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Zepu Miao, Yifan Ren, Andrea Tarabini, Ludong Yang, Huihui Li, et al.. ScRAPdb: an integrated panomics database for the Saccharomyces cerevisiae reference assembly panel. Nucleic Acids Research, 2024, pp.gkae955. 10.1093/nar/gkae955. hal-04797383

HAL Id: hal-04797383 https://hal.science/hal-04797383v1

Submitted on 25 Nov 2024

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ScRAPdb: an integrated pan-omics database for the *Saccharomyces cerevisiae* reference assembly panel

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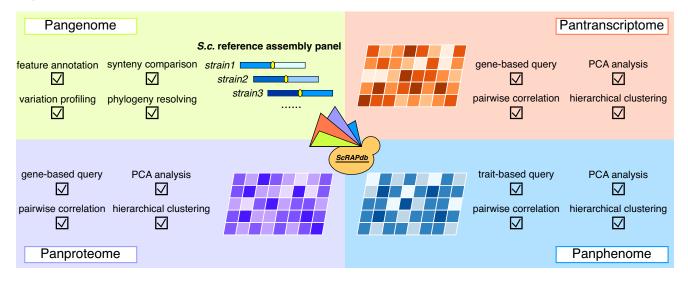
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Abstract

As a unicellular eukaryote, the budding yeast *Saccharomyces cerevisiae* strikes a unique balance between biological complexity and experimental tractability, serving as a long-standing classic model for both basic and applied studies. Recently, *S. cerevisiae* further emerged as a leading system for studying natural diversity of genome evolution and its associated functional implication at population scales. Having high-quality comparative and functional genomics data are critical for such efforts. Here, we exhaustively expanded the telomere-to-telomere (T2T) *S. cerevisiae* reference assembly panel (ScRAP) that we previously constructed for 142 strains to cover high-quality genome assemblies and annotations of 264 *S. cerevisiae* strains from diverse geographical and ecological niches and also 33 outgroup strains from all the other *Saccharomyces* species complex. We created a dedicated online database, ScRAPdb (https://www.evomicslab.org/db/ScRAPdb/), to host this expanded pangenome collection. Furthermore, ScRAPdb also integrates an array of population-scale pan-omics atlases (pantranscriptome, panproteome and panphenome) and extensive data exploration toolkits for intuitive genomics analyses. All curated data and downstream analysis results can be easily downloaded from ScRAPdb. We expect ScRAPdb to become a highly valuable platform for the yeast community and beyond, leading to a pan-omics understanding of the global genetic and phenotypic diversity.

Graphical abstract



Received: August 14, 2024. Revised: October 5, 2024. Editorial Decision: October 8, 2024. Accepted: October 10, 2024

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Introduction

Model organisms are invaluable for understanding life on earth, shedding lights on almost all aspects of modern biology. The budding yeast Saccharomyces cerevisiae has long been considered as a classic and powerful eukaryotic model organism for addressing a wide range of biological questions across diverse research fields, leading to many landmark discoveries with profound impacts. Moreover, S. cerevisiae has also been widely used as a proof-of-concept system for developing new experimental and computational methodologies, thanks to its unicellular nature, compact genome and relatively wellcharacterized regulatory machinery. Finally, S. cerevisiae is also an important workhorse in industrial settings like brewing, bakery, biofuel and pharmaceutics, highlighting its economic values for the human society. It is therefore of no coincidence that S. cerevisiae become the first eukaryotic organism to have its genome fully sequenced (1). Since then, the development of large-scale functional genomics panels such as yeast gene deletion (2), overexpression (3), tagging (4) and genegene interaction (5) further cast a comprehensive functional understanding of its genome biology. To accommodate and curate these reference-orientated resource, the Saccharomyces Genome Database (SGD, https://www.yeastgenome.org) (6) was developed >25 years ago and continued serving the yeast community (7), providing encyclopedic information regarding the genome, genes, proteins and other encoded features of S. cerevisiae.

While these landmark efforts were mostly achieved based on the reference strain S288C or closely related laboratory strains, large-scale population genomic and comparative studies were subsequently deployed for S. cerevisiae and its close relatives (e.g. Saccharomyces paradoxus) (8-16). For example, along with the advancing of sequencing technologies, three phases of the Saccharomyces Genome Resequencing Project (SGRP) were conducted with Sanger (8), short-read (9) and long-read sequencing (12), respectively, to obtain a more complete view of the genomic and phenotypic diversity of the Saccharomyces natural populations. In addition, the 1002 S. cerevisiae genome project (1002ScGP) represents another pivotal landmark by providing a massive panel of shortread-based genome assemblies for 1011 strains sampled globally together with a comprehensive pangenome open reading frames (ORFs) portrait for S. cerevisiae regarding its genome content evolution (13). Comparatively, long-read sequencing technologies such as PacBio and Oxford Nanopore substantially improves the quality and continuity of genome assembly, whose application on yeast genomes can often reach telomereto-telomere (T2T) completeness for multiple chromosomes, without incorporating additional auxiliary technologies (e.g. Hi-C) (17). Recently, a long-read-sequenced panel of 142 geographically and ecologically representative strains was further assembled to delineate a high-resolution view on the structural genome evolution of S. cerevisiae (18). Long-read-based highquality yeast genome assemblies for S. cerevisiae and its close relatives from the Saccharomyces species complex are still released on a regular basis (19-31). Given the strength of longread sequencing in characterizing complex structural variants (SVs) and highly repetitive regions, it is expected that a curated compendium of these high-quality assemblies will provide a new foundation for unbiased population and comparative genomics studies toward a pangenome view of a species' global diversity.

Understanding how genomic variation translates into trait differences in the phenotypic space is a central aim in genetics. As a classic model organism with population-level scalability for multi-omics assays, *S. cerevisiae* is well suited for this undertake. The genome characterization of 1011 *S. cerevisiae* strains and their associated phenotyping data across multiple environments set the stage for an in-depth examination on how genetic diversity, population structure, domestication history, collectively shaped the phenotypic diversity at the species level (13,32). Recently, their associated high-throughput transcriptome (33) and proteome (34,35) data further rolled out, which bridges the gap between the genotypic and phenotypic space and opens up the opportunity for looking into how such genotype-to-phenotype translation is fulfilled at the mechanistic level.

Therefore, it is important to construct a centralized data hub enabling seamless cross-dataset exploration and knowledge integration. Toward this goal, here we introduce ScRAPdb, an integrated pan-omics database for S. cerevisiae, offering a multi-layered view on its pan-omics diversity at population scales. At the genomic level, we conducted an exhaustive search, curation, and annotation on all currently available long-read-based genome assemblies from the Saccharomyces species complex to form an expanded S. cerevisiae reference assembly panel (ScRAP) and performed comprehensive comparative genomics analyses. On top of this, we also gathered the S. cerevisiae pantranscriptome, panproteome and panphenome datasets and matched with our expanded ScRAP collection for multi-omics integration. Finally, rich visualization and analysis tools were developed and incorporated into ScRAPdb to facilitate interactive data exploration in real time. Taken together, we anticipate ScRAPdb to facilitate both basic and applied research on yeast and beyond, in terms of both biological discovery and technology development. The ScRAPdb is publicly available at https: //www.evomicslab.org/db/ScRAPdb/.

Materials and methods

Exhaustive collection for long-read-based yeast genome assemblies

We collected all currently available (until 10 June 2024) longread-based genome assemblies (for both nuclear and mitochondrial genomes if available) and their associated metadata for S. cerevisiae and its close relatives from the Saccharomyces species complex. These outgroup species include S. paradoxus, Saccharomyces mikatae, Saccharomyces kudriavzevii, Saccharomyces arboricola, Saccharomyces eubayanus, Saccharomyces uvarum, as well as the newly described Saccharomyces jurei (36) and Saccharomyces chiloensis (26). For each included Saccharomyces species, a combination of manual literature curation, GenBank query and automatic web crawling was used. For GenBank query, all chromosomelevel Saccharomyces genome assemblies uploaded to Gen-Bank (37) since 2015 were retrieved and those sequenced by long-read sequencing technologies were kept for downstream quality control. For automatic web crawling, we developed a python script that utilize the Biopython's Entrez module (https://biopython.org/docs/1.83/api/Bio.Entrez. html) (38) for information query and parsing. This in-house script allows to perform an extensive and in-depth search in literature for S. cerevisiae genome assemblies generated

by long-reads (39,40). Long-read-based yeast genome assemblies of meiotic spores from hybrid crosses were not considered (41).

Curation and annotation for the expanded ScRAP collection

All collected genome assemblies were processed with our previously developed LRSDAY pipeline (42) (v1.7.2) for assembly curation, chromosome-level scaffolding and genomic feature annotation (centromere, gene, transferRNA [tRNA], Ty transposable element, X element and Y' element). For nuclear assemblies from the outgroup species, two consecutive rounds of nuclear gene annotation were performed (the first round with default setting and the second round using the outputs from the first-round annotation as hints for potential coding regions). Assemblies that are too fragmented, noticeably incomplete, or carrying too many base-level errors (as suggested by excessive in-frame stop codons detected during our gene annotation) were eliminated after quality check. Manual assembly correction was occasionally applied for very clear mis-joining errors based on the dotplot generated by LRS-DAY. For strains having multiple assemblies derived from the same read set (e.g. those from the original ScRAP project), the best assembly is kept based on the assembly quality. For assemblies derived from the same strain but independent reads sets (e.g. when two labs sequenced the same strain), we kept them altogether while using different assembly identifiers (e.g. asm01, asm02, etc.) to distinguish. The nuclear and mitochondrial reference assemblies of S. cerevisiae (denoted as 'SG-Dref') and S. arboricola (for which no long-read-assembly is currently available) were further added into our collection. The sequence start of all enrolled mitochondrial genome assemblies were uniformly reset to the start codon of the ATP6 gene.

For each assembly hosted in ScRAPdb, its identifier consists of three parts: strain identifier (e.g. S288C), assembly identifier (e.g. asm01) and phasing status tag (e.g. HP0). The assembly identifiers are numbered sequentially as asm01, asm02, etc., which are used to differentiate genome assemblies generated from different reads sets (e.g. independently sequenced by different groups) for the same strain. The phasing status tag is defined in the same way as in the original ScRAP paper (18). For haploid and homozygous diploid/polyploid strains, a single haplotype can be recovered with no phasing process needed. We used 'HPO' as their phasing status tag, where 'HP' stands for haplotype. For strains that are heterozygous diploids, polyploids or with unknown zygosity and ploidy status, a single genome assembly is usually generated with different haplotypes being collapsed together. We used the 'collapsed' tag to denote their phasing status. For heterozygous diploid strains that were assembled in a haplotypephased and separated manner, we used 'HP1' and 'HP2' to denote the two assemblies that correspond to the two separated haplotypes. For polyploid strains that were assembled in a haplotype-phased but unseparated manner, we used the 'HP' tag to denote the corresponding assemblies. All enrolled nuclear genome assemblies were evaluated by BUSCO (43) (v5.3.2) with BUSCO-associated lineage-specific database 'ascomycota_odb10' (creation date: 8 August 2024, number of genomes: 365, number of BUSCOs: 1706). BlobToolKit (44) (v4.3.11) was used for calculating assembly statistics such as N50, N90, GC%, etc.

Pairwise genome comparison, ANI calculation and full-spectral variant calling

For nuclear and mitochondrial genomes, pairwise genome comparison and average nucleotide identity (ANI) calculation were conducted by OrthoANI (45) (v0.50). Full-spectral genomic variants such as single-nucleotide variants (SNVs), insertions/deletions (INDEL) and SVs were detected using PAV (46) (v2.3.4) based on the *S. cerevisiae* reference genome (SGDref). The called variants were further processed with VEP (47) (v109.3) for variant effect prediction. The called SNVs, INDELs and SVs were further visualized via a built-in genome browser.

Phylogenetic reconstruction

For the 364 nuclear genome assemblies (after excluding the 13 phased but unseparated polyploidy assemblies from the original ScRAP) and 237 mitochondrial genome assemblies, we used Proteinortho (48) (v6.0.25; options: -check -selfblast -singles) to define 1-to-1 ortholog groups for four input subsets: (i) all 328 S. cerevisiae nuclear assemblies, (ii) all 36 outgroup nuclear assemblies + 11 representative S. cerevisiae nuclear assemblies, (iii) all 220 S. cerevisiae mitochondrial assemblies and (iv) all 17 outgroup mitochondrial assemblies together with 11 representative S. cerevisiae mitochondrial assemblies. For each 1-to-1 ortholog groups identified based on these subsets, the corresponding protein and CDS alignment were generated by MACSE (49) (v2.04; options: -prog alignSequences -gc_def 1 [for nuclear genomes] or 3 [for mitochondrial genomes] -seq \$i.species_relabeled.fa out_NT \$i.macse_NT.aln.fa -out_AA \$i.macse_AA.aln.fa and -prog exportAlignment -align \$i.macse_NT.aln.fa -codonForFinalStop --- -codonForInternalStop NNN -codonForInternalFS NNN -codonForExternalFS --- charForRemainingFS - -out_NT \$i.macse_NT.aln.tidy.fa -out_AA \$i.macse_AA.aln.tidy.fa). Afterwards, the concatenated supermatrix of the 1-to-1-ortholog-based CDS alignment was further generated. For mitochondrial assemblies, there are two identical copies of the COX3 gene in strain UCD_61-190-6A (aka, CDN), for which only one copy was used for orthology identification. For each input subset, the CDS supermatrix and its associated partition definition (by first, second and third codon positions) were used for maximal likelihood tree building by IQ-TREE (50) (version: 2.3.4; options: -p \$prefix.concatenated.cds.by_codon_position.partition.txt -S \$prefix.concatenated.cds.tidy.fa -m MFP -bb 1000 -alrt 1000 -bnni -T \$threads -pre \$prefix.iqtree -safe). In total, 1000 rounds of ultrafast bootstrap (UB) and approximate likelihood-ratio test (aLRT) were used to assess the branch supports.

Pan-omics data curation and visualization

The previously collected pangenome ORF set (13) (1011 strains), pantranscriptome (33) (969 strains \times 1 environment), panproteome (34,35) (942 strains \times 1 environment and 796 strains \times 1 environment, respectively) and panphenome data (13,32) (971 strain \times 35 traits and 1011 strains \times 99 traits, respectively) of the *S. cerevisiae* global populations were manually curated and matched with each other as well as our expanded ScRAPdb genome collection. For each of our previously characterized *S. cerevisiae* pangenome ORF set, its presence/absence status in the ScRAPdb genome collection as

well as in the 1002ScGP genome collection was evaluated by minimap2 (51) (v2.24). The pangenome ORFs with >80%alignment coverages and >80% sequence identities are considered as presence in the evaluated genome. For the pantranscriptome data, both the read count values calculated by featureCounts (52) and their corresponding transcript per million (TPM) values were retrieved from the original study, the latter of which can be used for direct comparison of gene expression levels across different strains and environments. For the panproteome data, the DIA-NN-inferred protein abundance values (53) obtained from SWATH mass spectrometry (54) were retrieved from the original studies. For the panphenome data, four classes of phenotypic traits data (i.e. generation time, yield, sporulation and chronological life span) were retrieved from the original studies. For each dataset, interactive plots such as heatmaps, violin plots and principal component analysis (PCA) plots were employed for data visualization.

Database implementation

The backend of ScRAPdb is written using the Django framework (https://www.djangoproject.com/; v3.2.4). On the frontend, Echarts (55) (v5.3.3), D3.js (https://d3js.org/; v6.7.0) and Plotly (https://plotly.com/; v2.33.0) were employed to for interactive graph plotting. Phylotree.js (56) (v1.0.16) was used for phylogenetic tree visualization. JBrowse (57) (v2.13.1) was used to power the genome browser. Bootstrap (https: //getbootstrap.com/; v4.3.1) and jQuery (https://jquery.com/ ; v3.2.1) were further used for interactive query and rendering. The website was host via an Alibaba Simple Application Server equipped with 2 CPU, 4 Gb RAM and 280 Gb ESSD data storage, running with CentOS Linux (v8.2) as the operating system.

Results

Data collection and organization

Starting from the original ScRAP dataset (18), we performed an exhaustive search and curation on all currently available long-read-based genome assemblies for both S. cerevisiae and its eight outgroup species from the Saccharomyces species complex to form a significantly expanded ScRAP collection. This updated ScRAP collection consists of 341 S. cerevisiae and 36 outgroup nuclear assemblies as well as 220 S. cerevisiae and 17 outgroup mitochondrial assemblies. These assemblies are further derived from 264 S. cerevisiae strains and 33 outgroup strains (12 S. paradoxus, 2 S. mikatae, 2 S. jurei, 3 S. kudriavzevii, 1 S. arboricola, 2 S. chiloensis sp. nov. AUS, 4 S. chiloensis sp. nov. SA-C, 5 S. eubayanus and 2 S. *uvarum*) (Figure 1A). Following the same protocols (42), we performed systematic assembly curation, statistics evaluation and genomic feature annotation for all these genome assemblies, so that they can be directly compared with each other at both genome and gene levels. Detailed metadata for these strains and assemblies was also curated and compiled, such as their geographical origin, ecological niches, ploidy, zygosity, aneuploidy, mating type, marker gene genotypes and used sequencing technologies (Figure 1B). Comprehensive comparative genomics analyses such as gene orthology identification, genomic variant discovery, phylogeny reconstruction and synteny comparison were conducted accordingly, with their results rendered to the web-based front-end for interactive and intuitive exploration (Figure 1C). Finally, given the recent availability of pangenome ORF set (13), pantranscriptome (33), panproteome (34,35) and panphenome (13,32) data based on the 1002ScGP strain collection (13), we gathered and curated such multi-omics atlases and matched it to our expanded ScRAPdb genome collection, which enables multi-omics-based data exploration and comparison (Figure 1D–F). An overview of 1-to-1-orthologous-gene-based phylogeny of all ScRAPdb-enclosed strains together with their matched multi-omics atlases is further presented in Figure 2.

Web interface and usages

ScRAPdb comes with an intuitive web interface, which helps to navigate users to access different functional modules. A central horizontal navigation menu is provided in the front page with ten clickable tabs: 'Home', 'Strains', 'Phylogeny', 'Pangenome', 'Pantranscriptome', 'Panproteome', 'Panphenome', 'Tools', 'Download' and 'Help', each leading to either a dedicated page or a secondary-level menu (Figure 3). The 'Home' page gives a brief introduction to the ScRAPdb database with various summary plots for the strains and assemblies enrolled regarding their geographical distribution, ploidy and haplotype phasing, sequencing technologies, etc. The 'Strains' page provides a metadata table for all the strains enrolled, with clickable links leading to more strain-specific information. The 'Phylogeny' tab leads to phylogenetic trees based on the nuclear and mitochondrial genomes respectively. Users can easily interact with these trees with mouse clicks and drags. The 'Pangenome', 'Pantranscriptome', 'Panproteome' and 'Panphenome' pages present the pan-omics datasets corresponding to our ScRAPdb strains, with each dataset summarized in both graphical plots and informative tables. Genebased query function (in both single-gene and batch-gene modes) is further built-in for fast search and analysis. The 'Tools' page leads to web-based tools for genome browsing, synteny comparison and homology search. The 'Download' page offers both batch and individual downloading links for all genome sequences and annotations as well as other precalculated results curated in ScRAPdb, including a compilation of full-spectral genomic variant call sets for SNVs, IN-DELs and SVs. Finally, the 'Help' page provides useful helping information regarding the data source, naming convention, contact information, etc.

Application demonstration 1: high-resolution discovery and characterization of structural variants

Long-read-based genome assemblies shine in their value to detect large and complex SVs, which can significantly impact functions and traits. The ScRAPdb compendium of such population-scale long-read-based *S. cerevisiae* genome assemblies offers a powerful platform to discover and characterize SVs accumulated in diverse evolutionary lineages of *S. cerevisiae*. With ScRAPdb, the existence of SVs can be captured and analyzed from three sources: (i) the primary-referencebased SV call set between each enrolled assembly and the SGD reference genome (*S. cerevisiae* strain: S288C); (ii) the interactive genome synteny comparison plots in multiple flavors (e.g. circular synteny plot, linear synteny plot and genome dotplot); (iii) the systematic characterization for the presence and

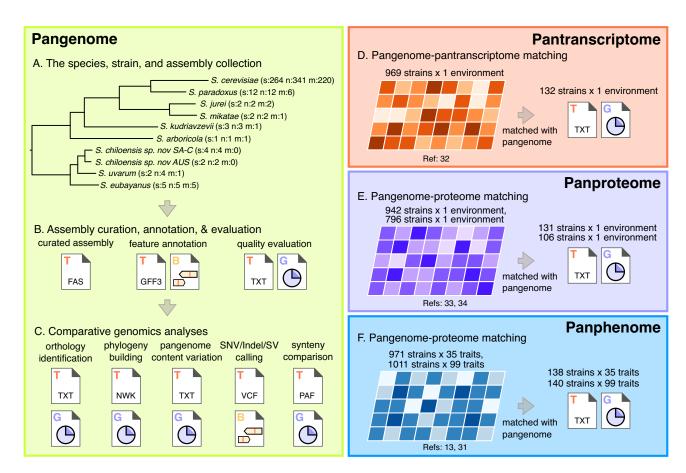


Figure 1. Overview of data collected and generated for ScRAPdb. (A) The species, strain and assembly collection. For each included species, the number of strains (s), nuclear assemblies (n) and mitochondrial assemblies (m) are indicated inside the corresponding parenthesis that appears after the species name. (B) Assembly curation, annotation and evaluation. (C) Comparative genomics analyses. (D–F) The pangenome-based matching with pantranscriptome, panproteome and panphenome data. For (B–F), major analyses and the corresponding result files generated were depicted. The specific file types ('T' for text files, 'G' for graphical files, 'B' for browser visualization) and formats (e.g. TXT, NWK, VCF and PAF) are further indicated. TXT: the plain text format; NWK: the Newick tree format; VCF: the variant call format; PAF: the pairwise mapping format.

absence variation (PAV) of the previously portraited S. cerevisiae pangenome ORF set across 1011 strains (13). Here, we used these three methods to highlight the polymorphic distribution of the killer toxin gene KHR1 (SGD systematic name: YSC0002) among different S. cerevisiae strains (Figure 4). KHR1 is absent from the SGD reference genome but exists in strains such as YJM789 (58). By searching KHR1 on the genome content variation page under the 'Pangenome' menu of ScRAPdb, we can obtain a detailed description regarding its function and PAV status across different S. cerevisiae genome assemblies curated in ScRAPdb, which suggests the presence of KHR1 in the strain SK1 (Figure 4A–C). By running BLAST search (natively supported by ScRAPdb) with the KHR1 coding sequence (CDS; size = 891 bp) retrieved from SGD, we can easily identify the corresponding genomic location of KHR1 in the SK1 genome assembly (chrIX:285388-286278) (Figure 4D). By zooming into this region in the interactive pairwise genome dotplot powered by ScRAPdb, we can not only verify this SV but also obtain its insertion location relative to the SGDref (chrIX:300544-300545) (Figure 4E and F). By examining this location along SGDref with ScRAPdb's built-in genome browser, we can further confirm a 1622bp structural insertion containing the KHR1 gene in SK1 as reflected by the pre-loaded SK1 genomic variant track (Figure **4**G).

Application demonstration 2: understanding trait evolution across different omics layers

The domestication history of S. cerevisiae in food and beverage production dates back to thousands of years ago. Such long-term adaptation in specific anthropic environments has shaped their genome and trait evolution substantially. For example, sulfites are widely used in wine production as preservatives to maintain the flavor and freshness of wine. Accordingly, many S. cerevisiae strains from the Wine/European clade showed higher tolerance to SO₂, as a result from the use of sulfites during winemaking. The SSU1 (YPL092W) gene encodes the sulfite efflux pump on the plasma membrane and is largely responsible for SO_2 tolerance in S. cerevisiae (59). With ScRAPdb, by comparing the gene expression level of SSU1 across strains from different phylogenetic clades, we found four Wine/European strains with exceptionally high levels of SSU1 expression, namely YJM981 (ADI), YJM978, C-6 (CRL) and CBS2807 (AIC) (Figure 5A and B). In parallel, the ScRAPdb genome synteny comparison between these strains and SGDref revealed clear chrVIII-chrXVI translocations in YJM981 (ADI), YJM978 and C-6 (CRL), which are also the top three strains with the highest levels of SSU1 expression (Figure 5C). Previous studies have demonstrated that such chrVIII-chrXVI translocation can substantially elevate SSU1 expression via a promoter hijack (60,61). Interestingly,

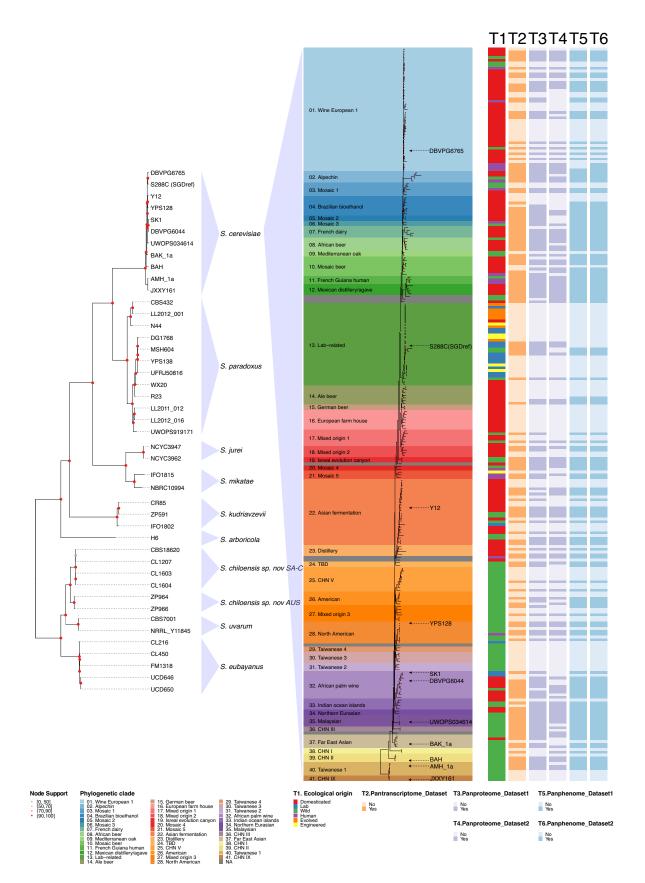


Figure 2. Phylogenetic distribution of yeast strains enclosed in ScRAPdb. The 1-to-1-orthologous-gene-based phylogenetic tree of yeast strains enclosed in ScRAPdb overlayed with their phylogenetic-clade assignments. The tracks T1-T6 represent the availability of the matched pantranscriptome, panproteome and panphenome datasets. The node supports (assessed by aLRT) for the phylogenetic tree are indicated by colored dots. Matched pan-omics datasets include Pantranscriptome Dataset (33), Panproteome_Dataset1 (34), Panproteome_Dataset2 (35), Panphenome_Dataset1 (13) and Panphenome_Dataset2 (32).

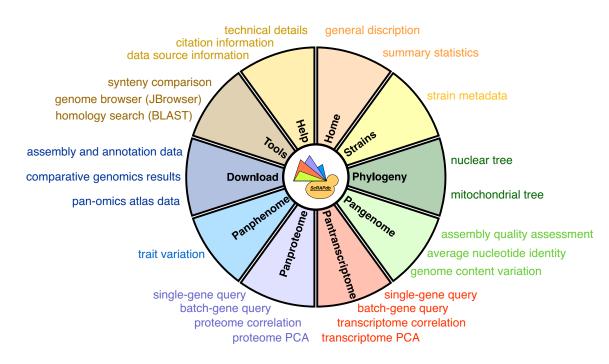


Figure 3. Menu organization for ScRAPdb. The top-level menus of ScRAPdb are shown in the inner cycle, while the corresponding features and functions are further called out in the outer cycle.

CBS2807 (AIC) is free from both this characteristic chrVIIIchrXVI translocation and two other known SVs related to SSU1 (62,63), suggesting an alternative evolutionary strategy that is yet to be elucidated for SSU1 up-regulation. In addition to winemaking, dairy fermentation is another typical domestication niche for S. cerevisiae. GAL1 (YBR020W) and GAL3 (YDR009W) are a pair of paralog genes in the S. cerevisiae genome that mediate galactose metabolic process. With ScRAPdb, we found these two genes show much higher expression levels in strains from the French dairy clade relative to all the other strains, which further agrees with the high growing yields of these strains in the galactose environment (Figure 5E). Therefore, higher expression levels, coupled with previously reported alternative GAL alleles (64,65), may synergistically contribute to enhanced galactose utilization. Taken together, these two examples showcased how ScRAPdb with its multi-omics integration can help researchers to better study trait evolution across different genomic and functional layers.

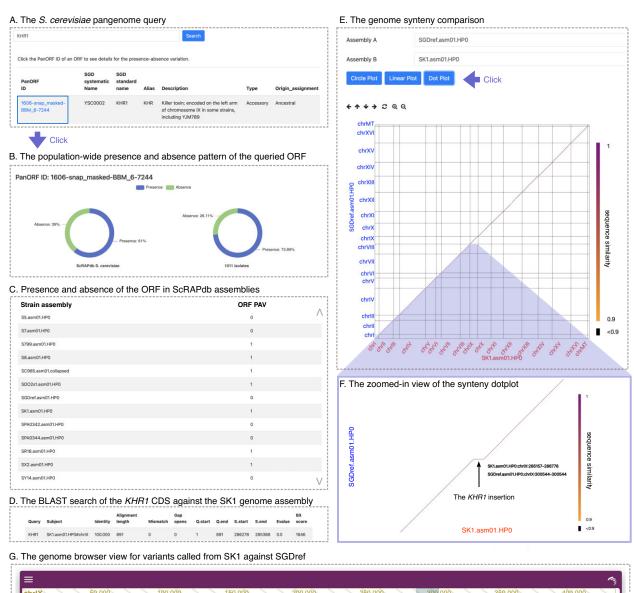
Discussion

While the budding yeast *S. cerevisiae* has been serving as an all-time classic model organisms in modern biology, the past 15 years truly witnessed its emergence as a leading system to study genomics and evolution at population scales. Till today, >3000 of strains that are geographically and ecologically distinct have been fully sequenced (66), exhibiting a surprisingly high level of genome diversity and plasticity. Considering their over 9000 years of association with the human society (67), it is expected that human domestication on *S. cerevisiae* in diverse industrial settings has played an important role along the way. Moreover, the recent release of large-scale transcriptomics, proteomics and phenomics data across hundreds of genetic backgrounds and environmental conditions further offered us invaluable resources and power to dissect complex genotype-to-phenotype interactions and to obtain a multi-

layered view on how genomic variation translates into phenotypic differences. Therefore, it is critical to develop a centralized data hub to enable seamless integration, exploration and sharing of these multi-omics treasures. Such a unified platform is highly useful for not only the yeast enthusiasts but also a much broader research community for formulating and testing new hypotheses, models and tools in addressing general biological questions related to genotype-phenotype mapping.

In this study, we present ScRAPdb, an integrated panomics database for the ScRAP. Compared with the classic yeast genomics databases such as SGD (6) and YGOB (11), ScRAPdb shines with its unique emphasis on populationscaled pangenome characterization and multi-omics integration. In this sense, ScRAPdb filled the gap between the single-reference-centered SGD database and the inter-specificcomparison-motivated YGOB database by offering a novel platform for exploring intra-specific diversity of *S. cerevisiae* across multiple omics layers spanning between the genotype and phenotype space.

In the future, ScRAPdb will be updated on a regular basis to keep incorporating reference-quality genomes as well as large-scale functional assays for S. cerevisiae and its close relatives. Furthermore, towards the ultimate goal of elucidating the genetic basis of complex traits, we plan to add supports for user-uploaded phenotype data as well as built-in genomewide association mapping tools to enable direct association tests across multi-omics layers. In addition, S. cerevisiae is well ahead of the time in genome editing, thanks to its highly effective homologous recombination system. As newer genome editing tools such as the clustered regularly interspaced short palindromic repeats (CRISPR)/CRISPR-associated (Cas) systems become increasingly accessible and effective, genomewide editing and perturbation experiments are now possible for being applied to diverse natural strains of S. cerevisiae in parallel. ScRAPdb is expected to further incorporate such data when it becomes available, which will add another dimension for deciphering genotype-phenotype interaction and their



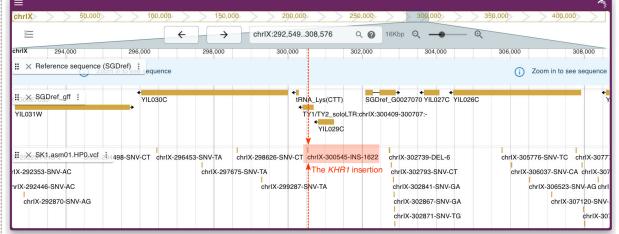


Figure 4. Structural variant characterization with ScRAPdb. (**A**) Pangenome ORF query of the *KHR1* gene. (**B**) The population-wide distribution of the query gene (*KHR1*) in the ScRAPdb and 1002ScGP strain panels, respectively. (**C**) The presence/absence status of the query gene (*KHR1*) in each ScRAPdb *S. cerevisiae* genome assembly. (**D**) The BLAST result of the query gene (*KHR1*) against the SK1 genome assembly in ScRAPdb. (**E**) The genome-wide dotplot for the pairwise comparison between SGDref and SK1 genome assemblies. (**F**) The zoom-in view of the SGDref versus SK1 genome dotplot. (**G**) The genome browser view of ScRAPdb for the *KHR1* insertion relative to SGDref and its flanking region at chrIX:292549–308576.

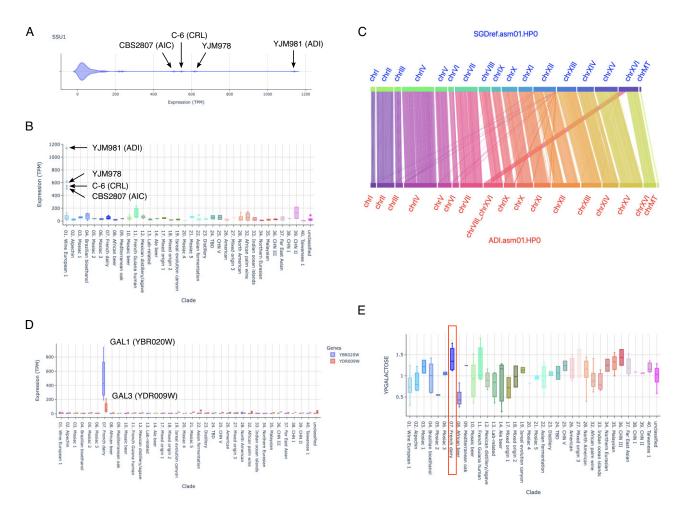


Figure 5. Multi-omics understanding of trait evolution with ScRAPdb. (A) The overall expression profile of the SSU1 (YPL092W) gene in the 131 S. cerevisiae strains from the ScRAPdb strain panel with matched transcriptome data. (B) The expression levels of the SSU1 (YPL092W) gene across different ScRAPdb phylogenetic clades. (C) The genome synteny comparison between SGDref and YJM981 (ADI). (D) The expression levels of the GAL1 (YBR020W) and GAL3 (YDR009W) genes across different phylogenetic clades defined in ScRAPdb. (E) The growth phenotype measured by yield of ScRAPdb across different ScRAPdb phylogenetic clades, with the French dairy clade highlighted.

regulatory machineries. In addition to actively seeking the opportunities to incorporate newly available population-level omics data on *S. cerevisiae*, we also welcome colleagues in the yeast community and beyond to contact us when such data are generated in their labs, and we are committed to host the data for public sharing.

Data availability

All data covered by ScRAPdb can be freely accessed and downloaded at https://www.evomicslab.org/db/ScRAPdb/. The genome sequences and annotation data for batch downloading are available in the Zenodo repository at https://doi.org/10.5281/zenodo.12580380.

Acknowledgements

We thank the valuable comments and suggestions from two anonymous reviewers, which helped to significantly improve the quality of this manuscript and the associated database. We appreciate the open-science culture of the yeast community for timely depositing many of these long-read yeast genome assemblies to the public domain. We thank the help of many researchers on communicating on and sharing the sequences and metadata of their long-read yeast genome assemblies to us. Special thanks to Dr Isheng Jason Tsai, Dr Kristoffer Krogerus, Dr Meru J. Sadhu, Dr Joshua Bloom, Dr Francisco A. Cubillos, Dr Kenneth H. Wolfe, Dr Anthony D. Long, Dr Stefano Campanaro, Dr Casey M. Bergman, Dr Douda Bensasson, Dr Lydia R. Heasley, Dr J.J. Emerson, Dr Xinwen Zhang, Dr Samina Naseeb, Dr Tomas Peña, Dr Chen-Guang Liu, and Dr Min-Seung Jeon (we apologize for any potential omission) for their expedite and informative response to our queries on data curation. We thank the valuable feedback from Dr Nicolò Tellini when trying out the developmental version of ScRAPdb. We thank the facility support from the Single-Molecule Sequencing Platform at Sun Yat-sen University Cancer Center.

Author contributions: Z.M.: Methodology, software, validation, formal analysis, investigation, data curation, visualization, writing—original draft, writing—review and editing. Y.R.: Methodology, validation, formal analysis, investigation, data curation, writing—original draft, writing review and editing. A.T.: Methodology, software, validation, formal analysis, investigation, data curation, writing original draft, writing—review and editing. L.Y.: Formal analysis, investigation, visualization, data curation, writing original draft, writing—review and editing. H.L.: Formal analysis, investigation, visualization, writing—review and editing. C.Y.: Methodology, software, visualization, writing review and editing. G.L.: Data curation, writing—review and editing. G.F.: Data curation, writing—review and editing. J.L.: Validation, formal analysis, investigation, resources, data curation; writing—review and editing, funding acquisition. J.-X.Y.: Conceptualization, methodology, software, validation, formal analysis, investigation, resources, data curation, writing—original draft, writing—review and editing, supervision, project administration, funding acquisition.

Funding

National Natural Science Foundation of China [32070592 to J.-X.Y., 32000395 to J.L.]; Guangdong Basic and Applied Basic Research Foundation [2022A1515010717 to J.-X.Y. and 2022A1515011873 to J.L.]; Guangdong Pearl River Talents Program [2019QN01Y183 to J.-X.Y., 2021QN02Y168 to J.L.]; Sun Yat-sen University Cancer Center [YTP-SYSUCC-0042 to J.-X.Y. and YTP-SYSUCC-0040 to J.L.]; Fundamental Research Funds for the Central Universities [24qnpy293 to J.-X.Y.]. Funding for open access charge: National Natural Science Foundation of China.

Conflict of interest statement

None declared.

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Received: August 14, 2024. Revised: October 5, 2024. Editorial Decision: October 8, 2024. Accepted: October 10, 2024 © The Author(s) 2024. Published by Oxford University Press on behalf of Nucleic Acids Research.

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