Chapter 3 Atlas of miRNAs and Their Promoters in Human and Mouse



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Keywords Gene expression \cdot MicroRNA biogenesis \cdot Regulatory sites \cdot Noncoding RNAs \cdot Cap Analysis Gene Expression (CAGE) \cdot Transcription start sites \cdot Transcription \cdot Functional annotation \cdot Vertebrate

3.1 Preamble

MicroRNAs (miRNAs) are a class of short (typically 21–24 nucleotides) noncoding RNAs that inhibit the expression of specific genes by binding to complementary target sequences on RNA transcripts, usually located in the 3' untranslated region (UTR), and repressing translation or inducing RNA degradation. The miRNA biogenesis pathway consists of excision by Drosha of the precursor miRNA (pre-miRNA) from a primary miRNA (pri-miRNA) transcript, followed by processing of the pre-miRNA by Dicer to release the mature miRNA duplex consisting of a guide RNA and a passenger strand RNA. Mature miRNAs have a phosphate group on their 5' end and a hydroxyl group on their 3' end; short RNA (sRNA) sequencing libraries for miRNA expression profiling by next-generation sequencing instruments can be produced by ligating adapters to the 5' and the 3' end of the mature miRNA, followed by reverse transcription, PCR amplification, and gel purification (Illumina, Inc. 2011).

As pri-miRNAs are long transcripts with a 5' cap, their expression can be profiled using Cap Analysis Gene Expression (CAGE; Takahashi et al. 2012). In CAGE, transcripts are reverse-transcribed using random priming to include both polyadenylated and non-polyadenylated RNAs, followed by cap-trapping to capture capped transcripts such as mRNAs, long noncoding RNAs, and pri-miRNAs while avoiding ribosomal RNAs. In addition to measuring expression levels, CAGE

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identifies the exact 5' end of the profiled transcript and therefore its transcription start site and promoter region.

In the fifth edition (FANTOM5) of the FANTOM (Functional Annotation of the Mammalian Genome) project (http://fantom.gsc.riken.jp/), RNA samples from human and mouse, mostly from primary cells, were subjected to CAGE profiling to create an expression atlas of transcription initiation at single-nucleotide resolution (Forrest et al. 2014). A subset of 422 human and 78 mouse RNA samples in FANTOM5 were selected for sRNA library production and sequencing to produce a complementary atlas of miRNA expression in human and mouse (De Rie et al. 2017). By making use of the CAGE data in FANTOM5, for each miRNA the associated pri-miRNA and its promoter was identified. Importantly, each short RNA library in the FANTOM5 collection had a matching CAGE library produced from the same RNA sample. As the expression levels of mature miRNAs observed by sRNA sequencing were correlated to the expression levels of the corresponding pri-miRNAs in the matching CAGE library, pri-miRNA CAGE expression levels could be used as a proxy for the expression level of mature miRNAs, allowing the miRNA expression atlas to be extended to the 1829 human and 1029 mouse CAGE libraries included in FANTOM5 (De Rie et al. 2017).

The FANTOM5 expression atlas of miRNAs and their promoters (http://fantom. gsc.riken.jp/5/suppl/De_Rie_et_al_2017/) thus created is a comprehensive resource of miRNAs in human and mouse, their expression levels in primary cells, tissues, and cell lines, as well as their promoters and associated CAGE expression levels. Using this atlas, the expression pattern across samples of miRNAs can be evaluated as an indication of the cell types in which the miRNA is biologically most relevant. Additionally, sequence analysis of the promoter region around the transcription start site of the identified pri-miRNA enabled an analysis of how the cell type specific expression patterns of each miRNA are encoded in the regulatory control region of the corresponding pri-miRNA (De Rie et al. 2017).

Target users of this atlas are scientists focusing on specific miRNAs or specific cell types, as well as system biologists interested in a global analysis of the cellular regulatory network and the role of miRNAs therein.

3.2 Database Content

Table 3.1 shows an overview of the sRNA data in FANTOM5. Most samples are from human, and most human samples were derived from primary cells. As described previously (De Rie et al. 2017), all sRNA sequencing data were generated using the same protocol to prepare barcoded Illumina TruSeq Small RNA libraries (Illumina, Inc. 2011) and the same sequencing protocol on the Illumina HiSeq2000 sequencer, allowing direct comparison of the expression level of each miRNA between different samples. Similarly, CAGE sequencing data were generated using the same library preparation and sequencing protocol (Kanamori-Katayama et al. 2011) as described in the corresponding publications (Forrest et al. 2014; Arner

Organism	Origin	RNA source	Size	# of samples			
Human	Primary cells	Total RNA	Short	286			
	Primary cells, ES, iPS	Nuclear RNA	Short	16			
	Primary cells, ES, iPS	Cytoplasmic RNA	Short	9			
	Primary cells, ES, iPS	Nuclear RNA	Long	9			
	Primary cells, ES, iPS	Cytoplasmic RNA	Long	9			
	Tissue	Total RNA	Short	6			
	Time course	Total RNA	Short	87			
	Total: 422		·				
Mouse	Primary cells	Total RNA	Short	1			
	Whole body	Total RNA	Short	14			
	Time course	Total RNA	Short	27			
	Primary cells, ES, iPS	Nuclear RNA	Short	9			
	Primary cells, ES, iPS	Cytoplasmic RNA	Short	9			
	Primary cells, ES, iPS	Nuclear RNA	Long	9			
	Primary cells, ES, iPS Cytoplasmic RNA		Long	9			
	Total: 78						
Rat	Primary cells	Total RNA	Short	3			
	Whole body Total RNA		Short	3			
	Total: 6						
Dog	Primary cells	Total RNA	Short	3			
	Whole body	Total RNA	Short	3			
	Total: 6						
Chicken	Primary cells	Total RNA	Short	3			
	Whole body	Whole body Total RNA		2			
	Total: 5						

Table 3.1 Overview of sRNA libraries in FANTOM5

RNAs with sizes between 15 and 40 or 50 nucleotides ("short") or between 80 and 280 bp ("long") were selected for sequencing (Fort et al. 2014; De Rie et al. 2017). The sRNA libraries for rat, dog, and chicken samples are unpublished and have not yet been integrated in the database *ES* embryonic stem cells, *iPS* induced pluripotent stem cells

et al. 2015). Detailed information on each sample is provided in the FANTOM5 Semantic catalog of Samples, Transcription initiation And Regulators (SSTAR; http://fantom.gsc.riken.jp/5/sstar; Abugessaisa et al. 2016).

To generate a miRNA expression table, sequence reads were mapped using bwa (Li and Durbin 2009) to genome assembly hg19 for human and mm9 for mouse and assigned to miRNAs previously annotated in miRBase release 21 (Kozomara and Griffiths-Jones 2014) or to candidate novel miRNAs identified using miRDeep2 (Friedländer et al. 2012) based on genomic overlap. Expression values were converted to c.p.m. (counts-per-million) by normalizing against the total miRNA expression in each sample (De Rie et al. 2017). The FANTOM5 CAGE data was used to identify the pri-miRNA transcript associated with each miRNA by applying a computational pipeline followed by manual curation (De Rie et al. 2017) and to create an expression table for all identified pri-miRNAs. Cell ontology enrichment

analysis of the human sRNA and CAGE data in FANTOM5 was performed by evaluating the statistical significance of expression enrichment or depletion of each miRNA or pri-miRNA in cell ontology clusters of primary cell types, retaining the three most enriched and depleted cell ontology terms as a systematic annotation of cell type specific expression.

3.3 Database Architecture

CAGE expression data are referred to by the RNA sample ID (a 4- or 5-digit number) of the RNA sample from which the CAGE library was produced. Each RNA sample number is associated with a FANTOM5 sample ontology ID (FF ontology ID) for human and mouse. Short RNA expression data are provided per RNA sample identified by concatenating the sRNA library ID (of the form SRhinnnnn, where *nnnnn* is a 5-digit number), a 6-nucleotide barcode, and the RNA sample number. In a few cases, RNA samples from the same cellular origin were pooled before sRNA library construction; in such cases, the RNA sample numbers and FF ontology IDs are concatenated by a + sign.

Figure 3.1 shows a schematic view of the data stored in the FANTOM5 miRNA atlas. Each table in this schema corresponds to one flat file available at the FANTOM5 miRNA atlas website. At the core is the miRNA promoter annotation table, which associates each pre-miRNA with the corresponding mature miRNA as well as the promoter of the predicted pri-miRNA. Each pre-miRNA is identified by its pre-miRNA ID (i.e. the pre-miRNA name in miRBase) and its miRBase accession number, as well as by its genomic coordinates on genome assembly hg19 (for human) or mm9 (for mouse). Likewise, the mature miRNA is identified by its miRBase miRNA ID and miRBase accession number. Candidate novel miRNAs are indicated by their number in the accompanying publication (De Rie et al. 2017). The promoter of the predicted pri-miRNA is specified by its CAGE peak ID in FANTOM5 (Forrest et al. 2014), as well as by the genomic coordinate of the transcription start site.

The sRNA expression table provides the expression level, normalized to countsper-million, of each mature miRNA (identified by the miRNA ID) in the FANTOM5 sRNA samples. A table of sRNA library descriptions shows the RNA sample (specified by the FANTOM5 sample ontology ID and corresponding sample



Fig. 3.1 Database architecture of the FANTOM5 miRNA atlas

Accession	
number	Data description
DRA000991	CAGE data, human and mouse (Forrest et al. 2014)
DRA001101	sRNA data, human (Andersson et al. 2014)
DRA002711	CAGE data, mouse (Arner et al. 2015)
DRA002747	CAGE data, human (Arner et al. 2015)
DRA002748	CAGE data, mouse (Arner et al. 2015)
DRA003804	sRNA data, human (De Rie et al. 2017)
DRA003807	sRNA data, mouse (De Rie et al. 2017)
DRA000914	sRNA data, human and mouse; CAGE data, human and mouse (Fort et al.
	2014)

 Table 3.2
 Accession numbers for raw sequencing data at DDBJ

description) from which the sRNA library was produced. The sRNA cell ontology definitions table lists the sRNA libraries associated with each of the cell ontology terms; the miRNA cell ontology annotation table shows the three most enriched and depleted cell ontology terms for each miRNA, together with the statistical significance found.

The CAGE expression table provides the expression level, normalized to tagsper-million (t.p.m.), of all CAGE peaks associated with predicted pri-miRNAs for each CAGE library in FANTOM5, specified by their RNA sample number. The table of CAGE library descriptions shows the FANTOM5 sample ontology number and sample name for each CAGE library. The CAGE cell ontology definitions table shows the CAGE libraries (referenced by their RNA sample number) associated with each cell ontology term, while the pri-miRNA promoter cell ontology annotations show the three most enriched and depleted cell ontology terms for each pri-miRNA (identified by the CAGE peak ID of its associated promoter), together with the statistical significance found.

Raw sequencing data are available from the DNA Data Bank of Japan (DDBJ; https://www.ddbj.nig.ac.jp) as shown in Table 3.2. Sequence alignments to the human and mouse genome are available as part of the FANTOM5 data files (http://fantom.gsc.riken.jp/5/datafiles/). Expression tables as well as promoter, cell ontology, and sample annotations can be downloaded directly from the FANTOM5 miRNA atlas website, as described below.

3.4 Using the FANTOM5 miRNA Atlas Interactively

The FANTOM5 miRNA atlas is available at http://fantom.gsc.riken.jp/5/suppl/De_ Rie_et_al_2017/. The landing page (Fig. 3.2) provides links to the miRNA expression viewer including novel miRNAs (Fig. 3.2[®]) or excluding them (Fig. 3.2[®]) for faster loading. The landing page also provides a link to an interactive miRNA



Fig. 3.2 Landing page of the FANTOM5 miRNA atlas at http://fantom.gsc.riken.jp/5/suppl/De_ Rie_et_al_2017/

expression heatmap (Fig. 3.2©), showing the expression profile of mature miRNAs in the robust set in the human primary cells.

3.4.1 Using the miRNA Expression Viewer

The miRNA expression viewer (Fig. 3.3) visualizes the miRNA expression data and annotation files shown in Fig. 3.1. At the top of the miRNA expression viewer, the user can select to access either the human or the mouse data (Fig. 3.3O). The three panels below show, from left to right, the miRNA or sample list (Fig. 3.3O), the expression chart, cell ontology analysis, and annotation data (Fig. 3.3O), and the expression table (Fig. 3.3O).

In the left panel, the user can select to list miRNAs, the sRNA samples, or the CAGE samples (Fig. 3.4O). Selecting miRNAs will show a list of all mature miRNAs (both guide RNA and passenger strand RNA), the pre-miRNA from which they originate, and the associated pri-miRNA promoter (Fig. 3.4). Paralogous miRNAs will be listed once for each instance on the genome. The miRNAs can be sorted alphabetically by mature miRNA name (Fig. 3.4O), pre-miRNA name (Fig. 3.4O), or promoter name (Fig. 3.4O) by clicking on the corresponding label. To search for miRNAs, the name of the mature miRNA, of the pre-miRNA, or of the promoter of the pri-miRNA can be entered in the boxes below the label (Fig. 3.4O-). Selecting a miRNA from the list will highlight all instances of the mature miRNA (Fig. 3.4O), and the promoter of the associated pri-miRNA both for the guide RNA

3 Atlas of miRNAs and Their Promoters in Human and Mouse

IMPINA SHNA	samples CAGE S	ampies (B)	Expression Chart	U		Expression (D)	
miRNA +	pre-miRNA	Promoter E		hsa-miR	133a-3p	Description	Value I
			104				greater than
haa-miR-130a-3p	hsa-mir-130a	p1@ENST00000530596,	5				Jess than
hsa-miR-130a-5p*	hsa-mir-130a	p1@ENST00000530596,	§ 88			Skeletal muscle cells differentiated into Myotubes - mu	18,277
haa-mR-130b-3p	hsa-min-1305	p3@PP1.2	ad 22-			Skeletal muscle cells differentiated into Myotubes - mu	13,450
haa-miR-130b-5p*	hsa-mir-130b	p3@PPIL2	a 1	and the second se		Smooth Muscle Cells - Brachlocephalic, donor1	4,471
haa-miR-132-3p	haa-min-132	p@chr17:1954448.1954	e-1 muscle	cel		Skeletal Muscle Satellite Cells, donor3	3,110
hsa-miR-132-5p*	hsa-mir-132	p@chr17:19544461954	in the second		in the site of	Skaletal Muscle Cells, donor1	2,407
haa-miRi-1321	haa-min-1321	Unknown		Sampl	e Rank	Skeletal Muscle Cells, donor2	1,846
haa-miR-1322	hsa-mir-1322	pt@Pbbt	Ontology			Skeletal Muscle Satellite Cells, donor2	1,677
haa-miR-1323	haa-mir-1323	Unknown	Untology			Hepatic Shellate Cells ((pocyte), donor2	1,569
haa-miR-1324	hsa-mir-1324	Unknown	Cell Ontology	P-value	Enriched/Depleted	Fibroblast - Mammary, donor3	1,482
na-mill-133a-3p	haa-mir-133a-1	p1@uc002kir2,p1@uc00	muscle cell	3.84207e-31	enriched	Skeletal Muscle Cells, donor3	642
na-mill-133a-3p	haa-mir-133a-2	p1@C20orf166	cell of skeletal muscle	4.372728-30	enriched	Myoblast, donor1	626
haa-miR-133a-5p*	hsa-mir-133a-1	p10uc002ktr2,p10uc00	skeletal muscle myoblast	4.23161e-22	enriched	spinal cord, adult, donor10252	366
hsa-miR-133a-5p*	hsa-mir-133a-2	p1@C20orf166	epithelial cell	1.01808e-17	depieted	Mysblast, donor3	159
haa-miR-133b	hsa-mir-1335	pBchv6.52001069.5200	hematopoietic cell	1.32164e-11	depleted	Prostate Epithelial Cells (polarized), donor1	153
haa-miR-134-3p*	haa-min-134	p10MEG3	ectodermal cell	1.49185e-10	depleted	Skaletal Muscle Satellite Cells, donor1	124
	A	-1012700				Synoviacyte, donor1	123
otal Items: 2918			Annotation			Total Items: 309	
			miR0 pre-miR0 pre-miRNA Locati Promo	NA: hsa-miR-133 NA: hsa-miR-133a on: chr18 19,405 ter: p1@uc002ktr S5: chr18 19,411	a-3p MIMAT0000427 (3 -1 M0000450 (7 658-19,405,746- zentu view (8 2,p100c00245 2 356- motou view (8		

Fig. 3.3 FANTOM5 miRNA expression viewer showing human pre-miRNA hsa-mir-133a-1 with its associated mature miRNA hsa-miR-133a-5p (guide) and pri-miRNA promoter p1@uc002ktr.2, p1@uc002kts.2

(Fig. 3.4) and for the passenger strand RNA (Fig. 3.4). The promoter is also highlighted for any other miRNAs originating from the same pri-miRNA (Fig. 3.4). In addition to the columns shown, the pre-miRNA ID (Fig. 3.5) and the miRNA ID as defined by miRBase (Fig. 3.5) can be included in this table by clicking on the options button (Fig. 3.4) to open the options menu (Fig. 3.5).

The center panel (Fig. 3.6) shows the expression chart (Fig. 3.6A) for the miRNA selected in the left panel, with the expression in counts-per-million (c.p. m.) on the vertical axis on a logarithmic scale, and the samples sorted by the expression of the miRNA on the horizontal axis. The expression chart can be downloaded as an editable vector image file in the Scalable Vector Graphics (SVG) format by clicking on "Download SVG" (Fig. 3.3E).

For guide strand mature miRNAs, below the expression chart the cell ontology panel (Fig. 3.6^(B)) shows a table with the cell ontology clusters in which expression of the miRNA is most enriched or depleted, with the statistical significance shown as the P-value. Selecting a cell ontology term from this table will indicate the expression rank of the associated samples on the sample rank bar of the expression chart (Fig. 3.6^(D)) as a visual representation of the expression enrichment or depletion of the miRNA in the selected cell ontology cluster samples. Figures 3.6 and 3.7 show the examples of hsa-miR-16-5p and hsa-miR-100-5p with enriched and depleted, respectively, expression in leukocytes. Further below, the annotation panel (Fig. 3.6^(D)) provides links to the mature miRNA and the pre-miRNA in the miRBase (Kozomara and Griffiths-Jones 2014) database (Fig. 3.6^(E)), the genomic coordinates of the pre-miRNA, the FANTOM5 name of the promoter associated with the pri-miRNA, the coordinates of the transcription start site (TSS), and links to

	pre-miRNA	Promoter D
hsa-miR-154-3p*	hsa-mir-154	p1@MEG3
hsa-miR-154-5p	hsa-mir-154	p1@MEG3
hsa-miR-155-3p*	hsa-mir-155	p1@MIR155HG
hsa-miR-155-5p	hsa-mir-155	p1@MIR155HG
hsa-miR-1587	hsa-mir-1587	Unknown
hsa-miR-15a-3p*	hsa-mir-15a	p1@DLEU2
hsa-miR-15a-5p	hsa-mir-15a	p1@DLEU2
hsa-miR-15b-3p*	hsa-mir-15b	p1@SMC4
hsa-miR-15b-5p	hsa-mir-15b	p1@SMC4
hsa-miR-16-1-3p*	hsa-mir-16-1	p1@DLEU2
hsa-miR-16-2-3p*	hsa-mir-16-2	p1@SMC4
hsa-miR-16-5p	hsa-mir-16-2	p1@SMC4
hsa-miR-16-5p	hsa-mir-16-1	p1@DLEU2
hsa-miR-17-3p*	hsa-mir-17	p1@MIR17HG
hsa-miR-17-5p	hsa-mir-17	p1@MIR17HG
hsa-miR-181a-2-3p*	hsa-mir-181a-2	p1@MIR181A2HG
hsa-miR-181a-3p*	hsa-mir-181a-1	p1@LOC100131234

Fig. 3.4 Left panel of the miRNA expression viewer, showing the list of miRNAs

the pre-miRNA and TSS region in the ZENBU (Severin et al. 2014) genome browser (Fig. 3.6).

The right panel (Fig. 3.8) shows an expression table with the expression level in c.p.m. of the selected miRNA in each of the FANTOM5 samples. By default, samples are sorted by expression level of the miRNA. The samples can be sorted alphabetically by clicking on the description label (Fig. 3.8^(a)) and sorted by increasing or decreasing expression level by clicking on the value label (Fig. 3.8^(b)). Samples with miRNA expression levels greater than or less than a user-specified value can be selected by entering the desired maximum and minimum values in the boxes below the value label (Fig. 3.8^(b)). Clicking on the option button

miRNA	IRNA sRNA Samples CAGE Samples					
miRNA		pre-miRNA	Pron	noter =		
				Clear all filters		
hsa-miR-685	9-5p	hsa-mir-6859-1	p1@	Columns:		
hsa-miR-6859-3p*		hsa-mir-6859-1	p1@	✓ miRNA		
hsa-miR-200b-5p*		hsa-mir-200b	p@c	✓ pre-miRNA		
hsa-miR-200b-3p		hsa-mir-200b	p@c	A Demotes		
hsa-miR-200a-5p*		hsa-mir-200a	p@c	✓ Promoter		
hsa-miR-200a-3p		hsa-mir-200a	p@c	× pre-miRNA ID		
hsa-miR-429		hsa-mir-429	p@c	× miRNA ID		
hsa-miR-6726-5p*		hsa-mir-6726	p1@/	AUAPJ		

Fig. 3.5 Options menu for the left panel of the miRNA expression viewer, in which the columns to be shown in the list of miRNAs can be selected

(Fig. 3.8^(D)) to the right of the value label will display open the options menu displaying a list of columns to be shown in this panel (Fig. 3.9), which allows including the rank (Fig. 3.9^(A)) and name (Fig. 3.9^(B)) of each sample as additional columns in the expression table. Here, the expression ranks are numbered starting from 0, and the name consists of the sRNA library, barcode, and RNA sample number concatenated by periods. This panel also allows exporting the expression table as a downloadable file of comma-separated values (csv) (Fig. 3.9^(C)).

Selecting sRNA samples or CAGE samples in the left panel (Fig. 3.4O). The sample ID (Fig. 3.11O) and SSTAR ID (Fig. 3.11O) can be shown as additional columns by selecting them in the options menu (Fig. 3.11) accessible by clicking the options button (Fig. 3.10O). Choosing one of the samples will show the expression levels of miRNAs in the expression chart in the central panel, together with the sample annotation information (Fig. 3.12); the expression table in the right panel will show the expression levels numerically for each mature miRNA in c.p.m. (Fig. 3.13). Clicking the options button (Fig. 3.13O) will display the options menu from which the miRNA expression rank (Fig. 3.14O) and miRBase name (Fig. 3.14O) can be shown as additional columns. The options menu also allows exporting the data visible in the expression table as a downloadable file with commaseparated values (csv) (Fig. 3.14O).



Fig. 3.6 Central panel of the miRNA expression viewer, showing the expression chart and sample rank, the cell ontology results, and the annotation data of the miRNA, pre-miRNA, and promoter. For the selected miRNA, hsa-miR-16-5p, expression is enriched in leukocytes



Fig. 3.7 Expression chart, sample rank, and cell ontology results for miRNA hsa-miR-100-5p, for which expression is depleted in leukocytes

3.4.2 Using the Interactive miRNA Expression Heatmap

The interactive miRNA expression heatmap can be accessed by clicking on the link on the landing page of the FANTOM5 miRNA atlas (Fig. 3.2[©]). The heatmap (Fig. 3.15) shows the expression level of the 735 annotated mature miRNAs (guide strand only) in the robust set (De Rie et al. 2017) as rows, in 118 primary cell types in human, after averaging over donors, as columns. One cell type ("Fibroblast— Pulmonary Artery") was dropped from the full set of samples (Table 3.1) as the corresponding sRNA library had fewer than 100,000 reads. Cell types were grouped

Expression

Description (A)	B Value ≡
	greater than
	less than
CD19+ B Cells, donor3	50,551
CD19+ B Cells, donor1	48,517
CD19+ B Cells, donor2	47,791
CD14+ Monocytes, donor1	43,497
CD14+ Monocytes, donor2	35,758
CD14+ Monocytes, donor3	31,372
Peripheral Blood Mononuclear Cells, don	27,987
Neutrophils, donor1	27,142
CD14+ monocytes - treated with BCG, do	26,598
Peripheral Blood Mononuclear Cells, don	21,933
Peripheral Blood Mononuclear Cells, don	20,465
CD14+ monocyte derived endothelial pro	19,832
CD14+ monocyte derived endothelial pro	19,641
MCF7 breast cancer cell line response to	19,578
Mast cell - stimulated, donor1	19,345
	18,121

Fig. 3.8 Expression table for miRNA hsa-miR-16-5p, which is highly expressed in CD19+ B cells, CD14+ monocytes, and other leukocytes

by category (Fig. 3.15) as indicated by the color bar below the cell type name (Fig. 3.15).

To sort the heatmap, both miRNAs and cell types were clustered using pairwise centroid-linkage hierarchical clustering with the Pearson correlation as the similarity measure (De Hoon et al. 2004) after normalizing the expression of each miRNA to



Expression

Fig. 3.9 Options menu for the right panel of the miRNA expression viewer, in which the columns to be shown in the expression table can be selected, and data can be exported as a downloadable file in the csv (comma-separated values) format

Z-scores by subtracting the mean and dividing by the standard deviation across samples. The hierarchical clustering tree itself is not displayed. Each cell in the heatmap is colored based on the calculated Z-score of the expression of the miRNA in the cell type (Fig. 3.15©). Hovering with the mouse over a cell in the heatmap will show the mature miRNA name, the cell type, the category to which the cell type belongs, and the Z-score of the miRNA expression level in the cell type (Fig. 3.16). Clicking on a cell or on a miRNA name will redirect the browser to the miRNA expression viewer for the corresponding miRNA. The expression data shown in the heatmap can be downloaded as a tab-delimited file by clicking on "Download Data" (Fig. 3.15©).

3.5 Database Access and Mining Methods

A flat file for each table shown in Fig. 3.1 can be downloaded from the FANTOM5 miRNA atlas website by clicking on the download button (Fig. $3.3 \oplus$).

The miRNA promoter annotation table is provided as the tab-delimited files human.promoters.tsv and mouse.promoters.tsv for human and mouse, respectively. This file contains two lines for each pre-miRNA, corresponding to the guide strand and the passenger strand of the mature miRNA. Each line shows the name and miRBase ID of the pre-miRNA, its chromosome, strand, and genomic coordinates, the name and miRBase ID of the guide RNA or passenger strand RNA of the associated mature miRNA, the short description of the FANTOM5 CAGE

miRNA	sRNA Samples	CAGE Samples	
Description	•		= (A
Adipocyte - b	reast, donor1		
Adipocyte - b	reast, donor2		
Adipocyte - o	mental, donor1		
Adipocyte - o	mental, donor2		
Adipocyte - o	mental, donor3		
Adipocyte - p	erirenal, donor1		
Adipocyte - s	ubcutaneous, donor1		
Adipocyte - s	ubcutaneous, donor2		
Adipocyte - s	ubcutaneous, donor3		
Alveolar Epith	nelial Cells, donor1		
Alveolar Epith	nelial Cells, donor2		
Alveolar Epith	nelial Cells, donor3		
Amniotic Epit	helial Cells, donor1		
Amniotic Epit	helial Cells, donor2		
Amniotic Epit	helial Cells, donor3		
amniotic men	nbrane cells, donor3		
Anulus Pulpo	sus Cell, donor1		
Total Items: 39	9		

Fig. 3.10 Left panel of the miRNA expression viewer, showing the list of sRNA samples

peak of the promoter associated with the pri-miRNA, and the transcription start site of the pri-miRNA.

The sRNA expression tables, human.srna.cpm.txt for human and mouse. srna.cpm.txt for mouse, are tab-delimited files with the expression of both the guide and passenger strand of each miRNA, identified by its miRBase ID, in each sRNA library. Expression values are normalized to counts-per-million (c.p.m.) in



Fig. 3.11 Left panel of the miRNA expression viewer, showing the list of CAGE samples, together with the options menu in which columns to be included can be selected



Fig. 3.12 Expression chart for miRNA expression in "alveolar epithelial cells, donor 2" as measured by sRNA sequencing, together with the annotation data of this sample

Expression

Expression

Description	Value		
	greater than		
	less than		
hsa-miR-21-5p	143,766		
hsa-miR-22-3p	122,264		
hsa-miR-92a-3p	82,867		
nsa-miR-30d-5p	78,553		
hsa-miR-181a-5p	51,840		
hsa-let-7f-5p	50,595		
hsa-miR-27b-3p	36.208		

Fig. 3.13 Right panel of the miRNA expression viewer, showing the expression table for miRNA expression in sample "alveolar epithelial cells, donor 2" as measured by sRNA sequencing

Description	Value
	Clear all filters
	Export visible data as csv
hsa-miR-21-5p	Columns:
hsa-miR-22-3p	A Rank
hsa-miR-92a-3p	
hsa-miR-30d-5p	✓ Description
hsa-miR-181a-5p	B × Name
hsa-let-7f-5p	✓ Value
hsa-miR-27b-3p	

Fig. 3.14 Options menu for the right panel of the miRNA expression viewer, in which the columns to be shown in the expression table can be selected, and data can be exported as a downloadable file in the csv (comma-separated values) format

3 Atlas of miRNAs and Their Promoters in Human and Mouse



Fig. 3.15 Interactive heatmap showing the expression of mature miRNAs (guide RNA) in the robust set (De Rie et al. 2017), normalized to Z-scores, in human primary cell types after averaging over donors

each library separately. The sRNA library IDs are associated with an FF ontology ID and sample description in the files human.srna.samples.tsv and mouse. srna.samples.tsv.

The CAGE expression tables, human.cage.tpm.txt and mouse.cage. tpm.txt for human and mouse, respectively, are tab-delimited files with the CAGE expression level of the FANTOM5 CAGE peaks associated with pri-miRNAs as shown in the miRNA promoter annotation table. Each column corresponds to one CAGE library, as identified by its associated RNA sample number, and is normalized to tags-per-million (t.p.m.). The RNA sample numbers are associated with an FF ontology ID and sample description in the files human. cage.samples.tsv and mouse.cage.samples.tsv.

The miRNA cell ontology annotations based on the sRNA expression patterns across cell types are available in the file human.mirna.cellontology.tsv, listing for each miRNA (identified by miRBase ID) the three cell ontology clusters in which the expression of the miRNA is most enriched, and the three cell ontology clusters in which the expression is most depleted. The sRNA cell ontology definitions are provided in the file human.srna.cellontology.tsv, listing the sRNA samples associated with each cell ontology cluster. Similarly, the file human.promoter.cellontology.tsv lists for each FANTOM5 CAGE peak associated with a pri-miRNA the three cell ontology clusters in which the cAGE expression levels of the pri-miRNA are most enriched, and the three cell ontology definitions are provided in the file human.cage.cellontology.tsv, listing the RNA sample numbers associated with each cell ontology cluster.

Smooth Muscle Catls - Lisophageal Fibrobiast - Periodontal Ligament Keratecytes Trabecular Mestwork Cells Trabecular Colls Fibrobiast - Cheroid Plexus	Smooth Muscle Cells - Colonic Har Folicle Dermal Papila Cells Parcreatic stremal cells Osteoblard Meserchymal Stem Cells - umblical Smooth Muscle Cells - Brain Vascular	Pericytes Smooth Muscle Cells - Bronchial amniotic membrane cells Placental Epithelial Cells Amniotic Epithelial Cells Mesenchyrml Stern Cells - amniotic membr Poetste Stromal Cells	Smooth Muscle Calls - Prostate Smooth Muscle Calls - Prostate Ebrobiast - Lymphatic Preadpocyte - subcutaneous Preadpocyte - subcutaneous Skeletal Muscle Cells Skeletal Muscle Cells	Skeletal Muscle Satelite Cels Skeletal Muscle Satelite Cels Hepatis Snusoidal Endothelial Cels Renal Giomenuar Endothelial Cels Endothelial Cels - Microvascular Endothelial Cels - Urmbind	Endothelial Cells - Thoractic Endothelial Cells - Veim Endothelial Cells - Artery Endothelial Cells - Artery Mast cell Ob3+ T Cells Dendrict Cells - monocyte immature derived Mastrophage - monocyte derived	CU14+ monocyte derived endotheilal proget Neutrophils CD14+ Monocytes CD19+ B Cells Peripheral Blood Mononuclear Cells Natural Kine Cells
	Skelet	tal muscle	cells differ multinuc (contracti Z-Score:	entiated int leated le cell) 0.980	to Myotubes -	
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Fig. 3.16 Popup shown when hovering the mouse over a particular cell in the interactive heatmap, with the mature miRNA name, sample description, cell type category, and Z-score

3.6 Summary and Future Development of the Database

The FANTOM5 expression atlas of miRNAs and their promoters provides a basis for a detailed analysis of the transcriptional regulation of miRNAs and their role in defining cell types. The atlas will be extended in the near future sRNA sequencing data for rat, dog, and chicken (Table 3.1), together with promoter annotations for miRNAs in these three species, opening the door to cross-species comparisons of miRNA expression and regulation.

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