tsRBase: a comprehensive database for expression and function of tsRNAs in multiple species

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ABSTRACT

tRNA-derived small RNAs (tsRNAs) are a class of novel small RNAs, ubiquitously present in prokaryotes and eukarvotes. It has been reported that tsR-NAs exhibit spatiotemporal expression patterns and can function as regulatory molecules in many biological processes. Current tsRNA databases only cover limited organisms and ignore tsRNA functional characteristics. Thus, integrating more relevant tsRNA information is helpful for further exploration. Here, we present a tsRNA database, named tsRBase, which integrates the expression pattern and functional information of tsRNAs in multiple species. In tsRBase, we identified 121 942 tsRNAs by analyzing more than 14 000 publicly available small RNA-seg data covering 20 species. This database collects samples from different tissues/cell-lines, or under different treatments and genetic backgrounds, thus helps depict specific expression patterns of tsR-NAs under different conditions. Importantly, to enrich our understanding of biological significance, we collected tsRNAs experimentally validated from published literatures, obtained protein-binding tsRNAs from CLIP/RIP-seq data, and identified targets of tsRNAs from CLASH and CLEAR-CLIP data. Taken together, tsRBase is the most comprehensive and systematic tsRNA repository, exhibiting all-inclusive information of tsRNAs from diverse data sources of multiple species. tsRBase is freely available at http://www.tsrbase.org.

INTRODUCTION

tRNA-derived small RNAs (tsRNAs) are a group of novel small non-coding RNAs that arise from either tRNA precursors or mature tRNAs. In the late 1970s, tsRNAs were originally discovered and considered as random degradation byproducts of tRNAs, so they were ignored for a long time (1). Until 2005, Lee *et al.* reported that certain tsRNAs were induced by starvation in *Tetrahymena thermophile*, indicating that tsRNA expression is regulated under specific conditions (2). In 2008, Dr Qu's group identified the stressinduced tsRNAs in the primitive eukaryote *Giardia lamblia* and first proposed these tRNA fragments as a novel class of small RNAs (3). With the rapid development and application of high-throughput sequencing technology, tsRNAs have been found to universally exist in all kingdoms of life (4–6).

tsRNAs are usually 16–40 nt in length, and are divided into three distinct categories according to the cleavage sites within the source tRNAs: (i) tRNA-derived fragments (tRFs), which are generated through the endo-nucleolytic cleavage of mature tRNAs (7,8); (ii) 3'U tRF, which are cleaved from 3' end of pre-tRNAs by RNase Z during tRNA maturation (9–11) and (iii) tRNA halves (tRHs or tiRNAs), which are produced from ribonucleolytic cleavage in the anti-codon loop of mature tRNAs by angiogenin (ANG, an RNase A family member) in mammals (12,13) and by an RNase T2 family member, Rny1, in yeast (7).

Numerous studies have demonstrated that tsRNA expression is tightly regulated during development or under stress conditions (3,14,15). For example, the expression of 5' tRHs of tRNA-Gly increased during post-testicular sperm maturation (16). In addition, ANG-mediated tsR-NAs have been reported to accumulate during different stress treatments, such as heat shock, UV irradiation

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and nutrition deficiency (12,13). Intriguingly, tsRNAs are dysregulated in multiple cancers and could be potential biomarkers for cancer diagnosis (17–20).

Increasing evidence indicates that tsRNAs play important roles in many biological processes, such as cell proliferation, translation inhibition, genome stability maintenance and intergenerational epigenetic inheritance (4,6,9,11,16,21–27). Similar to miRNA or piRNA, tsRNA was found to bind AGO or PIWI proteins to suppress the expression of target genes at transcriptional and/or post-transcriptional levels (5,28,29). However, the detailed molecular mechanism of tsRNAs *in vivo* requires further exploration.

Currently, seven tsRNA databases are available, including tRFdb (30), PtRFdb (31), tRex (32), MINTbase 2.0 (33), tRF2Cancer (34), tRFexplorer (35) and OncotRF (36). Among them, tRFdb was the first tsRNA database, collecting tsRNAs from approximately 200 small RNA-seq data of eight different species, but it has not been updated for several years. The PtRFdb database only provides basic information, such as tsRNA type and sequence, from 10 different plant species. The tRex database reports tsRNA profiling of the model plant Arabidopsis thaliana from 300 samples of different tissues, ecotypes, genotypes or stress conditions. The following four databases focus on human cells or cancers. MINTbase 2.0 and tRF2Cancer provide tsRNAs' diversity and expression patterns in human cancer samples from The Cancer Genome Atlas (TCGA) database, tRFexplorer mainly exhibits differential expression and correlation analyses of tsRNAs from NCI-60 cancer cell lines and TCGA samples, while OncotRF contains tsRNAs' expression, tsRNA-gene correlations and survival analyses in cancer. Altogether, these databases have increased our knowledge of tsRNAs in different species, but do not provide any information about tsRNA function. Hence, it is essential to construct a comprehensive database covering tsRNAs' profiling in different biological processes and in different organisms, especially combining functional information of tsRNAs with their targets.

Herein, we developed 'tsRBase', a comprehensive tsRNA database that integrates over 14 000 public small RNA-seq data across 20 organisms. With a friendly user interface, people can easily search for tsRNAs of interest, and compare tsRNA expression levels under different conditions. Furthermore, we not only collected functional tsRNA from the published literatures, but also identified protein-binding tsRNAs and their targets from publicly available datasets for the first time (37,38). We believe that tsRBase will be a valuable and comprehensive resource for scientists who study tsRNAs from different fields.

MATERIALS AND METHODS

Pre-processing of the small RNA-seq

The small RNA sequencing data were downloaded from the Sequence Read Archive (SRA) database (http://www. ncbi.nlm.nih.gov/sra) (39). The adapter sequences from the raw data were removed using Cutadapt (40). Clean reads with length of 16–40 bases were kept for subsequent analyses.

Building tRNA index

The sequences of the tRNA genes from 20 species were downloaded from the 'Genomic tRNA database' (GtR-NAdb) (http://gtrnadb.ucsc.edu) (41). Only high confident tRNAs with conserved secondary cloverleaf structure were used. Reference genomes with the same genome assembly as GtRNAdb were downloaded (Supplementary Table S1). Mature tRNA sequences were obtained by removing intron sequences and adding 'CCA' tail at the end of the original sequences of tRNAs. 100 nucleotides downstream sequences of tRNAs were extracted from reference genome based on their genomic coordinates.

Mapping small RNA

Species-specific tRNA BLAST databases were built for small RNA sequences query. We then used BLAST-2.2.16 to find the tRNA-related RNA sequences in each library (42). We only considered those small RNAs that were perfectly mapped to the tRNA sequence as tsRNAs. Then the expression value of tsRNA was quantified using our custom script. Next, we filtered tsRNAs with expression value lower than one count-per-million (CPM) and/or expressed in less than five samples to eliminate random degradation sequences.

Annotation of tsRNAs

The types of tsRNAs were determined according to where tsRNAs were generated from their corrsesponding tRNAs. In brief, sequences that map to the 5' or 3' extreme end of mature tRNAs and do not overlap with anticodon-loop were classified as 5' tRFs or 3' tRFs, respectively. Sequences that map to the 5' or 3' extreme end of mature tRNAs and also overlap with anticodon-loop were defined as 5' tRHs and 3' tRHs, respectively. The sequences exclusively from internal regions of mature tRNAs were annotated as inter tRFs. Sequences mapping the downstream of mature tR-NAs and ending with or without UUU were annotated as 3'U tRFs.

tsRNA target identification through CLASH/CLEAR data analysis

Crosslinking, ligation, and sequencing of hybrids (CLASH) and Covalent ligation of endogenous Argonaute-bound RNAs (CLEAR)-CLIP are two new techniques that designed to directly observe miRNA-target interaction in vivo through AGO binding (37,38). In addition, some studies have demonstrated that tsRNAs can recognize specific RNA targets through AGO protein in a miRNA-like way (5,43,44). Therefore, we used a custom pipeline to explore tsRNA-target interaction in CLASH/CLEAR-CLIP data. Three datasets were used: (i) CLASH data of human HEK293 cells (GSE50452); (ii) CLEAR-CLIP data of human Huh7.5 cells (GSE73057); (iii) CLEAR-CLIP data of mouse cortex (GSE73058). We first used Cutadapt to remove adapters and filter reads less than 16 nt. Then, we collapsed reads with the same sequence and counted the number of each unique read. The reads were then mapped to the tRNA reference. Reads that partially match (16-40 nt of the reads mapped to tRNAs perfectly and the unmapped part was >8 nt) to tRNAs were kept as candidate tsRNA-target chimeras. Next, we mapped the candidates to the genome using bowtie-1.2.2 and blat v.35, to mark and remove fake chimeras that can mapped to other sites. At the same time, we mapped the candidates to the NT database to remove pollutants. Then, the candidate tsRNA-target chimeras were split into tsRNAs and target sequences. The target sequences were mapped to the genome to obtain their corresponding genome positions, and then the 100 nt downstream of the ligation sites were assigned as target sequences. The duplex structure predictions for tsRNAs and target regions were made using RNAhybrid (45). Target genes were annotated using bedtools (46).

Protein binding tsRNAs exploration from CLIP/RIP data

The small RNA-seq data of protein CLIP/RIP samples were first pre-processed as previously mentioned. Only reads with a length between 16 nt and 40 nt were kept. Each unique read was then collapsed and counted. Next, we used BLAST-2.2.16 to map these reads to their corresponding tsRNA reference to get the protein binding tsRNAs and their expression value. At last, we normalized each tsRNA's expression value to CPM.

Mining tsRNA literatures

Since articles that describe tsRNAs' specific expression patterns or biological functions are limited, it is feasible to use a text-mining approach to search for the information of tsR-NAs in the full-text of open access articles. We first collected all articles that mentioned the tsRNAs by searching keywords such as 'tsRNA', 'tRF' or 'tRNA' in the NCBI PubMed database. Then we identified tsRNAs with validated specific expression or function by full-text mining. All the information of these tsRNAs was recorded and corresponded to tsRBase ID.

Implementation

The tsRBase was built under the XAMPP environment on the Linux system, which is comprised of Apache HTTP server version 2.4.33 with MariaDB 10.1.33 at the back end, and the PHP 7.2.6, HTML and JavaScript at the front end. The BLAST function was set up based on ViroBLAST (47).

RESULTS

Data content of tsRBase

tsRBase characterized and integrated tsRNAs from more than 14 000 small RNA-seq data. In total, 121 942 tsR-NAs were identified, belonging to 20 species, including human (*Homo sapiens*), *Arabidopsis thaliana*, cow (*Bos taurus*), nematode (*Caenorhabditis elegans*), *Clostridium acetobutylicum*, zebra fish (*Danio rerio*), fruit fly (*Drosophila melanogaster*), *Escherichia coli*, chicken (*Gallus gallus*), soybean (*Glycine max*), mouse (*Mus musculus*), rice (*Oryza sativa*), sheep (*Ovis aries*), *Physcomitrella patens*, rat (*Rattus norvegicus*), yeast (*Schizosaccharomyces pombe*), pig (*Sus*

Table 1	Samples and	number of	tsRNAs	of 20 s	species in tsRBase	
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Kingdom	Species	Samples	Number of tsRNAs
Animal	Homo sapiens	7619	24 773
	Mus musculus	2304	13 310
	Rattus norvegicus	1034	9035
	Bos taurus	569	5091
	Ovis aries	73	1946
	Sus scrofa	190	3995
	Gallus gallus	142	5262
	Xenopus tropicalis	13	84
	Danio rerio	122	3538
	Drosophila melanogaster	402	5914
	Caenorhabditis elegans	292	7026
Plant	Arabidopsis thaliana	592	7747
	Glycine max	279	5836
	Oryza sativa	204	5739
	Vitis vinifera	148	5063
	Zea mays	217	4382
	Physcomitrella patens	33	2027
Fungi	Schizosaccharomyces pombe	244	10 981
Bacteria	Escherichia coli	39	173
	Clostridium acetobutylicum	84	20
	Total	14 600	121 942

Table 2 Number of data used to reveal functional tsRNAs in tsRBase

Species	CLIP/RIP	CLASH/CLEAR-CLIP
Arabidopsis thaliana	103	-
Caenorĥabditis elegans	6	-
Danio rerio	2	-
Drosophila melanogaster	137	-
Homo sapiens	153	22
Mus musculus	96	26
Oryza sativa	3	-
Rattus norvegicus	1	-
Xenopus tropicalis	4	-

scrofa), grape (*Vitis vinifera*), frog (*Xenopus tropicalis*) and corn (*Zea mays*) (Table 1).

Importantly, tsRBase attaches the important information about biological functions of tsRNAs. For this purpose, we collected and analyzed the following different sources that contributed to functional research, and these results were embedded in the database: (i) the published literatures about tsRNAs with experimentally validated expression patterns or biological functions; (ii) proteinbinding tsRNAs identified from 501 CLIP/RIP small RNA-seq data crossing nine species (human, *Arabidopsis thaliana*, nematode, zebra fish, fruit fly, mouse, rice, rat and frog); (iii) tsRNA-target pairs based on the CLASH data (human) and CLEAR-CLIP data (human and mouse) analysis (Table 2).

Web interface and usage

Search. In order to fulfill different users' requirements, tsRBase provides users with three basic ways to query information of tsRNAs in the module 'Search' (Figure 1A). First, users can search for tsRNAs by their unique tsRBase IDs from the interface. Second, users can search for tsRNAs based on biological traits such as the corresponding amino acid, anticodon type, and co-ordinates of the tRNA from which they are derived. Third, tsRBase also allows the per-



Figure 1. Overview of tsRBase database. (A) The page with searching tools in tsRBase. (B) The result table of tsRNAs after searching by tsRNA ID, tRNA type or experimentally validated tsRNAs. (C) The summary page of tsRNAs resulted from the input sequence and BLAST searching. (D) The page for browsing tsRBase by species. (E) Summary of tsRNAs in *Homo sapiens*. (F) The page displaying the tsRNA targets. (G) The page showing the published tsRNA literatures.

formance of BLAST tool to find out whether the sequences are tsRNAs and obtain relevant information. In this function, users can input the sequences through either loading a local file or directly pasting the sequences in the input box. In addition to performing BLAST with default parameters, tsRBase also provides additional options for finetuning parameters. For example, users can set the mismatch scores, the mode of alignment (with or without indels), the gap costs of matches and the statistical significance expect threshold to get the final output. Subsequently, users can filter the result using the BLAST score or similarity percentage of sequences.

Since some tsRNAs have been reported to exhibit certain biological functions or expression patterns, we excavated all the scientific literatures and collected tsRNAs with experimentally validated biological functions or expression patterns. Moreover, we provided users with a tool to obtain these validated tsRNAs by searching both species and known biological traits (biological function or expression pattern) (Figure 1A).

All the tsRNA search outputs are displayed in tables. For direct searches (ID based, tRNA based, and experimentally validated tsRNAs searching), a summary table will be provided on the result page displaying five items: tsR-Base ID (hyperlinks to the page of detailed tsRNA information), tRNA type, anticodon, tsRNA type and species (Figure 1B). For the BLAST search, the result tables include query sequence accession, subjected tsRNA ID, BLAST score, identities of matching, similarity percentage and expect value (Figure 1C). For each item, the hyperlinks of 'BLAST score' and 'Subject' are further hyperlinked to the detailed information of alignment and a certain tsRNA, respectively.

Browse. The browse page presents users a species phylogenetic list (Figure 1D). Users can click taxa to expand and collapse the tree. When clicking the Latin name of selected species, the link will direct users to a summary page of the species, which shows the histogram of different types of tsR-NAs in this species (Figure 1E). Furthermore, each bar of the histogram hyperlinks to the list of corresponding types of tsRNAs.

tsRNA Targets. Understanding targets of tsRNA is crucial for uncovering tsRNA's role in cellular biological implication. Thus, we explored tsRNA-target interactions through AGO protein in the CLASH and CLEAR-CLIP datasets, and found 3298 tsRNA-target pairs. The results are shown in the 'tsRNA Targets' module (Figure 1F). This table shows the tsRBase ID of tsRNA, gene name, Ensembl ID and biological type of target gene, and the dataset from which this result was derived.

tsRNA Literatures. Currently, tsRNAs are attracting the attention of scientists more than ever, and fruitful research achievements have been made. In order to sort out the developmental skeleton of tsRNA research and help follow research progress, we collected as many tsRNA-related literatures as we can and displayed them in the 'tsRNA Literatures' module (Figure 1G). At present, we have collected 364 literatures on our website.

Detailed information page of tsRBase

Detailed information about each tsRNA is integrated and displayed on the result page. Here, we take hsa_tsr001178 as an example to describe each section of the result page (Figure 2). First, the page displays the unique tsRBase ID (hsa_tsr001178) of this tsRNA and the Latin name of the species (*Homo sapiens*). The 'Sequence & Align' section shows the sequence of hsa_tsr001178 and demonstrates that it comes from the 3' end of tRNA-Leu-TAA-1-1. The 'Target' provides the predicted targets of tsRNAs identified from CLASH or CLEAR-CLIP data. Here we know that hsa_tsr001178 might target RNA polymerase II subunit A (POLR2A) gene from the CLASH data. Moreover, users can acquire more information about POLR2A gene through the hyperlinks to NCBI, Ensemble and Uniprot databases.

The 'Expression' part provides the expression value of hsa_tsr001178 in different GEO datasets. The GEO accession hyperlinks to the GEO database and can display the detailed information of each dataset. Furthermore, users can click the 'show boxplot' button to see the boxplot of this tsRNA between different groups (the grouping method is according to the specific GEO dataset, which can be different cell/tissue or different treatment). In addition, users can download the expression data of the tsRNA embedded in each boxplot.

The 'Protein binding tsRNA' section has a table showing the abundance of the tsRNA in different CLIP/RIPseq data. For hsa_tsr001178, the table displays its expression value in a total of 119 data, such as Ago HITS-CLIP in BC-3 cells and BCBL-1 cells.

The 'Experimentally validated tsRNA' part describes the biological function or specific expression pattern of tsRNA. Here, we can see that hsa_tsr001178 repress gene expression with a sequence complementary to the 3' UTR of the target mRNA in an AGO-dependent manner (26). Lastly, the 'References' section exhibits published articles related to this tsRNA.

DISCUSSION

In the past few years, studies on tsRNAs have increased rapidly. It has been demonstrated that tsRNAs have specific expression patterns and important biological functions. However, current tsRNA databases merely focused on certain basic biological traits of tsRNAs, such as sequences or expression levels in limited organisms, thus this is far from meeting the needs of actual tsRNA research. Hence, we built a new tsRNA database, named tsRBase, which not only collects basic traits of tsRNAs from wide range of species, but also focuses on the targets and biological functions of tsRNAs. Besides, full-featured searching tools are provided for users to conduct diverse tsRNAs analyses.

Compared with existing tsRNA databases, tsRBase has made the following important adjustments. First, tsRBase provides genome-wide view of tsRNAs' expression in various tissues/cell-lines or under specific conditions covering as many as 20 organisms, including animals, plants, fungi and bacteria. This makes tsRBase hitherto a database of

Accession	hsa_tsr001178				
Species	Homo sapiens				
Sequence & Align	tRNA-Leu-TAA-1-1	ACCAGGATGGCCGAG	TGGTTAAGGCGTTGGAC	TAAGATCCAATGGACATATGTCCGCGTGGGTTCGAACCCCACTCC	TGGTACCA D-loop Anticodon-loop T-loop
	hsa_tsr001178				TGGTACCA
Target	1. POLR2A RNA polymeras Gene Type: pro Entrez Gene: 54 Ensembl: ENSG Supporting Dat GEO Accession:	tein coding 30 00000284832 a: CLASH			
Expression		Show 10 ~ entries		Search:	?
Expression		GEO Accession	Sample size 🕴	Data information	
		GSE100467	450	CD4, CD8, CD14, CD15, CD19, CD56 and CD235a, whole-blood, exosome and serum	show boxplot
		GSE101192	40	Normal epidermis and cutaneous squamous cell carcinoma	show boxplot
				Human colon carcinoma(HCT116) cell line	
		GSE102854	36	and Human retina, pigmented epithelium(RPE1_hTERT) cell line (cancer)	show boxplot
		GSE103635	73	vastus lateralis muscle of healthy middle aged men	show boxplot
		GSE104758	56	Cervicovaginal lavage specimens from HPV- positive women with and without cervical precancer (CIN3)	show boxplot
		GSE105052	42	Plama of Friedreich's ataxia patients and healthy subjects	show boxplot
		GSE105811	90	cerebrospinal fluid (CSF) from sporadic amyotrophic lateral sclerosis (sALS) and control	show boxplot
		GSE106221	48	plasma from 24 subjects that have been exposed to low (H) and high dose (O) ambient traffic pollution	show boxplot
		GSE106224	114	plasma, EV(exosome) and EV-depleted plasma from individuals who had a spontaneous preterm birth and uncomplicated pregnancies	show boxplot
		GSE107279	24	mesenchymal stromal/stem cells collected at various timepoints during differentiated into osteoblasts	show boxplot
		Showing 1 to 10 of 8	8 entries	Previous 1 2 3 4 5	9 Next
Protein binding tsRNA		Show 10 💛 entrie	s	Search:	?
		Sample ID 🔺 E	xpression(CPM)	Sample information	\$
		GSM1015450	0.99149	Ago HITS-CLIP in BC-3 cell	
		GSM1015451	1.66885	Ago HITS-CLIP in BC-3 cell	
		GSM1015452	1.72877	Ago HITS-CLIP in BC-3 cell	
		GSM1015453	8.9317	Ago HITS-CLIP in BCBL-1 cell	
		GSM1015454	6.45464	Ago HITS-CLIP in BCBL-1 cell	
		GSM1074231	0.651988	AGO-PAR-CLIP of DG75-eGFP	
		GSM1074232	0.40825	AGO-PAR-CLIP of DG76-eGFP	
		GSM1074233	0.596903	AGO-PAR-CLIP of BCBL-1	
		GSM1074234	0.0702538	AGO-PAR-CLIP of BCBL-2	
		GSM1334330	229.336	FLAG:AGO2 loaded small RNA	
-		Showing 1 to 10 of		Previous 1 2 3 4 5	12 Next
Experimentally validated tsRNA	Hsa_tsr001178 (tRI [PMID: 29844106]	>009a) repress gene	expression with a	sequence complementary to 3' UTR of target m	וחאזא וח אטט-aependent manner.
References	tRNA fragments (t RNA. 2018 Aug; 2- DOI: 10.1261/rna.0 PMID: 29844106	4(8):1093-1105	ulate gene express	ion post-transcriptionally in a Dicer-independer	nt manner.

Figure 2. An example of the webpage showing the detailed information of hsa_tsr001178 in tsRBase.

the highest species diversity, thus it will assist tsRNA researchers from different fields. tsRBase also integrates functional information of tsRNAs from three different sources: (i) tsRBase provides tsRNAs with experimentally validated functions and expression patterns by full-text mining on scientific papers; (ii) tsRBase displays credible tsRNA-target pairs from analysis of CLASH and CLEAR-CLIP data; (iii) tsRBase exhibits the abundance of protein-binding tsR-NAs in different CLIP/RIP data. Moreover, tsRBase collects the latest literatures about tsRNAs, and this will assist researchers stay up to date with the progress of this field.

Overall, we aim to make tsRBase a comprehensive and systematic tsRNA database, covering full-ranged information of tsRNA for various species, which is helpful for understanding tsRNA's functions and advancing the progress of tsRNA study.

DATA AVAILABILITY

tsRBase is freely available at http://www.tsrbase.org.

SUPPLEMENTARY DATA

Supplementary Data are available at NAR Online.

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