

Database Paper

BnaGVD: A Genomic Variation Database of Rapeseed (Brassica napus)

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Rapeseed (Brassica napus L.) is a typical polyploid crop and one of the most important oilseed crops worldwide. With the rapid progress on high-throughput sequencing technologies and the reduction in sequencing cost, large-scale genomic data of a specific crop have become available. However, raw sequence data are mostly deposited in the sequence read archive of the National Center of Biotechnology Information and the European Nucleotide Archive, which is freely accessible to all researchers. Extensive tools for practical purposes should be developed to efficiently utilize these large raw data. Here, we report a web-based rapeseed genomic variation database (BnaGVD, http://rapeseed.bio cloud.net/home) from which genomic variations, such as single-nucleotide polymorphisms (SNPs) and insertions/ deletions (InDels) across a worldwide collection of rapeseed accessions, can be referred. The current release of the BnaGVD contains 34,591,899 high-quality SNPs and 12,281,923 high-quality InDels and provides search tools to retrieve genomic variations and gene annotations across 1,007 accessions of worldwide rapeseed germplasm. We implement a variety of built-in tools (e.g. BnaGWAS, BnaPCA and BnaStructure) to help users perform in-depth analyses. We recommend this web resource for accelerating studies on the functional genomics and the screening of molecular markers for rapeseed breeding.

Keywords: BnaGVD • Database • Genomic variations • Rapeseed.

Introduction

Rapeseed (*Brassica napus* L.) is an economically important crop grown mainly as a source of edible oil and protein-rich livestock feed. *Brassica napus* is a recent allopolyploid species, formed during the past ~7,500 years ago by an interspecific hybridization between two diploid progenitors, *Brassica rapa* (AA) (n = 10) and *Brassica oleracea* (CC) (n = 9) (Chalhoub et al. 2014). The emergence of high-throughput sequencing technologies and the availability of *B. napus* reference genome (Chalhoub et al. 2014) have provided new insights into the genomic localization of agronomically important quantitative trait loci, the identification of genes underlying genetic diversity and the determination of the nature of its origins (Lu et al. 2019, Wu et al. 2019).

Over the past decades, large quantities of genotypic data have been exponentially generated through rapid advancements in sequencing technologies and decreasing costs. High-quality reference genomes have also become available, thereby facilitating the improvement of genomic variation data at unprecedented rates and promoting systematic studies on population genetics, including genome-wide association studies (GWASs) (Hayes 2013), evolutionary studies (Wang et al. 2018) and comparative genomics (An et al. 2019).

Single-nucleotide polymorphisms (SNPs) and insertions/ deletions (InDels) have been widely used in breeding programs of rapeseed and other crops. Biology researchers especially crop breeders have been benefited from SNPs in identifying functional genes, e,g, the key genes related to the nitrogen use efficiency in rice (Tang et al. 2019), genes for fertility restoration in maize (Jaqueth et al. 2020) and the genes for elevating seed oil content in rapeseed (Karunarathna et al. 2020). Based on the identification of key functional genes, molecular breeding and genetic editing targeting these genes can be further carried out. Approaches, such as GWAS, unveil genetic variability in the forms of SNPs and other types, and these approaches are effective in associating important agronomic and quality traits with their causal loci in various field crops, such as rice (Yano et al. 2016), maize (Wang et al. 2020), soybean (Zhou et al. 2015), rapeseed (Lu et al. 2019, Wu et al. 2019) and cotton (Ma et al. 2018).

Large rapeseed genomic variation datasets have been generated through next-generation sequencing (NGS) technology (Wu et al. 2019). With the availability of large data, a major hurdle has emerged, i.e. how to effectively integrate and share them with the rapeseed research community to speed up rapeseed breeding. The identification of key SNPs and InDels from large NGS datasets is also laborious and requiring extensive computational resources; as such, current SNP and InDel datasets are not user friendly. Several genomic variation databases, including SorGSD for sorghum (Luo et al. 2016), RiceVarMap for rice (Zhao et al. 2015), PeachVar-DB for peach (Cirilli et al. 2018), CitGVD for citrus (Li et al. 2020) and BnaSNPDB for rapeseed (Yan et al. 2020), have been developed. Here, we build BnaGVD, a comprehensive database of rapeseed genomic

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variations, to provide a publicly available and free data service for rapeseed research. BnaGVD contains 1,007 rapeseed germplasm accessions from 39 countries in the world and 5,559,254, 5,526,961, and 28,509,014 high-quality SNPs and 1,858,671, 1,919,465, and 8,503,787 high-quality InDels by mapping reads to Darmor-bzh (Chalhoub et al. 2014), Tapidor (Bayer et al. 2017) and NY7 (Zou et al. 2019) reference genomes. BnaGVD comprises functional gene annotations and several tools for indepth analyses, namely, BnaGWAS for performing genomewide associations mapping based on built-in phenotype data or user-uploaded data, BnaPCA for visualizing genetic diversity based on SNPs in given samples, BnaStructure for visualizing population structure based on SNPs in given samples and PCR primer design and GBrowse for examining genomic variations and genes. These resources and analysis tools will become freely accessible to the rapeseed research community. This web resource will also help researchers focusing on the population genetics, functional genomics and molecular breeding of rapeseed.

Results

Database content and access

All raw paired-end reads from previously published NGS data (Wu et al. 2019) were collected and processed with an in-house pipeline (Fig. 1) (see Materials and methods). The BnaGVD database contains four functional sections, namely, 'Browse', 'Search', 'Tools' and 'Download'. It also has a 'Help' section that contains detailed introductory information and user tutorials. These built-in functional modules not only work independently but also cooperate with one another in a single work flow.

Browse

The 'Browse' section in BnaGVD provides data browsing functions, including SNP/InDel browse through which genomic variations can be searched according to reference genomes, chromosomes and germplasms. Gene annotation is used to browse gene information and annotations, and gene family is utilized to browse gene cluster information based on the Pfam data (Finn et al. 2014). Users can browse and filter gene annotations based on three reference genomes, namely, Darmor-*bzh*, Tapidor and NY7, annotation databases or gene IDs (Fig. 2a).

The genes of the three reference genomes are annotated on the basis of different databases, such as Nr, gene ontology (GO), Kyoto encyclopedia of genes and genomes (KEGG), Swiss-Prot, InterPro and Pfam (Fig. 2b). A new page with gene information, gene structure, genomic sequence, coding sequence (CDS sequence), transcript sequence and peptide sequence is opened by clicking on the hyperlink associated with the gene ID (Fig. 2c, Supplementary Fig. S1).

Search

The 'Search' section provides a user-friendly web interface to extract SNP/InDel information by specifying the chromosomal start and end regions, gene IDs and SNP/InDel IDs (Fig. 3a). Three modules, namely, Multicriteria Search, Comparative Search and Gene Search, are under the 'Search' drop-down menus. The Multicriteria Search provides SNP/InDel information for a single variation (Fig. 3b), and Comparative Search generates SNP/InDel information among multiple varieties (Fig. 3c). Multicriteria Search displays information on SNP/InDel IDs, chromosomal positions, associated genes and upstream and downstream sequences of SNP/InDel IDs (Fig. 3b). Comparative Search directly displays SNP/InDel IDs, chromosomal positions and associated genes of all varieties (Fig. 3c). Both of them allow users to jump to the GBrowse interface to browse the detailed information of variations through a given hyperlink (Supplementary Fig. S2a). Gene Search module allows users to search for gene information based on different reference genomes, chromosomal positions and gene or protein IDs (Supplementary Fig. S2b).



Fig. 1 Pipeline used in the processing of rapeseed NGS data to construct BnaGVD.



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Gene ID	DataBase	Annotation ID	Annotation	Gbrowse	Variation	
BnaA01g00010D	GO	GO:0005787	Cellular Component: signal peptidase complex	Gbrowse	Indel	SNF
BnaA01g00010D	GO	GO:0006465	Biological Process: signal peptide processing	Gbrowse Gbrowse Gbrowse Gbrowse Gbrowse Gbrowse	Indel	SNP
BnaA01g00010D	GO	GO:0008233	Molecular Function: peptidase activity			
BnaA01g00010D	GO	GO:0016021	Cellular Component: integral component of membrane		Indel	SNF
BnaA01g00010D	InterPro	IPR009542	Microsomal signal peptidase 12kDa subunit		Indel	SNP SNP SNP
BnaA01g00010D	KEGG	K01951	GMP synthase (glutamine-hydrolyzing); K01951 GMP synth		Indel	
BnaA01g00010D	MobiDBLite	mobidb-lite	consensus disorder prediction		Indel	
BnaA01g00010D	Nr	*	PREDICTED: probable signal peptidase complex subunit 1		Indel	SNF
BnaA01g00010D	aA01g00010D Pfam PF06645		Microsomal signal peptidase 12 kDa subunit (SPC12)			SNP
	Gene St	ructure				
	3naA01g00010D 3naA01g00010D 3naA01g00010D 3naA01g00010D 3naA01g00010D 3naA01g00010D 3naA01g00010D 3naA01g00010D	Image: Strake of the	Image: Market in the second	Internation Notice of the second	Interface Name Other Name Ot	Interface Name Name

Fig. 2 Interface to search and filter gene annotations. (a) Gene annotation filtering options by reference genome, annotation database or gene ID. (b) Gene annotations retrieved according to different databases. (c) Interface showing the gene structure.

(a)	Variation Type SNP Indel Ref. Genome NingYou7 Darmor-bzh Tapidor_v63									
	By re	gion O Chromos	A01	▼ Loc	ation: start	0	eg:0 end	1000000	eg:1000000	
	By gene O Gene ID			nt	eg:BnaA01g00020D					
	By Va	ariation Variation	D Please enter conte	nt	eg:SNP.Dam	nor-bzh.A01.1610				
(b)		All Reverse & Download								
		SNP ID :	SNP.Darmor-bzh.A10	.14998679					Gbrowse	
		Position:	A10:14998679						Primer3	
		Loaction:	INTRAGENIC	INTRAGENIC						
		Gene ID:	BnaA10g22080D							
	20bp flank Sequence: ATCAAATTAGGGCGCAAAGCC/ACTGTT				TGGAGACAGAAGCCAT					
		500bp flank Sequence:	*							
(c)		All Reverse & Download & Download								
		UniSNP ID	Chrom:Position	SNP Class	Ge	ene Name:SNP	R4155	R4156	Action	
	0	SNP.Darmor-bzh.A01.16 5286	A01:165286	SNP	Bn ST	aA01g00310D:DOWN REAM	с/т	с/т	GBrowse Primer3 Full	

Fig. 3 Search functions implemented in BnaGVD. (a) Genomic variations associated with different chromosomal locations or genes. (b) Typical search result via Multicriteria Search. (c) Comparative search, which provides information about SNP/InDels among multiple varieties.

T. Yan *et al*. | BnaGVD



Fig. 4 BnaGWAS tool, which performs association mapping and result visualization in the form of Manhattan and QQ plots.

Tools

BnaGVD is designed for storing, displaying, and extracting information on genomic variation. A core germplasm collection (Xuan et al. 2020) with 300 accessions is established on the basis of whole rapeseed germplasms to use large genetic resources efficiently, and this collection is shared with several research units involved in rapeseed breeding in China. In a previous publication, we have showed that the core germplasm collection can represent the majority of the genetic variations in whole germplasm accessions (Xuan et al. 2020). Three tools, namely, BnaGWAS, BnaPCA and BnaStructure, are developed and integrated within BnaGVD to maximize the use of genetic information. BnaGWAS can be applied to perform GWAS and visualize the results in the form of Manhattan and guantilequantile (QQ) plots (Fig. 4, Supplementary material). It is also built on the basis of the EMMAX model (Kang et al. 2010). Significant SNPs, including annotations of associated genes, can be extracted from association mapping results based on different databases (e.g. Nr, SWISS-PROT, GO, KEGG and eggNOG), which can be conducted in a single work flow. BnaPCA can be utilized to visualize genetic diversity based on SNPs in given samples provided by users (Supplementary Fig. S3). BnaStructure is designed to show the population structure based on SNPs in given samples (Supplementary Fig. S4). The results from the three tools are sent to users via e-mail. In addition to these three tools, GBrowse, Primer Design and BLAST are established to search for orthologs or paralogs of a sequence input by users. The BLAST platform integrates multiple programs, such as blastn, blastp, blastx, tblastn and tblastx, to retrieve hits of CDS and peptide sequences from three reference genomes. These tools will be helpful for mining genetic variations and genes related to important agronomic traits of rapeseed. Thus, it will facilitate the screening of molecular markers for accelerated rapeseed breeding.

Download

All built-in data, including genotypic data, NGS sequencing data, reference data, and phenotypic data, are provided in the BnaGVD platform for users to download. All the raw sequences of the rapeseed accessions used in this study have been deposited in the public databases of the National Center of Biotechnology Information (NCBI) under SRP155312 (https://www.ncbi.nlm.nih.gov/sra/SRP155312) and the National Genomics Database Center under CRA001854 (https://bigd.big.ac.cn/gsa/browse/CRA001854). The results from 'Browse' and /Search' tools can be downloaded from the result pages by clicking on the link named 'Download' (Figs. 2b, 3b, c).

Help

A 'Help' section, including FAQs, is provided to assist the users of BnaGVD. An analysis pipeline step-by-step user guide is also available to ensure that first-time users can easily access BnaGVD.

Discussion and Conclusion

Biological research has largely benefited from a variety of databases with different applications. In a previous database (BnSNPDB), we provided tools to draw linkage disequilibrium heat map (LDheatmap), SNP distribution map and phylogenetic tree by retrieving SNPs of 1,007 rapeseed accessions. In this article, we developed new online tools for GWAS, principal component analysis (PCA) and population structure analysis in the same rapeseed population. In addition to SNPs, we provided method to retrieve InDels for genetic polymorphism analysis. This database can serve as an important online tool for genomic variation analyses complementary to what we previously provided (Yan et al. 2020). The rapeseed genomic variations stored in the BnaGVD are from the largest worldwide collection of rapeseed accessions and are the most



comprehensive. The database integrated 1,007 worldwide rapeseed germplasm accessions from 39 countries and 34,591,899 high-quality SNPs and 12,281,923 high-quality InDels. BnaGVD contributes to future rapeseed studies, including population genomic, mining of key genes related to important agronomic traits and whole-genome molecular marker-assisted breeding.

Previously published databases, such as SorGSD for sorghum (Luo et al. 2016), mainly focused on storing genomic variations (SNPs/InDels). Several Brassica crops related database, such as CropSNPdb (Scheben et al. 2019), have been established to store and retrieve SNPs. The CropSNPdb is a database of SNP array data for Brassica crops and hexaploid bread wheat, which is essential for the molecular breeding of rapeseed. However, the CropSNPdb just provides a simple query interface and the SNP array data were produced by Brassica 60K arrays and not by the NGS technology and just contains 459 rapeseed accessions. By comparison, the BnaGVD was designed with built-in tools and pipelines, such as BnaGWAS for GWAS, BnaPCA for genetic diversity visualization based on SNPs in given samples provided by users and BnaStructure for population structure visualization. As such, BnaGVD could be utilized to extract and browse information about genomic variation and perform GWAS, gene annotation and genomic variation visualization. We also constructed a core germplasm collection containing 300 accessions, which represented the genetic diversity of 1,007 rapeseed genome, for follow-up rapeseed research (Xuan et al. 2020).

We also cooperated with the majority of the research community to share the core germplasm collection to greatly improve the mining of key genes related to important agronomic traits and facilitate the screening of molecular markers. Thus, we could accelerate rapeseed breeding.

With the rapidly decreasing sequencing cost, more genomes will be sequenced and assembled, and genomic variations are no longer limited to SNPs/InDels. In the next version, a large number of rapeseed individuals, reference genomes, phenotypes and genetic structure variations, including copy number variations, structural variations and transposons, will be integrated in BnaGVD.

In summary, we constructed a rapeseed genomic variation database (BnaGVD) as a platform for bioinformatic analysis, including examination of genomic variation, gene annotation and visualization of SNPs and GWAS results. We also cooperated with domestic and international research communities to share the core germplasm collection and promote the screening of molecular markers for the genetic improvement of rapeseed.

Materials and Methods

Data sources and processing

All raw paired-end reads from previously published NGS data (Wu et al. 2019) were collected and processed with an in-house pipeline (Fig. 1). For data processing, all raw paired-end reads were trimmed with Trimmomatic (v0.3.0, parameters: LEADING:3 TRAILING:3 SLIDINGWINDOW:4:15 MINLEN:50) (Bolger et al. 2014) for quality control and then mapped to the reference *B. napus* genome by using the MEM algorithm of the Burrows–Wheeler Aligner program (Li and Durbin 2010). Mapping results were sorted, and duplicate reads were marked using SAMtools (Li et al. 2009) and Picard (https://broadinstitute.github.io/picard/; v1.9.4) with default parameters. SNPs and InDels were

identified and filtered with GATK (the detailed pipeline is available at https:// github.com/YTLogos/myscript/blob/master/Variants_calling/variants_ calling_pipeline.sh) (McKenna et al. 2010). SNPs were annotated by utilizing the SnpEFF software (Cingolani et al. 2012). The genes from the reference genomes Darmor-*bzh* (Chalhoub et al. 2014), Tapidor (Bayer et al. 2017) and NY7 (Zou et al. 2019) were annotated on the basis of NCBI's nonredundant protein database (Nr) (Pruitt et al. 2004), GO (The Gene Ontology Consortium, 2017), KEGG (Aoki-Kinoshita and Kanehisa 2007), SWISS-PROT protein sequence database (Bairoch and Apweiler 2000), InterPro database (Hunter et al. 2009), Pfam database (Finn et al. 2014) and eggNOG database (Huerta-Cepas et al. 2019) and then integrated into BnaGVD. With 34,591,899 SNPs, 12,281,923 InDels and their corresponding gene annotations, a web interface was designed to search for, browse, analyze, and download data.

Database construction

The BnaGVD database was built on the basis of a J2EE framework with MySQL (http://www.mysql.org/; a free and popular relational database management system) as the database engine. Web user interfaces were developed with JSP (JavaServer Pages; a technology facilitating rapid development of dynamic web pages based on the Java programming language), HTML5 and CSS3. BnaGVD-integrated tools, such as BnaGWAS, BnaPCA and BnaStructure, were compiled with R (v3.6.0) and Perl (v3.5.6) and operated in a Linux environment. GBrowse (Stein et al. 2002) (http://gbrowser.sourceforge.net) was adopted for chromosome-based genomic variation and gene visualization. Primer Design (v4.1.0) was implemented to retrieve primers for *B. napus* SNPs, InDels and genes. BLAST (v2.2.31) was used to search for orthologs or paralogs of input sequences in BnaGVD.

Supplementary Data

Supplementary data are available at PCP online.

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Disclosures

The authors have no conflicts of interest to declare.

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