

CMDB: the comprehensive population genome variation database of China

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ABSTRACT

A high-quality genome variation database derived from a large-scale population is one of the most important infrastructures for genomics, clinical and translational medicine research. Here, we developed the Chinese Millionome Database (CMDB), a database that contains 9.04 million single nucleotide variants (SNV) with allele frequency information derived from low-coverage (0.06x–0.1x) whole-genome sequencing (WGS) data of 141 431 unrelated healthy Chinese individuals. These individuals were recruited from 31 out of the 34 administrative divisions in China, covering Han and 36 other ethnic minorities. CMDB, housing the WGS data of a multi-ethnic Chinese population featuring wide geographical distribution, has become the most representative and comprehensive Chinese population genome database to date. Researchers can quickly search for variant, gene or genomic regions to obtain the variant information, including mutation basic information, allele frequency, genic annotation and overview of frequencies in global populations. Furthermore, the CMDB also provides information on the association of the variants with a range of phenotypes, including height, BMI, maternal age and twin pregnancy. Based on these data, researchers can conduct meta-analysis of related phenotypes. CMDB is freely available at <https://db.cngb.org/cmdb/>.

INTRODUCTION

As the cost of sequencing has declined rapidly during the last decades, numerous large-scale population genomics research were conducted to support the precision medicine initiative (1–21). To date, several well-known large-scale

international and national population genome variation databases have been published, such as the 1000 Genomes Project (1KGP) (15), Genomics England (16), Genome of the Netherlands (17), ExAC (18) and gnomAD (19). In addition, there are some genomic databases, such as NIH All of us (22) (<https://allofus.nih.gov/>), that are under construction. These databases have provided a considerable number of genome variants to assist in the fundamental understanding of human genetic architectures. However, the majority of these lack generalizability and are biased towards the baseline for European populations. While significant knowledge about human genetics has been achieved thanks to studies involving more than hundreds of thousands of participants for population with European ancestry (23,24), genetic information of the Chinese population were under-represented. The knowledge of genetic variants and their allele frequencies of the world's largest population were generally obtained from studies consisting of less than tens of thousands individuals (25).

China is the most populous country and the second-largest economy in the world. Therefore, a large-scale Chinese genome database based on whole-genome sequencing data of hundreds of thousands of Chinese individuals with various ethnic groups will not only be of great benefit to the practice of both evolutionary and translational medicine research of the Chinese population, but also addressing the existing sample distribution imbalance of global population in available databases. In the past decade, several Chinese genome projects have been launched. PGG.Han, released in 2019, archives approximately 12K WGS data and 102 586 high-density genome-wide genotyped data (26). ChinaMAP released the analytics of deep WGS about 10.5k individuals recruited from 8 ethnic populations in China (25). The NyuWa genome resource that includes deep WGS of 2999 Chinese individuals and constructed reference panel has been open access since 2021 (27). However, PGG.Han and NyuWa are predominantly biased towards the Han Chinese population while ChinaMAP is mostly biased

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toward the Central and North Chinese population. Consequently, they may not be capable of representing the ethnic diversity of China.

Here, we have established the Chinese Millionome Database (CMDDB, <https://db.cngb.org/cmddb/>), the largest and the most representative Chinese genome variation database to date. The CMDDB database contains 9.04 million single nucleotide variants (SNVs) and the allele frequency information from low-coverage ($0.06\times-0.1\times$) WGS data of 141 431 unrelated healthy Chinese individuals (28). These individuals were recruited from 31 out of the 34 administrative divisions in China, covering the Han and 36 ethnic minorities. The main functions of the database are described below. (i) the database provides a query interface to search for allele frequency of variants. (ii) GWAS summary statistics for common phenotypes that were cataloged based on Genome-wide Association Study (GWAS).

DATA COLLECTION AND PROCESS

The CMDDB was designed based on the whole genome analysis results from 141 431 unrelated individuals. The participants were all healthy pregnant women and recruited via the non-invasive fetal trisomy test at BGI between 2012 and 2013 (28,29), covering 31 out of the 34 administrative divisions with Han and 36 other ethnic minorities in China. All of the participants had signed informed consent and then been assigned an anonymous sample code before donating blood sample for excluding any personal identifiable information. After applying the low-coverage WGS ($0.06\times$ to $0.1\times$) for each participant, we filtered and aligned the reads using SOAPnuke (30) and bwa (31), removed duplicates with samtools rmdup module (32), recalibrated the base quality score using GATK(v3.8) (33). BaseVar (<https://github.com/ShujiaHuang/basevar>), a self-developed fast maximum likelihood estimation method, was afterwards run to identify polymorphic sites and infer allele frequencies (28). In addition, we annotated the variants with VEP (34), employed STITCH(v1.2.7) (35) to impute genotype, and Ansd (36) to call the significant loci associated with a phenotype. More details in sample summary and analysis have been described in the previous study (28).

DATABASE IMPLEMENTATION

Based on the allele frequency and the summary results of GWAS, we adopted the following IT strategies to build the database. We used flask as the CMDDB backend framework (<https://flask.palletsprojects.com/>) and MongoDB as the database engine (<https://www.mongodb.com/>). Flask is a popular, free and open-source micro framework for building web application while MongoDB is a popular and open-source document-oriented NoSQL database that is designed to store a large scale of data. The web frontend interface was developed using the VUE framework (<https://vuejs.org/>), a progressive framework for building user interfaces. Moreover, JQuery (<https://jquery.com/>, a cross-platform and feature-rich JavaScript library) and Bootstrap (<https://getbootstrap.com>, an open-source toolkit for developing Web projects using HTML, CSS and JS) were used as plugins. In addition, the website used D3 (<https://d3js.org/>,

a JavaScript library for manipulating documents based on data) and Echart (<https://echarts.apache.org/>, data visualization open-source toolkit) to visualize genomics data.

DATABASE CONTENT AND USAGE

Overview

CMDDB contains 9.04 million SNVs and associated variants with four phenotypes. In these datasets, 81.7% of the variants have been called in the 1KGP Han Chinese individuals (15), and 2.6% (233 966) are completely novel not present in the dbSNP database (28). Statistics information on the distribution of variants on all chromosomes is displayed on the overview page of the database, and the user can select any chromosome to view the statistics information for that chromosome (Supplementary Figure S1). Furthermore, CMDDB yields various statistics summaries, including variant density, allele frequency spectrum, base change, ts/tv ratio, variant quality and variant type.

CMDDB provides a web interface that enables quick search for variants, genes or genomic regions to query the variation information, including basic information of variants, allele frequency, genic annotation and frequency comparison to the global populations. Besides, the CMDDB also provides information about the association of the variant with a range of phenotypes, including height, BMI, maternal age and twin pregnancy. Based on the GWAS data, researchers can perform large-scale meta-analyses of the phenotypes of interest. These functionalities were efficiently implemented by a self-developed tool calls CMDDBtools (<https://github.com/ShujiaHuang/cmdbtools>).

Search for variants (Homepage)

CMDDB allows users to learn about genomic variants in the large population study from five perspectives: Gene, Transcript, Variant, Multi-allelic variant and genomic Region that spanning not more than 100 kb. The relevant elements are available in any query result interface so that the user can further view the element information of interest. This means the corresponding transcripts and variants can be found when searching for genes, and vice versa. For example, researcher can search for *BRCA1*, one of the most common breast cancer genes, on the home page and get the gene summary including the coverage plot of the query transcripts or the genomic regions and corresponding variants data comprising of chromosome positions, annotation, allele frequency, etc. (Figure 1). Users can click on a transcript or variant to focus on the corresponding element at a more granular level.

GWAS interface

CMDDB also provides interactive Manhattan plot and GWAS summary statistics based on Chinese population currently for four commonly measured traits: Height, BMI, Age and Twins-pregnancy and more traits in the future. When obtaining query phenotype results, user can select seven *P*-value thresholds to browse the distribution of significant variation associated with the phenotype. In addition, user can focus on any associated gene, variant and region by additional filtering fields (Figure 2).

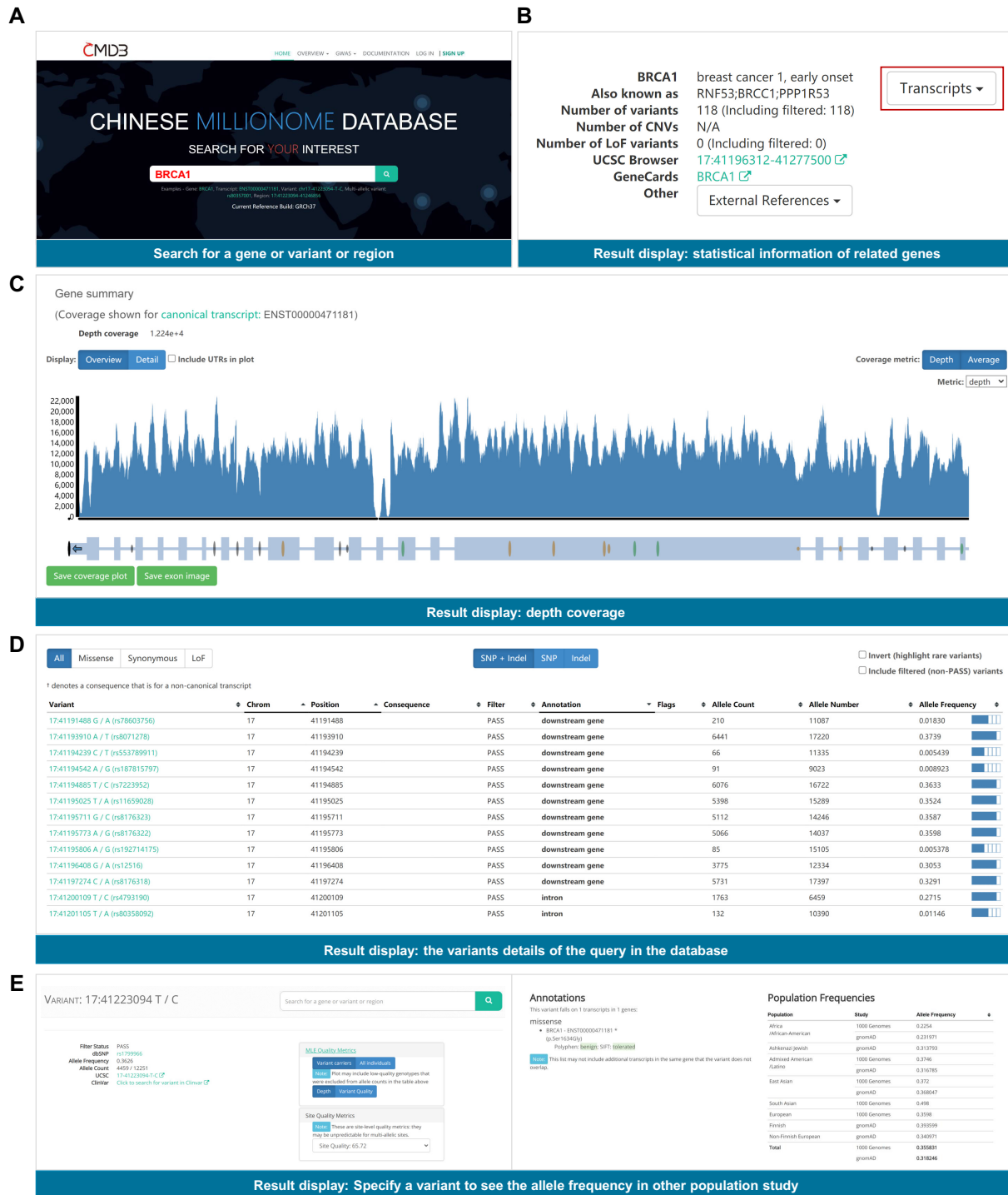


Figure 1. Screenshots of *BRCA1* gene search and search result. (A) Search with *BRCA1* gene as an example, the corresponding transcript, variant, multi-allelic variant and region can all be used to get similar results page. The following is the query results. (B) The gene summary including the number of variants, UCSC browser link. (C) The coverage plot of a transcript. (D) The details of variants queried in the database. (E) Specify a variant to see the allele frequency in other population studies.

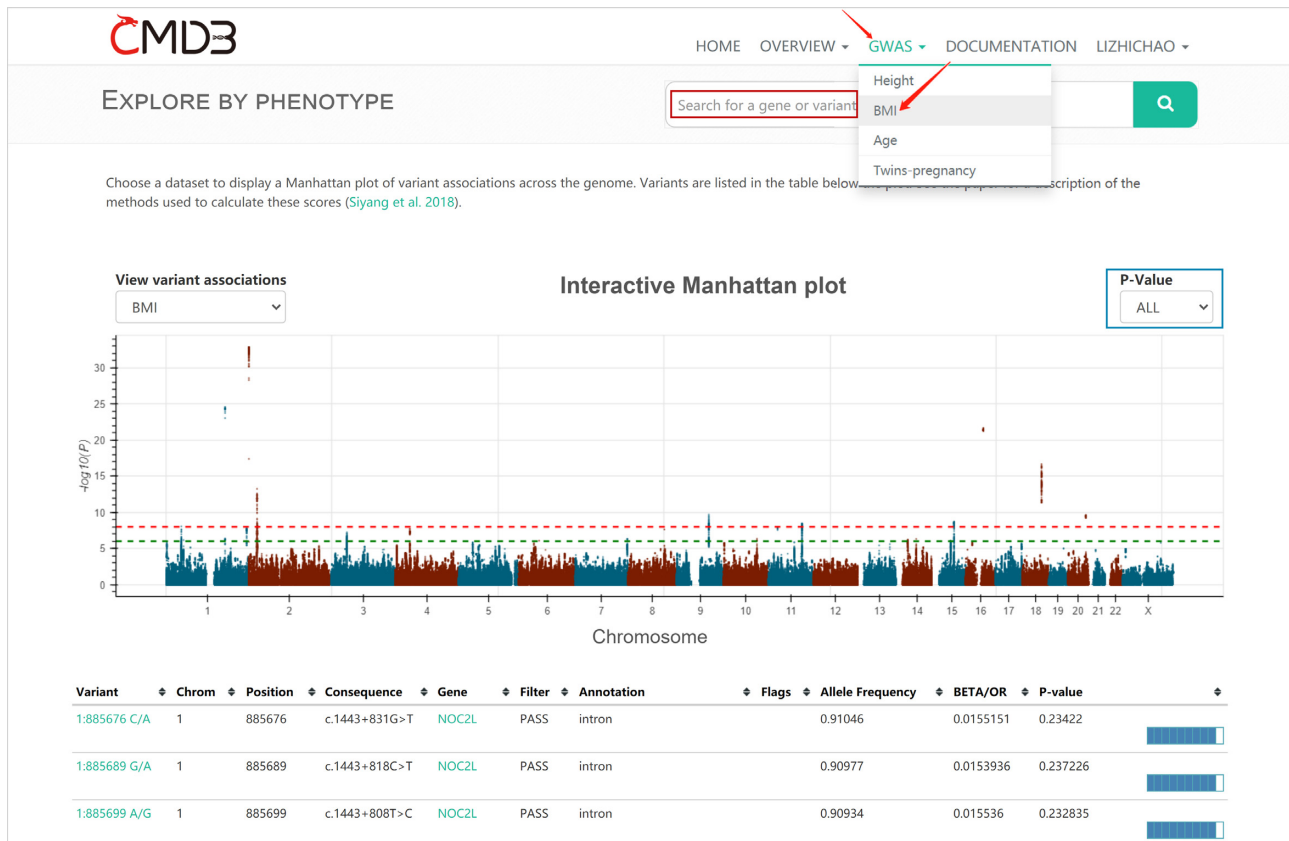


Figure 2. An example of GWAS query results. The associated variant with BMI under all *P*-value thresholds.

API DEVELOPMENT

The CMD3 provides a Genomics API, which is a RESTful API (<https://restfulapi.net/>) that enables researcher to access CMD3 variants data across remote sites via program scripts or command line. The API allows retrieval of CMD3 variant information via variants' position or dbSNP Reference (rs) number. CMD3tools was developed based on the CMD3 Genomics API. It is a Python toolkit that could backup queries for single variant and multiple variants, and annotate the local VCF (Variant Call Format) file with data including allele frequency, coverage information by population level, allele count by population level and filtration status in CMD3. CMD3tools can be easily install via the Python PyPI approach (<https://pypi.org/search/?q=cmd3tools>). The CMD3tools guidance is shown on the DOCUMENTATION page (<http://cmd3.bgi.com/cmd3/apidoc-cmd3tools>) and github repository simultaneously (<https://github.com/ShujiaHuang/cmd3tools>).

DISCUSSION AND FUTURE DIRECTIONS

Many studies have demonstrated that large-scale samples via low-coverage (<1×) sequencing performs good in calling common variants (37), calculating genome-wide polygenic scores (37), calling copy number variants (CNV) (38), even performs better than high coverage sequencing in many aspects when taking into account limited costs (28,37–42). Although sequencing at low depth, the development of the Chinese millionome database (CMD3) has

filled the gap for a high-quality baseline genomic database of Chinese population. The CMD3 database allows researchers to query variants, annotating their local VCF files and obtain several GWAS summary statistics results. Involving more than one hundred of thousands of participants with the broad geographic representation of multi-ethnic origin, CMD3 is currently the largest and most representative Chinese population genome database. We believe that CMD3 will greatly facilitate Chinese population genetic studies and medicine development.

In the future, we plan to improve the database in the following aspects. First, we will update the variants dataset including variant counts and allele frequencies by including additional samples and more comprehensive ethnics, and providing GWAS summary statistics with more phenotypes. Second, we will also add the population frequencies of SV (structure variation), including CNV, to the database since SV plays a very important role in genetic diseases or specific traits. Third, some general population genomics analysis tools including IMPUTE2 (43) and BEAGLE (44) used for imputation, plink (45) used for GWAS will be developed as online applications. Meanwhile, we will continuously improve the CMD3tools to speed up the response time towards a greater amount of user query.

DATA AVAILABILITY

The CMD3tools is available in the GitHub repository (<https://github.com/ShujiaHuang/cmd3tools>).

SUPPLEMENTARY DATA

Supplementary Data are available at NAR Online.

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