Original article



# An online database for einkorn wheat to aid in gene discovery and functional genomics studies

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## **Abstract**

Diploid A-genome wheat (einkorn wheat) presents a nutrition-rich option as an ancient grain crop and a resource for the improvement of bread wheat against abiotic and biotic stresses. Realizing the importance of this wheat species, reference-level assemblies of two einkorn wheat accessions were generated (wild and domesticated). This work reports an einkorn genome database that provides an interface to the cereals research community to perform comparative genomics, applied genetics and breeding research. It features queries for annotated genes, the use of a recent genome browser release, and the ability to search for sequence alignments using a modern BLAST interface. Other features include a comparison of reference einkorn assemblies with other wheat cultivars through genomic synteny visualization and an alignment visualization tool for BLAST results. Altogether, this resource will help wheat research and breeding.

Database URL: https://wheat.pw.usda.gov/GG3/pangenome

#### Introduction

Bread wheat (*Triticum aestivum*) is an important staple and the most widely grown food crop in the world. Bread wheat has a hexaploid genome with three subgenomes (ABD) (1). The polyploid journey for hexaploid bread wheat started with a polyploidization event between *Triticum urartu* (A genome) and an *Aegilops speltoides*-related species (B genome) that resulted in tetraploid wild *T. turgidum* ssp. *dicoccoides* (wild emmer, AB genome). The second polyploidization event occurred between tetraploid *T. turgidum* ssp. *dicoccum* and *Ae. tauschii* species (D genome) and resulted in hexaploid *T. aestivum* (2n = 6x = 42; ABD) (2, 3).

A recent pangenomic study (4) suggested that modern bread wheat cultivars are genetically as diverse as old landraces. However, to address challenges from human population increase and changing climatic conditions, wheat breeders need to find new sources of genes for various traits including high yield and resistance to biotic and abiotic stresses (5–7). In this context, wild relatives of wheat are a rich source of beneficial genes and are critical for improving wheat cultivars using sustainable approaches (8–11). The diploid 'A' genome progenitor gene pool of wheat has two closely related species *T. monococcum* [(*T. monococcum* L. subsp. *monococcum* (domesticated), *T. monococcum* L.

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subsp. *aegilopoides* (wild)] and *T. urartu* (wild). As mentioned earlier, these species harbor various agronomically important traits for wheat improvement. Although *T. monococcum* is not the direct donor of the bread wheat A-genome, it shares high homology with the A-genome of present-day cultivated hexaploid and tetraploid wheat and gene transfers are feasible between bread wheat and *T. monococcum*.

Einkorn is considered as a relict crop, being replaced over time by tetraploid and hexaploid landraces and then modern varieties. Its gene pool being different from the bread wheat gene pool presumably contains novel alleles. Einkorn wheat has been used as a source of genetic variation for wheat breeding (12). Despite the importance of einkorn wheat in wheat breeding, there is a lack of resources for finding highly reliable genetic and genomic datasets on einkorn wheat as well as its genome organization.

A recent work completed by Ahmed *et al.* (13) presents an exciting resource for the cereals genetics and breeding community. Presented here is an online database to accompany these data organized in a manner to assist comparative genomics, applied genetics and breeding research. There is a need to supply quality assembly data for the *T. monococcum* Agenome and integrate it with other available wheat reference genomes and datasets. Reported here is information about a database resource created for the einkorn reference genomes, the work presented by Ahmed *et al.* 2023 [raw data available from NCBI SRA resource as PRJEB52766 (TA10622) and PRJEB52767 (TA299)]. Annotations and other analysis are available from the Ahmed *et al.* (2023) Supplementary Material.

Here, we have integrated various tools and genomic resources allowing us to compare the einkorn genomes with reference assemblies of 27 other wheat accessions and their respective annotations from wild, related and cultivated germplasm at a common platform. The goal of this research was to provide easy visualization and analysis of these genomic resources to answer critical biological questions using various tools that have been integrated into the database. This database is currently hosted alongside GrainGenes (https://wheat.pw.usda.gov/GG3/pangenome) (14) resources where it can be useful for the wider small grain cereal genetics, genomics and breeding community.

# **Materials and Methods**

#### Data Source

The data used and presented in this database is associated with a recently published manuscript on *T. monococcum* (13). Along with einkorn datasets (two genomes), this database uses publicly available data for 27 wheat lines (diploid, tetraploid, and hexaploid wheat species) and the description of these lines/accessions are presented in Supplementary Table 1. Out of these 29 varieties, 16 are hexaploid (15–19), two are tetraploid (20, 21) and the remaining 11 are diploid (22–24) (Figure 1). For the genome browser, *T. monococcum* genomes from two accessions (TA10622 and TA299) and their associated annotations (gene structure, function and transposable elements) were indexed and uploaded into the queryable search tool to generate links to the genome browser and a search-based BLAST database for all 29 wheat lines included.

# Database implementation

This database has been designed using the standard LAMP protocol, i.e. Linux (RHEL8), Apache (2.4.37), MariaDB (10.5.16) and PHP (8.0.13) (Hypertext Preprocessor). This

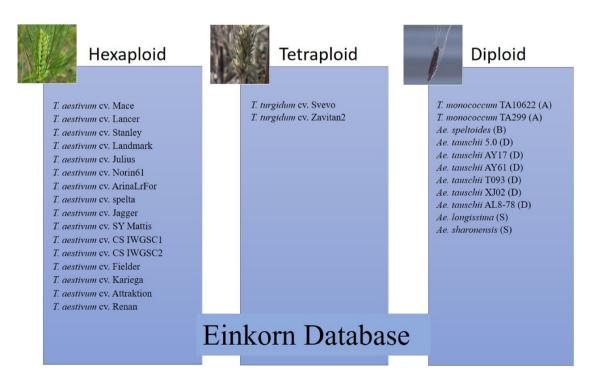


Figure 1. List of hexaploid, tetraploid and diploid wheat species in the pan-genome BLAST database and synteny comparison. Among the total 29 varieties, 16 are hexaploid, two are tetraploid and 11 are diploid (two with A genome, one with B genome, six with D genome and two with S genome).

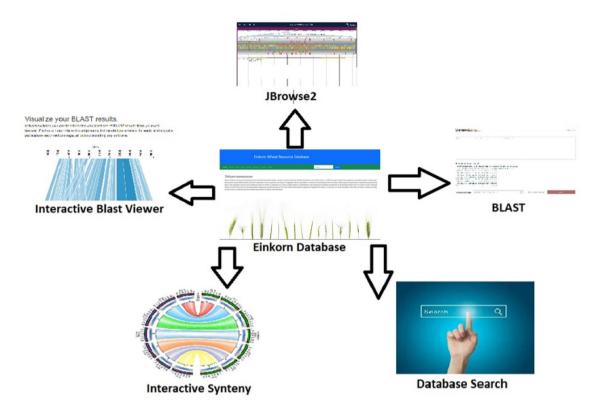


Figure 2. Interactive tools such as JBrowse2, BLAST database search, database search and synteny have been incorporated within the Einkorn database.

is a relational database based on a 'three-tier architecture' having a client-, middle- and database tier, that catalogs the information related to *T. monococcum*.

The process starts when a user submits a query through the 'client tier', where interactive web pages have been developed using HTML and Bootstrap5. Bootstrap5 is the latest version in its legacy and provides multi-device usability and responsiveness. For the user queries, fetching, and execution, scripting in PHP has been done in the 'middle tier' along with HTML, PHP and Javascript. This PHP acts as a bridge between the user and the database. Any query submitted by the user is first processed by the PHP scripts into SQL queries and then forwarded to the database search engine.

The 'database tier' holds all the data like gene ids, chromosome numbers, positions, gene sequences and other likewise data in the form of relational tables in the MariaDB database. The query coming from the middle tier is then searched in the database table and the results are given back to the middle tier that processes the results to be displayed to the user. We have used the latest tools and packages for data visualization and analysis. Still, the majority of the online available resources use older versions of tools that have less functionality and features.

### Integrated tools and Web Interface

Analysis, interpretation, and presentation of raw data in a user-friendly manner always help in getting useful outcomes. Software/tools help in processing and analyzing data and hence result in meaningful inferences. In the present database, we have integrated several tools which help in data analysis (Figure 2). JBrowse is a genome browser tool used to navigate through the genome and its annotations. It's version

2 (JBrowse2) which is a recent release (25) and harbors many new functionalities like circular view, linear comparative view, linear synteny view, and structural variant Inspector view (SvInspectorView). Another important tool is Sequence-Server2 which is a recently updated and released BLAST engine. It takes the FASTA-formatted sequences as queries and aligns them to the selected BLAST databases. Its output is quite interactive and informative (26).

We have also used a couple of online tools to visualize the data. Kablammo (27) is a BLAST result output viewer. Kablammo accepts BLAST result output files in XML format and will illustrate exactly which portions of the query sequence mapped to which portions of the subject sequence. The other online tool that is used in the database is AccuSyn (28). AccuSyn is interactive software that shows circular syntenic plots of chromosomes and draws links between similar blocks of genes using Simulated Annealing to minimize link crossings. This helps researchers with insights into the evolutionary history of species or functional relationships between genes. This tool requires two input files *viz.* an annotation file (.gff) and an alignment file generated from McScanX (29).

An interactive webpage has been designed for this database. All the above-mentioned tools have been put together in respective tabs on the homepage of the database (Figure 3).

#### Results

This database has been developed to analyze and visualize the *T. monococcum* reference quality assemblies. For this purpose, various tools and search elements have been integrated

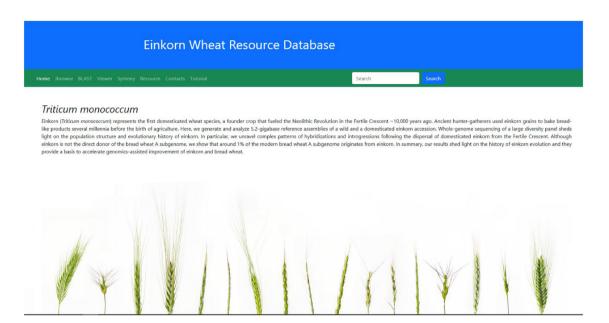


Figure 3. Home page of the einkorn wheat resource database.

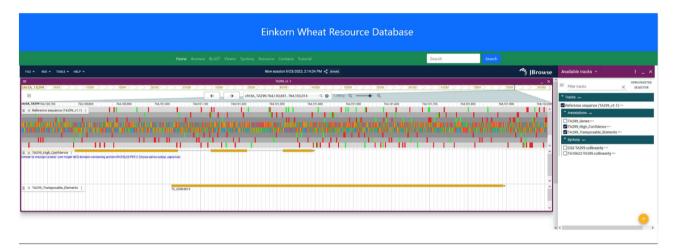


Figure 4. JBrowse2 Linear genome viewer page showing *T. monococcum* TA299 assembly, a gene structure, and a transposable element. Users can scroll through the genome and can see available tracks from the panel on the right.

with the database. The following section will describe all the integrated tools along with their usability.

#### JBrowse2

JBrowse2 is the latest release of the JBrowse Genome Browser (25). Previously released Jbrowse1 (30, 31) had some limitations like only one genome would be displayed and needed more support for new software libraries. Here, we have used the linear genome viewer of JBrowse2 to show the genome assemblies of *T. monococcum* TA299 and *T. monococcum* TA10622 (Figure 4). Both assemblies can be accessed by individual chromosomes. Gene model annotations were linked to each of the assemblies which include gene structure and putative function for both high-confidence and low-confidence genes models. However, a separate annotation file has been provided for only high-confidence genes for those who are interested in high-confidence genes. The annotated transposable elements (TEs) were also associated with each of the genomes.

Another new feature in Jbrowse2 is the linear synteny viewer. This is quite an informative feature that shows synteny between two genomes. Here we have provided the pairwise synteny between *T. monococcum* TA10622, *T. monococcum* TA299 and *T. aestivum* CS-IWGSC ref2.1. Figure 5 shows an example of such synteny between chromosome 1A of *T. monococcum* TA10622 and *T. aestivum* CS-IWGSC ref2.1.

#### SequenceServer2

SequenceServer2 is a recent web-based service application for the display of nucleic acid- and protein-based sequence alignments (26). It makes use of the widely accepted BLAST application (32, 33) and has been upgraded to accept the optimized algorithms in use with the present version used here (2.13.0+). This provides output in a table that can be downloaded. Other download options like XML and alignment format are also available.

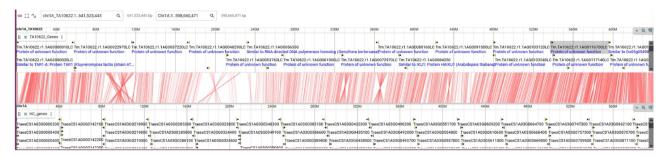


Figure 5. JBrowse2 linear synteny viewer showing synteny between *T. monococcum* TA10622 and *T. aestivum* CS-IWGSC ref2.1. See tutorial on online webpage (https://avena.pw.usda.gov/genomes/mono/pan\_help.php) on how to generate this view in JBrowse2.

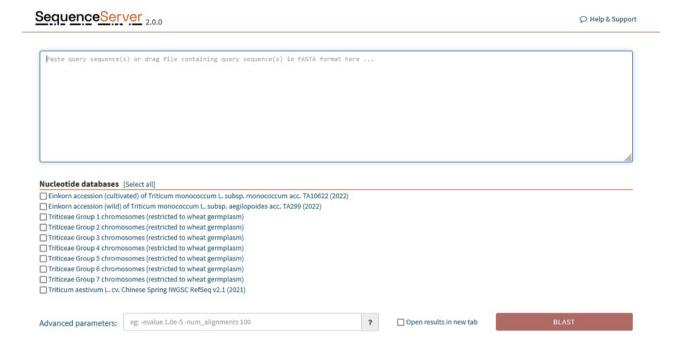


Figure 6. SequenceServer2 page for BLAST search. Specific BLAST databases have been provided for searching specific chromosome groups of all 29 wheat varieties studied.

BLAST databases are provided for the following genomes: (Figure 6).

Triticum monococcum L. subsp. aegilopoides acc. TA299 (wild einkorn) (2022).

Triticum monococcum L. subsp. monococcum acc. TA10622 (domesticated einkorn) (2022).

Triticum aestivum L. cv. Chinese Spring IWGSC RefSeq v2.1 (2021).

Triticeae groups 1–7 chromosomes are listed individually and are restricted at present to 29 wheat germplasm (Supplementary Table S1).

The concept of groups is interesting and unique; here, we have indexed our BLAST databases in a chromosome-wise fashion (Figure 7), such that a user will be able to search against A, B and D genomes restricted to a particular chromosome number. For example, checking the Group 1 option, a search can be performed against chromosome 1 of all the A, B and D genomes of 29 wheat varieties and so on. Another important aspect of the 'grouping' concept is the use of this method in pan-genome analysis to access diversity across many individuals in a species rather than a single reference genome. For constructing a pan-genome, all the

available varieties (reference quality assemblies) of a species are considered and hence making a pan-genome quite large. Searching/querying this large dataset can be time and resource consuming. Using the 'Groups' only selection, a desired subset of the pan-genome BLAST database can be queried. This will save time and resources.

The use of the web interface depends on many factors, such as the web browser used, internet connections and possibly other computer configurations. The interface provides selecting more than one database for searches, but here we recommend selecting only one-database-at-a-time. If more than one database will be searched, it is best to select the checkbox 'Open results in a new tab' located at the bottom of the page near the BLAST submit button; this will allow the original query sequence to be used for multiple database queries. Likewise, to get the best use of the databases provided it is also advisable to only include one-sequence-at-a-time. If one sequence and one database are selected, each BLAST submission will open a new tab on the browser.

As an example, using a sample sequence (Traes-CS5A01G000200, a trypsin family protein-encoding gene) a search will yield strong matches in the *T. monococcum* 

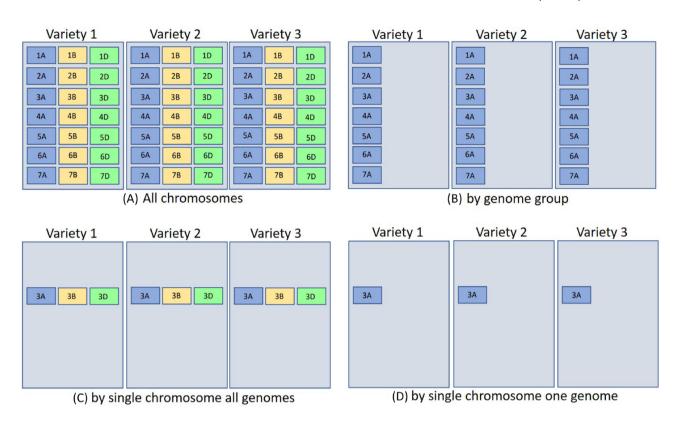
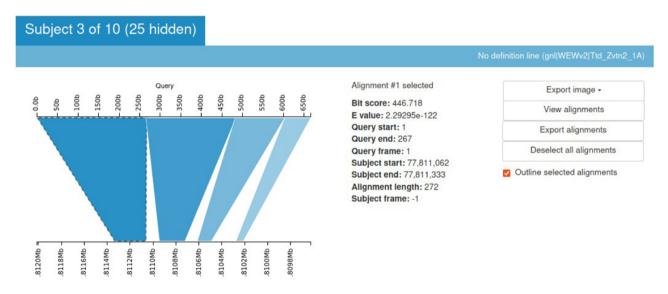


Figure 7. The above represents three different hexaploid wheat cultivars BLAST database sets searched by four different parameters [only the (a) quadrant contains all chromosomes for hexaploid wheat]. The other quadrants are partitioned by (b) genome group (1–7A genome), (c) single chromosome all genomes (3ABD), and (d) single chromosome single genome (3A). Database indexing partitioned in such a fashion for (b–d) takes less time and resources (see text for more explanation). For wheat, each chromosome block would represent about 700 Mb.



**Figure 8**. Kablammo display for the BLAST results of a sample query sequence. Various alignment statistics are being shown along with the option to view/download images and alignments. Please see the tutorial on the einkorn resource database webpage on how to generate this output (https://avena.pw.usda.gov/genomes/mono/pan\_help.php).

accessions, with strong matches on the 5A chromosome at the telomeric 5'-end and weaker matches on the 2A chromosome also at the 5'-end, but not so telomeric. A further search of the same sequence against the Chinese Spring (CS) reference will also confirm observations seen with the A genome, and also note similar alignments in the B and D genomes; in this case, alignments were stronger in 5A, with identity ranking 5A > 5B > 5D (the test sequence was derived from CS)

5A); and the weaker alignments in chromosome 2 ranking 2B > 2A > 2D.

# BLAST results viewer (Kablammo)

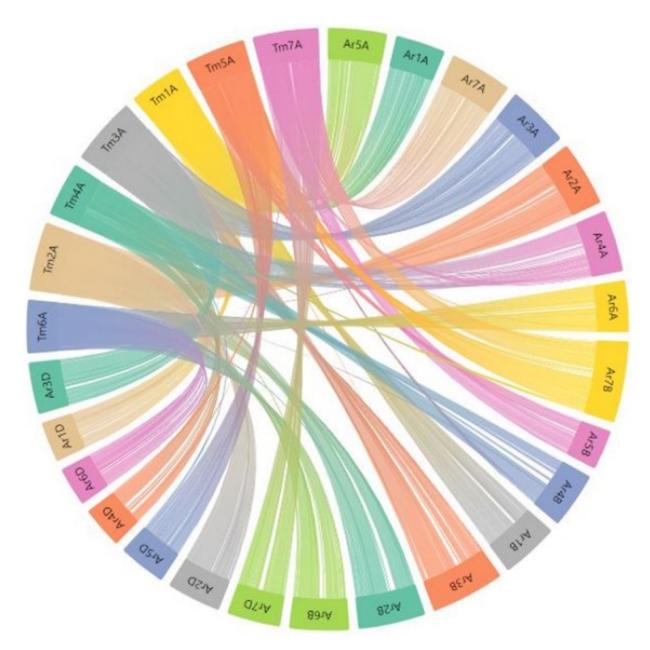
Sequence Server provides the BLAST output in an output table. But it is always more informative to look at an image. Kablammo is a tool that facilitates the viewing of the BLAST

results interactively (27). Kablammo takes an XML file as an input (which can be downloaded from SequenceServer output) and provides an interactive figure for each subject matched. The query as well as subject sequences can be zoomed-out or zoomed-in for better results viewing experience. This is helpful to detect INDELs or duplications. Other features like image export, alignment viewer and exporter are also available (Figure 8).

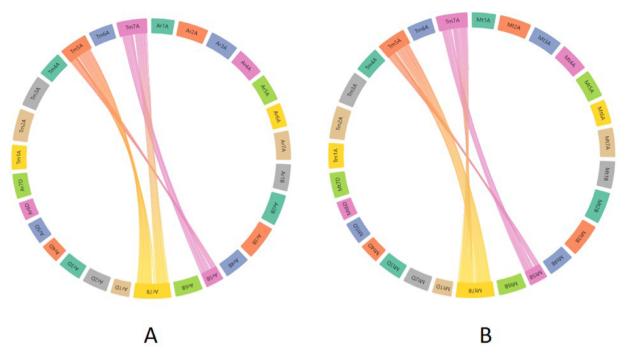
## Synteny viewer

In the present relational database, we have provided precomputed synteny results for 29 wheat varieties with the domesticated *T. monococcum* accession TA10622. These results can be viewed by selecting the relevant variety from the dropdown menu on the left side of the synteny tab on

the webpage. Users can have an overview of the synteny between the TA10622 and other wheat varieties. An example of synteny between *T. monococcum* TA10622 and *T. aestivum* cultivar ArinaLrFor is shown in Figure 9. However, many researchers are particularly interested in one or two chromosomes and want to look into the synteny of only those chromosomes. We have therefore provided the input files (GFF and collinearity files) to be uploaded into AccuSyn, an online interactive software to view the synteny (28). Users can download these zipped files for different wheat varieties from the dropdown list provided on the right side of the synteny tab. Then they need to extract and upload the two files to the Accusyn website, for which a link has been provided on the same tab. AccuSyn displays synteny between genomes by circularly displaying chromosomes (Figure 9). A



**Figure 9.** Part of the webpage shows a synteny between the *T. monococcum* TA10622 and *T. aestivum* ArinaLrFor. The figure is available on the synteny tab of einkorn wheat resource database web page by selecting the respective genome. This figure can also be generated by uploading the two precomputed files (gff and collinearity) provided on the synteny tab of einkorn resource database web page on the AccuSyn server.



**Figure 10.** Synteny visualization of *T. monococcum* with Arina*LrFor* (A) and SY Mattis (B). It shows the presence of a translocation between chromosomes 5B and 7B of Arina*LrFor* (A) and SY Mattis (B). The figure was generated by uploading the two precomputed files (gff and collinearity) provided on the synteny tab of einkorn resource database web page and viewed on the AccuSyn server by selecting the respective chromosomes.

	Einkorn Wheat Resource Database											
				Home	browse R	AST Viewer Synteny Resource Contacts Tutorial	Search	Seath				
	Search Results											
	entries								Search			
Variety ^	Chromosome	Gene ID	Start	End	Strand	Function	InterPro	60	Sequence	JBrowse	BLAST	
TA10622	chr1A	Tm.TA10622.r1.1AG0027000	70764800	70769104		Similar to Os10g0147400: Auxin transporter-like protein 3 (Oryza sativa subsp. japonica)	IPR013057	NA.	Sequence	Econoc	Elast	
IA10622	chr1A	Im.1A10622.r1.1AG0028480	76066580	76068280		Similar to IAA8: Auxin-responsive protein IAA8 (Onyza sativa subsp. japonica)	BYR033389	NA.	Sequence	Stronge	Elast	
TA10622	chr1A	Tm.TA10622.r1.1AG0042930	144264275	144266798	+	Similar to BA15: Auxin-responsive protein BA15 (Oryce sative subsp. japonica)	IP9033369	NA.	Sequence	Excesse	Elast	
TA10622	chr1A	Tm.TA10622.r1.1AG0045330	157412634	157413979		Similar to IAA16: Auxin-responsive protein IAA16 (Oryza sativa subsp. japonica)	IPR033359	NA.	Sequence	Eccuse	Elast	
A10622	chr1A	Tm.TA10622.r1.1AG0066620	303879640	303884718	+	Similar to ANEZ2: Auxin response factor 22 (Oryza sativa subsp. japonica)	IPR003340 IPR010525	GO:0003677 GO:0005634 GO:0006355 GO:0009725	Sequence	Stonce	Elast	
TA10622	chr1A	Tm.TA10622.r1.1AG0078150LC	352788776	352789805		Similar to SAUR36: Auxin-responsive protein SAUR36 (Arabidopsis thaliana)	#PR003676	GO:0009733	Sequence	Eronoc	Elast	
A10622	chr1A	Tm.TA10622.r1.1AG0106730LC	498070613	498071130		Similar to ARGOS: Protein AUXIN-REGULATED GENE INVOLVED IN ORGAN SIZE (Arabidopsis thaliana)	NA .	NA.	Sequence	Stronge	Elast	
TA10622	chr1A	Tm.TA10622.r1.1AG0111730	518327043	518331479		Similar to Cu05g0447200: Auxin transporter-like protein 2 (Cryza sativa subsp. japonica)	IPR013057	NA.	Sequence	Stonor	(Slass)	
TA10622	chr1A	Tm.TA10622.r1.1AG0126490	569681024	569686737		Similar to ARF14; Ausin response factor 14 (Oryza sativa subsp. japonica)	IPR003340 IFR010525	GO:0003677 GO:0005634 GO:0006355 GO:0009725	Sequence	Bronce	Elast	
A10622	chr1A	Im.TA10622.r1.1AG0128730	577977681	577580906		Similar to IAA18: Auxin-responsive protein IAA18 (Onyza sativa subsp. japonica)	IPR033389	NA.	Sequence	Stronge	Elast	
TA10622	chr1A	Tm.TA10522.r1.1AG0134810	594634274	594635602		Similar to ABF3: Ausin response factor 3 (Cryza setiza subsp. japonica)	NA	NA.	Sequence	Encour	Elast	
A10622	chr1A	Tm.TA10622.r1.1AG0139940	605124464	605128575		Similar to IAA19: Auxin-responsive protein IAA19 (Oryza sativa subsp. japonica)	IPR033352	NA.	Sequence	Stronge	Elast	
A10622	chr1A	Tm.TA10622.r1.1AG0141880	609251978	609257539		Similar to ARF15: Auxin response factor 15 (Oryza sativa subsp. japonica)	IPR003340 IPR010525	GO:0003677 GO:0005634 GO:0006355 GO:0009725	Sequence	Secure	Elast	

**Figure 11.** Search result for the search term 'auxin'. Searching the relational database for any auxin-related genes yielded 338 possible hits. Links to InterPro, Gene Ontology, Gene sequence, JBrowse2 and Blast results are provided in the subsequent columns.

user can select one or more chromosomes as required. An interactive figure on the right displays the blocks that were matched between the chromosomes. It should be noted that the same input files can be used as input in SynVisio (https://synvisio.github.io) which can display synteny in a linear fashion which is useful for viewing a few chromosomes at a time.

To assess the practical applicability of this synteny tool, we took an example from the recent bread wheat pan-genome paper (4). In this paper, the authors studied the translocation between chromosomes 5B and 7B in bread wheat lines Arina*LrFor* and SY Mattis. As our synteny analysis maps/relates the *T. monococcum* A genome to all the A, B and D genomes of hexaploid wheat, we wanted to look into the aforementioned 5B/7B translocation through our synteny tool. For this, the zipped files provided for Arina*LrFor* and SY Mattis were used for visualization purposes. Figure 10A shows the synteny view of Arina*LrFor* chromosomes 5B and 7B with *T. monococcum* 

chromosome 5A. This shows the presence of a translocation between Arina*LrFor* chromosome 5B and 7B through our synteny analysis. The same phenomenon was also observed with wheat variety SY Mattis chromosome 5B and 7B.

#### Database searching

In the navigation bar, a search box has been incorporated by which users can search either by a particular gene ID or any probable candidate gene function keyword. As of now, the gene ID and function searches are restricted to two *T. monococcum* accessions (TA10622 and TA299). As an example, searching for the keyword 'auxin' will result in 338 table entries having auxin as a keyword in their function (Figure 11). This table along with the putative function also displays the accession, chromosome number, Gene ID, Gene Ontology (GO), start and end position and the DNA strand.

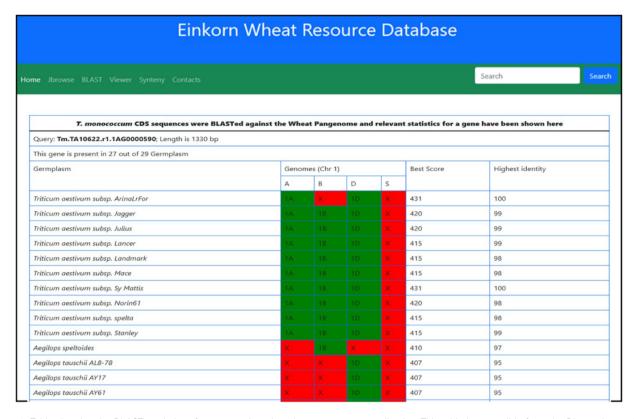


Figure 12. Table showing the BLAST statistics of a gene against the wheat pan-genome collection. This table is accessible from the Blast column of search results table.

**Table 1.** Table showing the BLAST statistics of the *Sr35* gene against the wheat pan-genome collection

Chromosome groups	Genomic hits	Genome groups		
Group1	1	В		
Group2	21	DS		
Group3	57	ABDS		
Group4	No matches			
Group5	17	BD		
Group6	14	SB		
Group7	41	BAD		

Links have been provided in the table to view the fasta sequence of that particular gene, to view the gene in JBrowse2, and to view the dashboard summarizing the statistics of BLAST results of that gene with other wheat varieties (from a pan-genomic perspective).

This dashboard provides various statistical informations derived from the BLAST of *T. monococcum* genes against the other wheat varieties. The statistics provided here include the length of gene sequence, number of germplasm matched along with the individual genomes, length matched, scores, etc. (Figure 12).

## A case study

*Sr35* is the first gene cloned for stem rust resistance, encoding an intracellular immune receptor of the nucleotide-binding site—leucine-rich repeat (NLR) protein family (34). This gene originates from *T. monococcum* chromosome 3A. The gene sequence (3151 bp) of *Sr35* was BLAST searched against the

wheat pangenome using a chromosome group-wise search. Hits were seen in all the chromosome groups except group 4 (Table 1). Significant matches with high identity were found on chromosome 3 in all the 57 genome entities matched (Supplementary Figure S1). However, screening each alignment yielded unique sequences/patterns in different cultivars. This information was particularly useful in marker-assisted selection for stem rust.

Filtering the blast results with sequence identity >90% and query coverage >95% (from Group 3 hits), removed most of the non-significant hits, including the B sub-genome matches. Significant blast hits on A-genome consisted of genomes, i.e. T. monococcum L. subsp. aegilopoides (TA299), tetraploid wheat accession Zaviton, and wheat cv. ArinaLrFor, Norin, Mattis, Mace, Jagger, Julius, Landmark, Kariega and T. spelta, after removal of D-genome counterparts. For sequence comparison, we extracted 500 bp extended sequences from the respective cultivars. The sequence identity ranges from 91% to 96% between the Sr35 and wheat cultivars. Supplementary Figure S4 shows the multiple sequence alignment of the Sr35 coding gene with the selected genomes. An insertion in the Fielder and ArinalLrFor genome was observed. The phylogenetic tree showed two distinct groups (Supplementary Figure S5). These two groups differed in terms of SNP and Indel. To demonstrate the similarity at the protein level, we performed gene prediction in the regions, which showed wide differences in the gene structure, with the number of predicted exons ranging from 1 to 4, making these targets as pseudo genes with respect to Sr35 reference. Sr35 seems to have a unique introgression, with missing or pseudo-gene homologs between the cultivars.

A close inspection in the case of *T. monococcum* TA299 helped to reveal two significant matches (Supplementary Figure 2) on chromosome 3A. Both the two matches were within a 30 kb region at position 770.4 Mb. We then used JBrowse2 to look into the corresponding positions on the assembly with annotations. Both the two regions matched have only a single type of disease-resistant gene, i.e. 'Disease resistance protein RGA5' (Supplementary Figure S3). However, it is interesting to note that around this position there are a lot of other insignificant matches that were found which again support the presence of pseudogenes around this position.

The above case study is just one example of how the multigenome database can be used to compare gene sequences. The possibilities for gene discoveries within the database are plentiful.

#### **Discussion**

We have recently seen a surge in high-quality crop reference genomes. This increase has raised the urgent need to effectively integrate and process the data to be easily used by researchers. In the case of wheat, the high-quality Chinese Spring latest assembly is included (35). Also, the diploid wild donor species like *Ae. speltoides* (36) and *Ae. tauschii* (37) have been sequenced and the browsable sequences are available at the GrainGenes website (https://wheat.pw.usda.gov). Until recently, a high-quality *T. monococcum* assembly was lacking despite its importance in wheat improvement. To address this, Ahmed *et al.* (2023) (13) have recently provided a high-quality *T. monococcum* assembly. Taking this opportunity, we have decided to put together this assembly with other high-quality wheat assemblies at a common place to be utilized by researchers.

T. monococcum shares a close homology with the T. urartu ('A' genome donor). Moreover, T. monococcum being a domesticated accession makes this species ideal for breeding programs and variety development. A reference quality genome assembly assists in identifying accurate alleles for agronomically important traits. In the present paper, we have tried to harness the potential of this assembly and related annotations from a pan-genomic perspective. We have used 29 wheat varieties (diploid, tetraploid and hexaploid) in the database which corresponds to 63 genomes (20 A, 19 B, 22 D and 2 S genomes).

This database has several useful features which enhance the users' experience in analyzing and visualizing genomes. For example, the circular synteny viewer provides a syntenic overview of the various wheat varieties with T. monococcum. Synteny is an important analysis as it allows us to look into a bigger perspective of chromosome-scale rearrangements like translocations and large INDELS. Also, on a gene scale, it was able to detect gene duplication and structural variants. With wheat's polyploid nature and its highly repetitive genome, syntenic analysis and visualization play a crucial role in understanding the many important evolutionary changes including translocations and sequence arrangements. The einkorn genome analysis (13) describes the synteny between two T. monococcum accessions (TA299 (wild) and TA10622 (domesticated)) and also with the A sub-genome of bread wheat. However, looking from a pan-genome perspective, it is important to look into other wheat varieties while

looking into not only the A sub-genome but also the B and D subgenomes. Another important tool that we have incorporated is JBrowse2 which is a modern upgrade and can display multiple genomes. Along with all the basic functionalities of JBrowse1, JBrowse2 has added the syntenic visualization functionalities for visualizing structural variants in genomes and evolutionary relationships among genes and genomes. Other tools include BLAST search and BLAST result viewer. All of these will assist in querying, searching and visualizing the gene sequences.

The database as presented in this manuscript is work in progress that will be continuously updated and improved. In future, we plan to add genomes from other Triticeae species such as rye, barley and oat. Including the genomes of these members will enhance our understanding in terms of evolutionary and pan-genomic viewpoints. New tools for analysis and visualization will also be incorporated. We plan to update the database regularly, every six months in terms of updated genome versions and high-quality assemblies.

In the einkorn database, the large number of high-quality wheat genomes from multiple varieties, together with highly efficient analysis and visualization tools, will greatly assist the researchers in uncovering relevant questions. Overall, this database is an effort to take the first step towards a comprehensive pan-genomic database.

# Supplementary material

Supplementary material is available at *Database online*.

# **Data availability**

No new data were generated or analyzed in support of this research. The database is available at https://wheat.pw.usda.gov/GG3/pangenome.

# **Contribution statement**

H.I.A., J.P., S.K., M.A., N.R., T.W., G.L. and V.T. designed the research. P.S., I.Y., M.H., D.K., Ch.C., C.C., N.K., N.A., H.I.A., M.A., N.R.D. and S.C. performed the experiments and data analysis. J.R., J.P., S.K., G.L., Y.G. and V.T. provided resources and germplasm. P.S., J.P., G.L. and V.T. wrote manuscript and I.Y., S.K., Y.G., H.A. and M.A. provided useful inputs. All the authors have read and approved the manuscript.

# **Conflict of interest**

The authors declare no competing interests.

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