mol Cell* **35:** 240–246.

Emerson RO, Thomas JH. 2009. Adaptive evolution in zinc finger transcription factors. *PLoS Genet* **5:** e1000325. doi: 10.1371/journal.pgen.1000325.

Forman JJ, Legesse-Miller A, Coller HA. 2008. A search for conserved sequences in coding regions reveals that the let-7 microRNA targets Dicer within its coding sequence. *Proc Natl Acad Sci* **105:** 14879–14884.

Friedman RC, Farh KK, Burge CB, Bartel DP. 2009. Most mammalian mRNAs are conserved targets of microRNAs. *Genome Res* **19:** 92–105.

Garneau NL, Wilusz J, Wilusz CJ. 2007. The highways and byways of mRNA decay. *Nat Rev Mol Cell Biol* **8:** 113–126.

Ghildiyal M, Zamore PD. 2009. Small silencing RNAs: An expanding universe. *Nat Rev Genet* **10:** 94–108.

Grimson A, Farh KK, Johnston WK, Garrett-Engele P, Lim LP, Bartel DP. 2007. MicroRNA targeting specificity in mammals: Determinants beyond seed pairing. *Mol Cell* **27:** 91–105.

Gu S, Jin L, Zhang F, Sarnow P, Kay MA. 2009. Biological basis for restriction of microRNA targets to the 3′ untranslated region in mammalian mRNAs. *Nat Struct Mol Biol* **16:** 144–150.

Guo H, Ingolia NT, Weissman JS, Bartel DP. 2010. Mammalian microRNAs predominantly act to decrease target mRNA levels. *Nature* **466:** 835–840.

Hafner M, Landthaler M, Burger L, Khorshid M, Hausser J, Berninger P, Rothballer A, Ascano M Jr, Jungkamp AC, Munschauer M, et al. 2010. Transcriptome-wide identification of RNA-binding protein and microRNA target sites by PAR-CLIP. *Cell* **141:** 129–141.

Hamilton AT, Huntley S, Tran-Gyamfi M, Baggott DM, Gordon L, Stubbs L. 2006. Evolutionary expansion and divergence in the ZNF91 subfamily of primate-specific zinc finger genes. *Genome Res* **16:** 584–594.

Hanahan D, Weinberg RA. 2000. The hallmarks of cancer. *Cell* **100:** 57–70.

Hannenhalli S. 2008. Eukaryotic transcription factor binding sites–modeling and integrative search methods. *Bioinformatics* **24:** 1325–1331.

Hendrickson DG, Hogan DJ, Herschlag D, Ferrell JE, Brown PO. 2008. Systematic identification of mRNAs recruited to argonaute 2 by specific microRNAs and corresponding changes in transcript abundance. *PLoS ONE* **3:** e2126. doi: 10.1371/journal.pone.0002126.

Huang S, Wu S, Ding J, Lin J, Wei L, Gu J, He X. 2010. MicroRNA-181a modulates gene expression of zinc finger family members by directly targeting their coding regions. *Nucleic Acids Res* **38:** 7211–7218.

Huntley S, Baggott DM, Hamilton AT, Tran-Gyamfi M, Yang S, Kim J, Gordon L, Branscomb E, Stubbs L. 2006. A comprehensive catalog of human KRAB-associated zinc finger genes: Insights into the evolutionary history of a large family of transcriptional repressors. *Genome Res* **16:** 669–677.

Iliopoulos D, Jaeger SA, Hirsch HA, Bulyk ML, Struhl K. 2010. STAT3 activation of miR-21 and miR-181b-1 via PTEN and CYLD are part of the epigenetic switch linking inflammation to cancer. *Mol Cell* **39:** 493–506.

Ji J, Yamashita T, Budhu A, Forgues M, Jia HL, Li C, Deng C, Wauthier E, Reid LM, Ye QH, et al. 2009. Identification of microRNA-181 by genome-wide screening as a critical player in EpCAM-positive hepatic cancer stem cells. *Hepatology* **50:** 472–480.

Kozomara A, Griffiths-Jones S. 2011. miRBase: integrating microRNA annotation and deep-sequencing data. *Nucleic Acids Res* **39:** D152–D157. doi: 10.1093/nar/gkq1027.

Lewis BP, Burge CB, Bartel DP. 2005. Conserved seed pairing, often flanked by adenosines, indicates that thousands of human genes are microRNA targets. *Cell* **120:** 15–20.

Lim LP, Lau NC, Garrett-Engele P, Grimson A, Schelter JM, Castle J, Bartel DP, Linsley PS, Johnson JM. 2005. Microarray analysis shows that some microRNAs downregulate large numbers of target mRNAs. *Nature* **433:** 769–773.

Lytle JR, Yario TA, Steitz JA. 2007. Target mRNAs are repressed as efficiently by microRNA-binding sites in the 5′ UTR as in the 3′ UTR. *Proc Natl Acad Sci* **104:** 9667–9672.

Mirkin SM. 2007. Expandable DNA repeats and human disease. *Nature* **447:** 932–940.

Nielsen CB, Shomron N, Sandberg R, Hornstein E, Kitzman J, Burge CB. 2007. Determinants of targeting by endogenous and exogenous microRNAs and siRNAs. *RNA* **13:** 1894–1910.

Orom UA, Nielsen FC, Lund AH. 2008. MicroRNA-10a binds the 5′UTR of ribosomal protein mRNAs and enhances their translation. *Mol Cell* **30:** 460–471.

Parker R, Sheth U. 2007. P bodies and the control of mRNA translation and degradation. *Mol Cell* **25:** 635–646.

Schetter AJ, Leung SY, Sohn JJ, Zanetti KA, Bowman ED, Yanaihara N, Yuen ST, Chan TL, Kwong DL, Au GK, et al. 2008. MicroRNA expression profiles associated with prognosis and therapeutic outcome in colon adenocarcinoma. *JAMA* **299:** 425–436.

Schnall-Levin M, Zhao Y, Perrimon N, Berger B. 2010. Conserved microRNA targeting in *Drosophila* is as widespread in coding regions as in 3′UTRs. *Proc Natl Acad Sci* **107:** 15751–15756.

Selbach M, Schwanhausser B, Thierfelder N, Fang Z, Khanin R, Rajewsky N. 2008. Widespread changes in protein synthesis induced by microRNAs. *Nature* **455:** 58–63.

Shen WF, Hu YL, Uttarwar L, Passegue E, Largman C. 2008. MicroRNA-126 regulates HOXA9 by binding to the homeobox. *Mol Cell Biol* **28:** 4609–4619.

Skapek SX, Jansen D, Wei TF, McDermott T, Huang W, Olson EN, Lee EY. 2000. Cloning and characterization of a novel Kruppel-associated box family transcriptional repressor that interacts with the retinoblastoma gene product, RB. *J Biol Chem* **275:** 7212–7223.

Stark A, Lin MF, Kheradpour P, Pedersen JS, Parts L, Carlson JW, Crosby MA, Rasmussen MD, Roy S, Deoras AN, et al. 2007. Discovery of functional elements in 12 *Drosophila* genomes using evolutionary signatures. *Nature* **450:** 219–232.

Tay Y, Zhang J, Thomson AM, Lim B, Rigoutsos I. 2008. MicroRNAs to Nanog, Oct4 and Sox2 coding regions modulate embryonic stem cell differentiation. *Nature* **455:** 1124–1128.

Vaquerizas JM, Kummerfeld SK, Teichmann SA, Luscombe NM. 2009. A census of human transcription factors: Function, expression, and evolution. *Nat Rev Genet* **10:** 252–263.

Wolfe SA, Nekludova L, Pabo CO. 2000. DNA recognition by Cys2His2 zinc finger proteins. *Annu Rev Biophys Biomol Struct* **29:** 183–212.

Zisoulis DG, Lovci MT, Wilbert ML, Hutt KR, Liang TY, Pasquinelli AE, Yeo GW. 2010. Comprehensive discovery of endogenous Argonaute binding sites in *Caenorhabditis elegans*. *Nat Struct Mol Biol* **17:** 173–179.