LncTarD 2.0: an updated comprehensive database for experimentally-supported functional IncRNA-target regulations in human diseases

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ABSTRACT

An updated LncTarD 2.0 database provides a comprehensive resource on key IncRNA-target regulations, their influenced functions and IncRNA-mediated regulatory mechanisms in human diseases. LncTarD 2.0 is freely available at (http://bio-bigdata.hrbmu.edu. cn/LncTarD or https://Inctard.bio-database.com/). LncTarD 2.0 was updated with several new features, including (i) an increased number of diseaseassociated IncRNA entries, where the current release provides 8360 key IncRNA-target regulations, with 419 disease subtypes and 1355 IncRNAs; (ii) predicted 3312 out of 8360 IncRNA-target regulations as potential diagnostic or therapeutic biomarkers in circulating tumor cells (CTCs); (iii) addition of 536 new, experimentally supported IncRNA-target regulations that modulate properties of cancer stem cells; (iv) addition of an experimentally supported clinical application section of 2894 IncRNA-target regulations for potential clinical application. Importantly, Lnc-TarD 2.0 provides RNA-seq/microarray and singlecell web tools for customizable analysis and visualization of IncRNA-target regulations in diseases. RNA-seq/microarray web tool was used to mining IncRNA-target regulations in both disease tissue samples and CTCs blood samples. The single-cell web tools provide single-cell IncRNA-target annotation from the perspectives of pan-cancer analysis and cancer-specific analysis at the single-cell level. LncTarD 2.0 will be a useful resource and mining tool for the investigation of the functions and mechanisms of IncRNA deregulation in human disease.

INTRODUCTION

Long noncoding RNA (lncRNA) has been substantially linked to many human diseases, especially cancer (1-4). Some studies have found that lncRNA dysregulation in breast cancer (5,6), lung cancer (7), Alzheimer disease (8) and other diseases (9-12). Currently, many lncRNArelated databases have been published concerning lncRNA sequence, expression, function, regulation, and disease associations. For example, experimentally supported or predicted lncRNA-disease associations have been generated and stored in some databases, such as LncRNADisease 2.0 (13), Lnc2Cancer 3.0 (14), and MNDR v3.0 (15). Some databases have been established to collect experimentally validated or predicted lncRNA-associated regulatory relationships (such as ceRNA interactions based on scRNAsequencing or bulk RNA-sequencing datasets), such as LnCeCell (16), LncRNA2Target 2.0 (17), LncACTdb 3.0 (18) and DIANA-LncBase v3 (19). Some databases have been established to document and annotate genetic variants of lncRNAs in diseases, such as Lnc2Meth (20) and LincSNP 3.0 (21). To facilitate the study of mechanisms of lncRNA deregulation in the pathogenesis of disease, we previously reported the first version of the LncTarD (22) database, which integrated disease-associated lncRNAtarget regulations, key downstream targets, lncRNAdependent mechanisms and biological functions in human diseases into a comprehensive resource.

With the increasing interest in human lncRNAs, a large number of disease-associated lncRNA-target regulations have been reported in recent years. The correlations between lncRNAs (23,24) and their target regulation mechanisms such as sponge (25,26), methylation (27–29) and transcriptional regulation (30,31), have also been widely reported. The reports of disease-related lncRNA-target regulations supported by a large number of experiments provide a ba-

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Figure 1. Data expansion and features of LncTarD 2.0. (A) Summary of the contents of the database, including the collection of articles reporting lncRNAtarget regulations, the addition of lncRNA-target regulations information and mechanisms, and the construction of single-cell and RNA-seq/microarray web tools. (B) Data on the regulatory mechanisms, biological functions, and clinical application of lncRNA-target regulations in diseases are included. A panel of tools has been developed to mine, visualize, and analyze lncRNAs at single cell and RNA-seq/microarray levels.

sis for studying their clinical application. Previous studies have found that circulating tumor cells (CTCs) and circulating lncRNAs and their targets have broad application prospects for cancer diagnosis (32,33). For example, circulating RNA UCA1 regulates MYO6 expression through miR-143 in colorectal cancer, affecting cell proliferation and migration (34). LncRNAs have also been found to regulate tumor stem cells (CSCs) through their targets, and then affect tumor maintenance and spreading (35-37). MALAT1 has been reported to bind directly to the mRNA of SOX2, and promote the stemness of gastric cancer cells, and may be a potential target for gastric cancer (38). Considering these newly discovered lncRNA-target regulations, as well as publicly available data resources, it was necessary to update the LncTarD database with more resources and improved tools.

Therefore, we updated LncTarD to version 2.0 (LncTarD 2.0) (Figure 1 and Table 1). The current release includes 8,360 experimentally supported key lncRNA-target regulations in 419 disease subtypes and their clinical application. LncTarD 2.0 also provides two interactive web-based tools

to characterize the dynamic lncRNA-target regulations in human diseases based on scRNA-seq and bulk RNA-seq datasets of tissue samples and CTCs blood samples. Collectively, LncTarD 2.0 aims to integrate the experimentally supported key lncRNA-target regulations, their influenced functions, lncRNA-mediated regulatory mechanisms and potential clinical application in human diseases.

IMPROVED EXPANSION AND NEW FEATURES

Data expansion and preprocessing

LncTarD 2.0 was updated to contain experimentally supported key lncRNA-target regulations, their influenced functions, and lncRNA-mediated regulatory mechanisms associated with various human diseases (Table 1). In the first instance, we screened >6000 studies in the PubMed database. Among them, 5523 reports from 2019 to 2021 contained relevant information, which was incorporated into the database. All searches followed similar keyword combinations as the ones used in LncTarD 1.0.

Table 1. Comparison of the data included in LncTarD 1.0 and LncTarD2.0

Features	LncTarD 1.0	LncTarD 2.0	Fold increase
IncRNA-target regulations	2822	8360	2.96
Diseases	177	419	2.36
lncRNAs	475	1355	2.85
PCG	774	1743	2.25
miRNA	391	506	1.29
Biological functions	140	286	2.04
Cancer stem cell	-	536	New
Clinical applications	-	2894	New
Circulating tumor cell	-	3312	New
Single cell Web Tools	-	73 datasets	New
RNA seq Web	90 datasets	351 datasets	3.9
Tools-GÊO			
RNA seq Web	-	17 datasets	New
Tools-CTC			

Next, we extracted the experimentally supported associations between lncRNA-target gene regulation and disease, and these relationships were experimentally confirmed. Compared with LncTarD 1.0, we added the effect of lncRNA-target regulations on CSCs, expression pattern in CTCs, and clinical application. If lncRNA-target regulations were confirmed to be biomarkers related to metastasis, recurrence, circulation, drug resistance or prognosis in cancer, we extracted such information to characterize the clinical application of the lncRNA-target regulations. Similarly, if lncRNA-target regulations were confirmed to affect the functions of CSCs such as stemness, proliferation, invasion and expansion in cancer, we extracted this information to characterize the effect of lncRNA-target regulations on CSCs. In addition, we collected 17 RNAseq datasets of CTCs from the PubMed database. In this step, we also recorded detailed information including lncR-NAs, target genes and cancer names, direction of regulation, experimental method for each interaction, expression pattern of lncRNA, experimental method and lncRNA microarray, positively or negatively influenced biological functions, lncRNA-mediated regulatory mechanisms, information from the PubMed database and a brief description of functional lncRNA-target regulation in human diseases from the original studies. Furthermore, we added more detailed data to demonstrate the lncRNAs and their targets cancer associations more comprehensively. We collected other names of lncRNAs and their targets including aliases, synonyms, Entrez IDs and Ensembl ID (39). We also updated the location information of lncRNAs on chromosomes. Finally, we used a standardized classification scheme, the Disease Ontology, to annotate human diseases (40).

Experimentally supported regulatory mechanisms and clinical applications of lncRNAs and their targets in cancer

To provide a comprehensive resource to study the role of lncRNAs in cancer, we manually curated lncRNA-target regulations that can serve as cancer biomarkers. First, we collected 2894 experimentally supported clinical applications of lncRNA-target regulations. Second, we used 17

CTCs RNA-seq datasets including 877 CTC samples of seven cancer types to characterize the potential of lncRNAtarget regulations as diagnosis or therapeutic response markers. The differential expression of lncRNA-target regulations between CTCs and normal blood samples was analyzed using R package limma (41). Genes with absolute fold-change > 2 and false discovery rate (FDR) <0.05 in the same CTC dataset were considered dysregulated IncRNAs or target genes in CTCs. We predicted 3312 out of 8360 lncRNA-target regulations that were differentially expressed in CTC samples as potential diagnostic or therapeutic biomarkers in blood. Finally, we added new 536 experimentally supported key lncRNA-target regulations, which play important roles in plasticity and self-renewal properties of CSCs in 71 human disease subtypes. Furthermore, the current release includes 8360 key lncRNA-target regulations from PubMed literature associations with 419 disease subtypes, 1355 lncRNAs, 1743 protein-coding genes, 506 miRNAs and 286 biological functions. The current version of LncTarD records 5531 experimentally supported functional regulations including ceRNA or sponge (3719 entries), transcriptional regulation (595 entries), epigenetic regulation (436 entries), interaction with protein (706 entries), interaction with mRNA (62 entries), and chromatin looping (13 entries), and 2829 expression associations in human diseases.

Newly developed single-cell web tool for discovery and analysis of lncRNA-target regulations

Single-cell RNA sequencing (scRNA-seq) is a highthroughput method to measure and compare the levels of gene expression at single-cell resolution; thus, developing an efficient method for analyzing large datasets is essential. A rapid and comprehensive approach could enable the analysis of cancer pathology and the discovery of IncRNA-target regulations as cancer biomarkers. In Lnc-TarD 2.0, we designed a single-cell web tool, which can be employed to characterize and understand lncRNA-target regulations according to the provided single-cell datasets. A total of 73 scRNA-seq datasets concerning lncRNA expression were collected from Lnc2Cancer 3.0 and Gene Expression Omnibus (GEO) (42). The R package Seurat and SingleR were used for standardization, quality control, and cell type identification of scRNA-seq data (Supplementary methods). A total of 168 197 high-quality cells were obtained in 32 cancer types. Moreover, we characterized the association of an lncRNA-target pair with a specific cell by testing the statistical independence of their expression values (43). The lncRNA-target pairs with significant expression correlation (with a significance level of less than 0.01) in a cell were identified (Supplementary methods). LncTarD 2.0 provides interactive and customizable functions including two powerful modules: (i) Pan-cancer analysis module of key lncRNA-target regulations, which mainly provides three tools to graphically display the differences/similarities of lncRNA-target regulations among cancer types at the single-cell level and (ii) Cancer-specific analysis module of key lncRNA-target regulations, which mainly provides three tools to reveal the cancer cell subpopulation specificity

of lncRNA-target regulations and intratumor heterogeneity at the single-cell level.

Tools in pan-cancer and cancer-specific analysis modules provide the following: (i) differential regulations analysis, which provides the landscape of differential lncRNAtarget regulations across multiple single-cell datasets and cancer cell subpopulations; (ii) differential expression analvsis, which provides the landscape of differential expression of lncRNAs and target genes across multiple singlecell datasets and cancer cell subpopulations; (iii) functional states analysis, which provides the landscape of differential IncRNA-target regulations associated with a given cell state (such as stemness, angiogenesis and inflammation) across multiple single-cell datasets and cancer cell subpopulations. AUCell algorithm was used to determine the activity of IncRNA-target regulations within a cell (44). The Wilcoxon rank-sum test was used to estimate the significance of differences in activity of lncRNA-target regulations among different scRNA-seq datasets or subpopulations (45) (Supplementary methods). Furthermore, all tools in pan-cancer and cancer-specific analysis modules contained more complex functions for mining a given lncRNA-target pair, including general information (including associated disease subtype, biological functions, regulatory mechanisms, dysregulation in CTCs), UMAP/tSNE-based cell clustering, cell clustering maps of cell-specific lncRNA-target regulations, heat map and box plots of differential expression of lncRNA and targets, and lncRNA-target networks. All of the above functions were performed using the R package Seurat (version 4.0.4).

Updated RNA-seq/microarray web tool for mining and deeper understanding of lncRNA-target regulations

The rapid growth of RNA-seq/microarray data offers more chances for data mining and deeper understanding of the important role of lncRNA dysregulation in disease pathogenesis and tumor heterogeneity. In this work, we first obtained RNA-seq datasets containing lncRNA-target expression information from The Cancer Genome Atlas (TCGA), including transcriptome data of 33 cancer types and 11 373 TCGA pan-cancer patients (46). Second, we extracted 351 sets of microarray and RNA-seq datasets from the literature and downloaded them in the GEO. Similarly, we obtained 17 RNA-seq datasets of CTCs from the literature, including 877 CTC samples and seven cancer types. Three functions of the RNA-seq/microarray tools were established: TCGA analysis module of key lncRNA-target regulations, GEO analysis module of key lncRNA-target regulations and CTC analysis module of key lncRNAtarget regulations. These tools allow valuable analysis for mining cancer-related lncRNA-target regulation biomarkers, exploring the biological function of lncRNAs, and promoting clinical application of blood therapy and diagnosis of diseases.

Tools in TCGA, GEO and CTC analysis modules mainly provided the following: (i) to demonstrate the differential expression patterns of lncRNA-target regulation, R package DESeq2 (47) and limma (41) were used for differential analysis of RNA-seq/microarray data; (ii) box plot diagrams were used to compare the expression of specific lncR- NAs and targets between cancer and normal samples; (iii) to show the dynamic expression correlation of functional lncRNA-target regulations in human disease, Pearson correlation coefficients between lncRNAs and key targets in each of the datasets were calculated, and a *t* test of the Pearson correlation coefficient was used to estimate the correlation significance; (iv) scatter plots were used to display the expression of lncRNA-target in certain TCGA/GEO/CTC datasets.

DATABASE CONSTRUCTION AND IMPROVED USER INTERFACE

All data in LncTarD 2.0 were stored and managed using MvSOL (version 5.6.50). The web interfaces were built in PHP (version 7.3) on Linux and Apache platform. The LncTarD 2.0 is freely available at https://lnctard.biodatabase.com. The old version LncTarD 1.0 is still in service. Users can enter it from the LncTarD 2.0 homepage or go directly to http://bio-bigdata.hrbmu.edu.cn/LncTarD1. 0/. LncTarD 2.0 exhibits a user-friendly interface and provides flexible routes for data access, enabling users to query the database in just a few steps: (i) From 'Home', 'Browse' and 'Search' pages, users can quickly obtain detailed information on lncRNA-target regulations in human diseases (Figure 2A–E); (ii) From the 'RNA-seq/microarray Web Tools' page (Figure 2F), users can obtain detailed data on lncRNAs and their target genes, including differential expression analysis and correlation analysis based on TCGA, GEO, and CTC datasets; (iii) In 'Single Cell Web Tools' page (Figure 3A and B), from the perspective of pan-cancer and cancer-specific analysis, single-cell web tools can perform complex functions and characterize key lncRNAtarget regulations from scRNA-seq datasets, including differential regulations analysis, differential expression analysis, and functional states analysis at the pan-cancer and cancer-specific levels. In addition, we also provide specific tools for mining lncRNA-target regulations, including UMAP/tSNE-based cell clustering and gene expression, differential expression of lncRNAs and target genes among cell subsets, and characterization of lncRNA-target association in a single cell; (iv) LncTarD 2.0 is a fully open resource, and users can obtain all data from the 'Download' page; (v) The 'Submit' page enables researchers to submit novel experimentally supported lncRNA-target associations. (vi) In 'Help' page, users can receive a detailed tutorial about how to use LncTarD 2.0.

A case study to identify risk lncRNA-target regulations in NSCLC using web-based tools

To demonstrate the usage and potential application of Lnc-TarD database, we performed a case study to identify risk lncRNA-target regulations in non-small cell lung cancer (NSCLC) by integrating single-cell sequencing data and sequencing data from NSCLC tissue and CTCs using webbased tools. First, we identified differential lncRNA-target regulations in at least one of NSCLC scRNA-seq datasets by comparing their regulation activity with other singlecell datasets (Figure 4A). Next, genes in the differential lncRNA-target regulations were required to be differen-



Figure 2. Workflow and application of LncTarD 2.0. (A) The interface of the home module. (B) Browsing for all lncRNA-target regulations. (C) Search for all lncRNA-target regulations. (D) Network module for disease-associated lncRNA-target regulations. (E) The module contains detailed information about lncRNAs and target genes. (F) RNA-seq/microarray web tools characterize lncRNA-target regulations.



Figure 3. Workflow and case study using web tools in LncTarD 2.0. (A) Single-cell web tools were used to characterize dynamic lncRNA-target regulations in pan-cancer and cancer-specific analysis modules. The Wilcoxon rank-sum test was used to identify differential lncRNA-target regulations by comparing the activity of lncRNA-target between a given scRNA-seq dataset and other scRNA-seq datasets. The Wilcoxon rank-sum test was used to compare the expression levels of differential lncRNAs and genes between a given single-cell scRNA-seq dataset and other scRNA-seq datasets. (B) UMAP/tSNE-based cell clustering maps of cell-specific lncRNA-target regulations were performed using the R package Seurat. Differential expression of lncRNAs and targets was identified using the Wilcoxon rank-sum test.



Figure 4. A case study to identify risk lncRNA-target regulations in NSCLC. (A) the top ranked differential lncRNA-target regulations in NSCLC scRNAseq datasets by comparing regulation activity with other single-cell datasets. Differential expression of lncRNAs and genes in (B), TCGA cohort and in (C) CTC datasets. (D) an integrative pipeline to identity risk lncRNA-target regulations in NSCLC. (E) Differential expression of AFAP1-AS1 and VIM in TCGA cohort and in CTC datasets. (F) Pearson correlation coefficients and significance *P*-values between AFAP1-AS1 and VIM in TCGA cohort. (G) cell clustering maps and differential expression analysis of AFAP1-AS1 and VIM in NSCLC cell subpopulations. (H) Distribution of the AFAP1-AS1-VIM regulation in the tumour microenvironment of NSCLC (left panel) and the cell proportion of AFAP1-AS1-VIM regulation in cell subpopulations (right panel).

tially expressed in bulk sequence data of solid lung cancers from TCGA (Figure 4B). Finally, genes in the differential lncRNA-target regulations were required to be consistently differentially expressed in CTCs in blood from NSCLC patients (Figure 4C). Consequently, we identified nine risk lncRNA-target regulations as potential clinical biomarkers in NSCLC, including AFAP1-AS1-VIM, AFAP1-AS1-EGFR, AFAP1-AS1-HDGF, AFAP1-AS1-CDH1, IQANK1-HES1, LINC00511-KLF2, LINC00511-LATS2, LINC00511-PKM and VIM-AS1-CDH1 (Figure 4D). For example, AFAP1-AS1 was significantly upregulated in both the TCGA cohort and CTCs in blood samples of patients with NSCLC (Figure 4E). VIM was significantly downregulated in both the TCGA cohort and CTC data for NSCLC (Figure 4E). Moreover, AFAP1-AS1 expression showed significant positive correlations with VIM expression in the TCGA cohort (R = 0.1, P < 0.05; Figure 4F). It has been shown that AFAP1-AS1 is a potential biomarker for predicting the prognostic risk of nonsmall cell lung cancer (48). VIM has been reported to be a biomarker of epithelial-to-mesenchymal transition, which plays a key role in promoting cell migration (49). AFAP1-

AS1 has been reported to promote cancer cell proliferation, cell invasion, and epithelial-to-mesenchymal transition via modulation of VIM in gallbladder cancer (50). We therefore speculated that AFAP1-AS1-VIM regulation may be a potential risk factor for NSCLC. Furthermore, using the single-cell web tool, we found that AFAP1-AS1 and VIM were both upregulated in non-small cell lung cancer stem cell subpopulation compared with endothelial cell subpopulation (Figure 4G). The cell proportion of AFAP1-AS1-VIM regulation was higher in breast cancer B cell subpopulation (fold change of 1.7; Figure 4H), suggesting that they possibly exert a regulatory effect on non-small cell lung cancer stem cell subpopulation and may be critical factors in lung tumor microenvironment.

CONCLUSION

With the increase of reports on experimentally supported key lncRNA-target regulations, in this study, we expanded the LncTarD database according to the reported lncRNAtarget regulations and increased the expression of regulations in tissue samples, single-cell samples and blood samples. With the continuous research on the pathogenesis of different diseases, we believe that more lncRNAs and lncRNA-target regulations will be reported. In the future, we will integrate multi-omics data of diseases, use more datasets and tools, and continue to maintain and update the LncTarD database, further understanding the important role of lncRNA dysregulation in disease pathogenesis and tumor heterogeneity.

DATA AVAILABILITY

All the data could be downloaded from http://bio-bigdata. hrbmu.edu.cn/LncTarD.

SUPPLEMENTARY DATA

Supplementary Data are available at NAR Online.

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