ViroidDB: a database of viroids and viroid-like circular RNAs

Benjamin D. Lee1,2,* , Uri Neri2, Caleb J. Oh4, Peter Simmonds2 and Eugene V. Koonin1,*

1National Center for Biotechnology Information, National Library of Medicine, National Institutes Health, Bethesda, MD 20894, USA, 2Nuffield Department of Medicine, University of Oxford, Oxford OX1, UK, 3The Shmunis School of Biomedicine and Cancer Research, Tel Aviv University, Tel Aviv 6997801, Israel and 4Unaffiliated, Gambrills, MD 21054, USA

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ABSTRACT
We introduce ViroidDB, a value-added database that attempts to collect all known viroid and viroid-like circular RNA sequences into a single resource. Spanning about 10 000 unique sequences, ViroidDB includes viroids, retroviroid-like elements, small circular satellite RNAs, ribozyviruses, and retrozymes. Each sequence’s secondary structure, ribozyme content, and cluster membership are predicted via a custom pipeline optimized for handling circular RNAs. The data can be explored via a purpose-built user interface that features visualizations, multiple sequence alignments, and a portal for downloading bulk data. Users can browse the data by sequence type, taxon, or typo-tolerant search of metadata fields. The database is freely accessible at https://viroids.org.

INTRODUCTION
Viroids are a unique class of plant pathogens, some of which cause economically important diseases of agricultural plants (1). Comprising small circular RNA molecules, between 220 and 450 nucleotides in size, viroids encode no proteins and are the smallest known infectious agents. Unlike viruses, which are parasites of the host’s translational system, viroids are parasites of the host’s transcriptional system. By hijacking host DNA-dependent RNA polymerase (DdRP) to transcribe RNA, viroids replicate and can cause pathology purely by means of RNA (2). Employing the rolling circle mechanism, viroids replicate by producing multimeric intermediates, which are then cleaved to unit length either by ribozymes formed from both polarities of the viroid genomic RNA or through coopting host RNAse (3). The monomers are then ligated using the host’s DNA ligase (4,5). Since their discovery in 1971, knowledge of the diversity of viroids has steadily increased, with two families, Avsunviroidae and Pospiviroidae, currently classified. Members of the former family rely on encoded autocatalytic ribozymes for cleavage to unit length during replication, whereas members of the latter family use host enzymes. Specifically, members of the family Avsunviroidae encode the hammerhead ribozyme (HHR), a defining trait of the family (6). Members of the Pospiviroidae family, in contrast, do not use ribozymes during replication, instead relying upon conserved sequence regions that are not catalytic but do serve as a cleavage site for host RNase III (7). Structurally, viroids of these families may also differ as well, with some members of the family Avsunviroidae adopting a branched conformation (i.e. those classified in the genus Pelamoviroid), whereas members of the family Pospiviroidae adopt a rod-shaped or quasi-rod-shaped conformation (8).

In addition to viroids proper, several groups of RNA agents share similar key features. One such agent is the retroviroid-like element (hereafter retroviroid), carnation small viroid-like RNA (CarSV) and its DNA form (9–11). CarSV, the only retroviroid so far described, is similar to viroids in size, circularity and the presence of hammerhead ribozymes in both polarities. However, it differs from viroids in that there exists a homologous extrachromosomal DNA sequence that can be integrated into the plant genome by means of a helper pararetrovirus. Unlike viroids, CarSV does not appear to transmit horizontally from plant to plant.

Small circular satellite RNAs (also sometimes called viruses and hereinafter abbreviated satRNAs) are another type of infectious circular RNA that resemble viroids in many respects, such as rolling circle replication and size (about 300 nucleotides), but differ in that they are encapsidated into the capsid of the respective helper viruses and replicate using the helper virus RdRP (12). Effectively, these agents can be considered encapsidated viroids. Unlike viroids, satRNAs are known to encode both HHRs and hairpin ribozymes, representing a different autocatalytic motif. The taxonomy of these agents, though for-
mally under the purview of the International Committee on the Taxonomy of Viruses (ICTV), has not yet been established.

Another group of viroid-like agents are the members of *Ribozyviria*, a recently described viral realm (13) that includes deltaviruses, such as hepatitis delta virus (HDV), a human pathogen. Similar to some viroids, ribozyviruses possess rod-shaped circular RNA genomes that replicate via the rolling circle mechanism and encode ribozymes, albeit distinct from those in viroids, that autocatalytically process replication intermediates. However, ribozyviruses have substantially larger genomes than viroids, encode their own nucleocapsid protein, and their reproduction depends on a helper virus (hepatitis B virus in the case of HDV) which provides the envelope protein for ribozyvirus virions. Until recently, HDV was the sole member of the *Deltavirus* genus, but the discovery of distantly related viruses in a variety of vertebrates and invertebrates, including rodents (14), snakes (15), termites (16), fish (16), birds (17) and bats (18), suggests a considerable uncharacterized diversity among the ribozyviruses. Currently, all ribozyviruses are classified as a single family, *Kolmioviridae*, containing 8 genera including *Deltavirus*.

Yet another recently discovered group of circular RNA agents are retrozymes, a class of retrotransposons that propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides. They do not encode any proteins but propagate via circular RNA intermediates of about 170 to 400 nucleotides.
Figure 1. A flowchart of the complete data processing and release pipeline. Blue steps denote data fetching and pre-processing procedures while purple steps denote the analysis phase. Red steps correspond to post-processing organizational steps. The data release pipeline (green) is initiated upon every change to the underlying data or code ensures that the data are archived and that the website is up to date and efficient.
families from the Rfam database (31). All detected results with $E$ values less than 0.1 were considered significant and reported. The database stores the location, type, $E$ value, alignment and truncation status of each hit. Altogether, the database currently reports 11,713 putative ribozymes. The large number of ribozymes is a result of the database containing so many agents with symmetric rolling circle replication mechanisms which require one ribozyme per polarity combined with the $E$ value threshold allowing alternative topologies for a given motif to be reported as well.

### Sequence clusters

We devised a custom, standalone pipeline to cluster the sequences gathered from the reference database and generate multiple sequence alignments (MSAs) (Figure 1). Although these clusters are not intended to reflect taxonomic ranks, they greatly reduce the number of sequences in a consistent manner, streamlining advanced analyses, such as the identification of translocating motifs or conserved motif ordering. Initially, all deduplicated sequences are clustered using MMseqs2 (32) at multiple identity thresholds: 75%, 80%, 85%, 90%, 95% with a fixed minimum alignment coverage of 75% for both the query and the target sequences. Then, rotational alignment (in which the optimal starting position is identified) is attempted within every cluster using CSA (33). This step is necessary as similar sequences may have spuriously low alignment scores when the sequences are not oriented with consistent origins. We found that CSA was unable to produce meaningful output for all clusters for several technical reasons (namely, built-in limitation preventing handling inputs with more than 64 sequences). If CSA fails to produce an output, cyclic comparison is attempted using Cyclope (34). If Cyclope is also unsuccessful in producing an output, rotation is attempted using MARS (35).

The rotated clusters were then re-aligned using MAFFT (v.7.475) using its automatic mode (36). The minority of the clusters, for which no cyclic comparison software successfully produced meaningful output, were forwarded directly to MAFFT, without rotational modifications. For each resulting MSA (one per cluster), a consensus sequence was generated using Seals-2 (37), available at https://github.com/YuriWolf-ncbi/seals-2. The consensus sequence was then inserted into the alignment as the first sequence in the multi-FASTA file to act as a ‘master sequence.’ This final MSA was used to construct an nhmm profile using the HM-MER suite v.3.3.2 (38).

| Genus           | Count |
|-----------------|-------|
| Pelamoviroid    | 5080  |
| Pospivirid      | 2363  |
| Apscaviroid     | 939   |
| Hostavirid      | 488   |
| Deltavirus      | 243   |
| Cocaudivirus    | 184   |
| Elavirid        | 102   |
| Avsunviroid     | 60    |
| Coleviroid      | 30    |

The number of clusters at each identity threshold is given in Table 2.

### DATA STORAGE AND INFRASTRUCTURE

To ensure the continuous functionality of ViroidDB, all code (both for processing and the user interface) and data are permanently archived externally in CERN's Zenodo database (https://zenodo.org). All software is available on GitHub under the open-source MIT license. The data is versioned by release date and releases are immutable. No special identifiers are presently assigned for sequences in ViroidDB; the existing accessions are used for simplicity. Because new data could change the cluster assignments, clusters are given a date- and threshold-dependent identifier.

The live version of the website was optimized for speed, scalability, and sustainability. At a high level, ViroidDB’s web infrastructure consists of a browser-based application executed locally in JavaScript (albeit written in its strongly typed derivative, TypeScript) and served as static files via the Netlify content delivery network (CDN) (https://netlify.com) supported by a serverless database, file storage, and search services. The front-end of the browser application is built using the Vue (https://vuejs.org) and Nuxt (https://nuxtjs.org) frameworks, which are configured to automatically update the site upon every accepted change in the version-controlled repository hosted on GitHub. When a user loads the website, they download pre-generated HTML, CSS and JavaScript files stored entirely on the CDN’s servers, which in turn fetch only the data needed to display the given page. Although the user interface relies heavily on dynamic JavaScript to retrieve the content being displayed, the compilation process is able to prefetch and statically render pages’ default states (such as the truncated list of members of the family *Avsunviroidae*). This process completely eliminates the waiting period the user experiences after the page’s scripts have loaded but before the data from the database has been loaded by the scripts, which in turn use it to render the document object model (DOM). It also reduces the number of database queries, which ensures that there is sufficient capacity for numerous users with minimal to no expenses resulting from operating the service.

Importantly, no servers must be maintained specifically for ViroidDB, thereby easing the development and maintenance burden. The downloaded client-side code simply queries and displays data stored in the database and file storage layer, which is built upon Google Cloud’s Firebase platform (https://firebase.google.com/). Because the platform provides a free tier of service with a 50,000 query daily limit, the site is able to operate with no expected operating costs due to the database. Small metadata, such as records associating the accessions of sequences with their identified ribozymes, are stored in a serverless NoSQL database for fast retrieval while larger data, such as full-length alignments of clusters and images, are placed in an object store.

### DATA QUERY AND ACCESS

The ViroidDB database supports the exploration and use of its data both via a graphical web interface and via downloadable raw data.
Figure 2. Examples of key pages on the ViroidDB website. (A) The sequence detail page. The first row of panels displays the sequence’s basic information, sample collection information, and taxonomy. The next row of panels shows the sequence’s nucleotide sequence in FASTA format and resource links. Users can toggle the nucleotide sequence to display the reverse complement, textual secondary structure, and/or convert between DNA and RNA bases. Users can also copy or download the nucleotide sequence in FASTA format through built-in buttons. The following panels display alignments for any predicted self-cleaving ribozymes with secondary structures in both polarities displayed below. (B) The details for a cluster. The first panel shows multiple sequence alignments generated from the reference sequence after rotational alignment with the resultant nhmm profile. Visualizations of the alignments are immediately below. The final panel is a list of all sequences that are contained within the cluster. Users can jump directly to each sequence’s individual page from this list. (C) The search page of ViroidDB demonstrates the site’s fuzzy search, search-match highlighting, taxonomic refinement lists and species sub-search.

ViroidDB website

ViroidDB offers an interactive website that enables users to inspect, visualize, search, and download all the information stored in the database. The site is organized around the sequence display page, with other pages of sequence collections linked to each sequence’s page. These pages contain all the sequence-specific metadata and are organized with panels displaying basic information such as length and GC-content, taxonomy information, sample collection information, ribozymes, structures and the sequence itself. Sequences and structures can be easily copied to the user’s clipboard or downloaded directly from the page. Links to external resources, such as associated PubMed articles and GenBank pages, are included as well. The sequences are listed on a sequence index page where the user can opt to only have sequences of a given type displayed for easier browsing.
Clusters are treated analogously to sequences. A cluster index page lists each cluster and its reference sequence as well as the number of members. Clicking into a cluster page displays the list of the sequences comprising the cluster, the multiple sequence alignment, and visualizations of the rotational alignment results. Clicking a sequence within the cluster leads to the sequence display page.

We used the Algolia service (https://algolia.com) to provide typo-tolerant approximate searching of all sequences and associated metadata in the database. Searchable fields include the accession, sequence name, full taxonomy, authors, geographic location, host, and isolation site. This integration allows the user to instantly (< 10 ms) perform full-text search with optional type (e.g. viroid), family, genus, and species filters. If a match to the input query is found, the exact part of the record for which the match is found is highlighted in the results. As the user types a query into the search area, the number of results in each taxon is displayed dynamically.

Because this site is designed to serve as a resource for the community, it also hosts a community section of the website. This section enables members of the community to post upcoming events and notices of interest to a virtual bulletin board. Additionally, email forwarding addresses using the viroids.org domain name are available upon demand at no cost. Finally, the site’s community page provides access to an internet chat room to facilitate collaboration.

DATA AVAILABILITY
ViroidDB is freely accessible at viroids.org. The pipeline and user interface source is available under the MIT license at https://github.com/Benjamin-Lee/viroiddb and is archived at Zenodo (https://doi.org/10.5281/zenodo.5202945).

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