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# ETCM v2.0: An update with comprehensive resource and rich annotations for traditional Chinese medicine



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# **KEY WORDS**

Traditional Chinese medicine; Database; Target identification; Network visualization; New drug research and development; Molecular mechanism; **Abstract** Existing traditional Chinese medicine (TCM)-related databases are still insufficient in data standardization, integrity and precision, and need to be updated urgently. Herein, an Encyclopedia of Traditional Chinese Medicine version 2.0 (ETCM v2.0, http://www.tcmip.cn/ETCM2/front/#/) was constructed as the latest curated database hosting 48,442 TCM formulas recorded by ancient Chinese medical books, 9872 Chinese patent drugs, 2079 Chinese medicinal materials and 38,298 ingredients. To facilitate the mechanistic research and new drug discovery, we improved the target identification method based on a two-dimensional ligand similarity search module, which provides the confirmed and/or potential targets of each ingredient, as well as their binding activities. Importantly, five TCM formulas/Chinese patent

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Quality marker; Drug repurposing drugs/herbs/ingredients with the highest Jaccard similarity scores to the submitted drugs are offered in ETCM v2.0, which may be of significance to identify prescriptions/herbs/ingredients with similar clinical efficacy, to summarize the rules of prescription use, and to find alternative drugs for endangered Chinese medicinal materials. Moreover, ETCM v2.0 provides an enhanced JavaScript-based network visualization tool for creating, modifying and exploring multi-scale biological networks. ETCM v2.0 may be a major data warehouse for the quality marker identification of TCMs, the TCM-derived drug discovery and repurposing, and the pharmacological mechanism investigation of TCMs against various human diseases.

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#### 1. Introduction

Traditional Chinese medicine (TCM) has been extensively used in the prevention and treatment of various human diseases, and also offers a great resource for modern drug discovery and development. Many U.S. Food and Drug Administration (FDA)-approved drugs, such as artemisinin from Herba Artemisiae Annuae as a first-line drug for malaria<sup>1,2</sup> and ephedrine form Herba Ephedrae as an anti-asthmatic drug<sup>3</sup>, were derived from TCM. Notably, the clinical efficacy and safety of various TCM formulas, such as Huashi Baidu Granules, Xuanfei Baidu Granules, etc., for the treatment of COVID-19 have also been verified by accumulating high-quality clinical trials.<sup>4–7</sup> Recently, big data and artificial intelligence technologies have driven the rapid development of TCM.<sup>8</sup> To better dissect the pharmacological mechanisms and identify the active ingredients in TCM, we originally established an Encyclopaedia of Traditional Chinese Medicine (ETCM) in 2019<sup>9</sup>, which has been highly recognized among pharmacologists and scholars in TCM researches worldwide. Since then, several TCM-related databases, such as HERB<sup>10</sup>, SuperTCM<sup>11</sup> and HIT  $2.0^{12}$ , have been constructed and provided useful data and tools for TCM-based research and drug discovery. However, they are still insufficient in data standardization, integrity and precision. None of the existing databases provide the quality control information of Chinese patent drugs and herbs which may be one of the most important factors for the effectiveness of TCM, and the similarity evaluation data among various TCM formulas/Chinese patent drugs/herbs/ingredients which may be useful in summarizing the rules of prescription use and finding alternative drugs for endangered Chinese medicinal materials. Therefore, a database with more comprehensive and accurate recording related data and information is in demand.

In the updated ETCM v2.0 (freely accessible at http://www. tcmip.cn/ETCM2/front/#/) as shown in Fig. 1, the original data is largely expanded while a new data field "Traditional Chinese Medicine Formulas" based on ancient Chinese medical books has been added, and a novel method for target identification and prediction has been utilized. Currently, ETCM v2.0 hosts 48,442 TCM formulas recorded by ancient Chinese medical books, 9872 Chinese patent drugs, 2079 Chinese medicinal materials and 38,298 ingredients, 1040 confirmed or potential drug targets, as well as 8045 related diseases. Moreover, ETCM v2.0 also provides various pairwise associations and cross retrievals between different data sections by combing diverse strategies including database mining, reference mining and bioinformatics mining. This new release provides more comprehensive and more efficient TCM information with downloadable and visualized knowledge graphs, which may facilitate the deep mining of implicit knowledge on TCM, and the systematic integration of TCM with modern medicine at both molecular and phenotypic levels (Fig. 1).

#### 2. Data updates and extensions

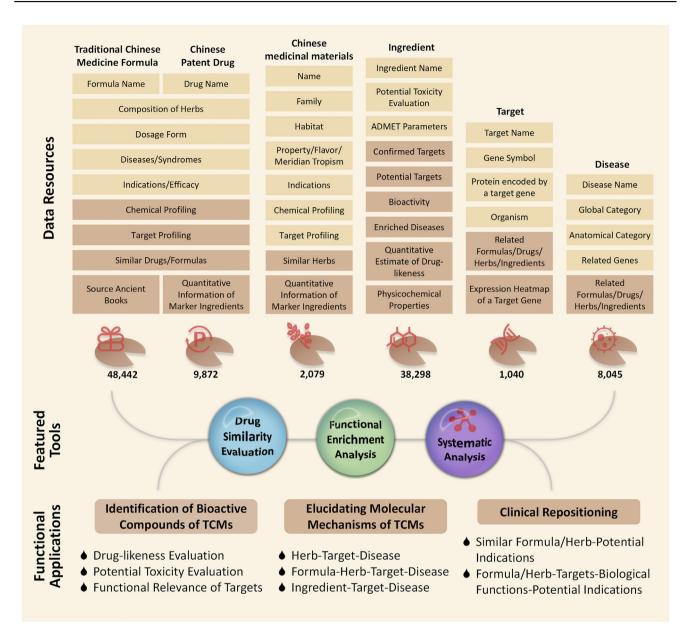
ETCM v2.0 is composed of six data sections, including TCM formulas recorded by ancient Chinese medical books, Chinese patent drugs, Chinese medicinal materials, ingredients, targets and diseases as summarized in Table 1.

#### 2.1. The TCM formula and Chinese patent drug information

TCM formulas were originated from the clinical experience of TCM during the thousands of years. A large number of ancient TCM formulas were recorded in ancient books by different doctors in different dynasties, which may be the source of research and development of new TCM-based drugs. At present, some TCM formulas are still widely used with definite curative effects, obvious characteristics and advantages. To this end, the Chinese governments have promulgated the "first batch of ancient classic famous prescriptions catalogue" (including 100 TCM formulas) and promoted their listing as proprietary TCM formulas. Especially, some of them have been developed into Chinese patent drugs. Since 1985, more than 10,000 Chinese patent drugs have been approved for marketing, and have become the mainstream product in TCM market and one of the three pillar industries of Chinese pharmaceutical industry along with biological drugs and chemical drugs. In this context, a completely new data section was integrated to ETCM v2.0, namely "Traditional Chinese Medicine Formulas". The most comprehensive list of 48,442 TCM formulas (including the first batch of 100 proprietary TCM formulas) and 9872 Chinese patent drugs with manually integrating and normalizing information respectively obtained from ancient Chinese medical books and package insert of drugs are provided. Notably, the TCM formula/Chinese patent drug-related clinical data, such as the corresponding symptoms and syndromes, and clinical efficacy were standardized to obtain accurate query results. Both the chemical profiling and target profiling of each TCM formula/Chinese patent drug, as well as the quantitative information of marker ingredients, the related properties and functional information are also provided.

#### 2.2. The Chinese medicinal materials information

The number of herbs has increased from 403 (ETCM) to 2005 (ETCM v2.0), which includes 548 commonly used herbs recorded



**Figure 1** The schema and objectives of ETCM v2.0. This database includes 48,442 TCM formulas recorded by ancient Chinese medical books, 9872 Chinese patent drugs, 2079 Chinese medicinal materials and 38,298 ingredients. Functionally, ETCM v2.0 may be a major data warehouse for the quality marker identification of TCMs, the TCM-derived drug discovery and repurposing, and the pharmacological mechanism investigation of TCMs against various human diseases.

in the *Chinese Pharmacopoeia* (2020 version) and investigated in the Fourth National Survey on Chinese Materia Medica Resources (http://www.zyzypc.com.cn/). In addition, 44 animal medicines and 30 mineral medicines are also included. The general and drug effectiveness-related information, including the name, type, species, collection time, property, flavor, meridian tropism, indication, specification, medicinal part, classification based on efficacy, references and habitat map of Chinese medicinal materials, are provided. Of note, the quantitative information of marker ingredients of each herb is provided according to the Chinese pharmacopoeia (2020 version), which are necessary for herbal quality control. Moreover, the cross-links of herbs to HERB, HIT2.0 and SymMap databases are also established in herbal detailed information page.

#### 2.3. The ingredient information

The ingredients of herbs, TCM formulas and Chinese patent drugs recorded in ETCM v2.0 were collected manually according to the Pharmacopoeia of the People's Republic of China (2020 version) and other literatures. The number of ingredients has increased from 7274 (ETCM) to 38,298 (ETCM v2.0). For each ingredient, its name, 18 physicochemical properties [molecular formula, molecular weight, volume, density, number of hydrogen bond acceptors (nHA), number of hydrogen bond donors (nHD), number of rotatable bonds (nRot), number of rings (nRing), number of atoms in the biggest ring (MaxRing), number of heteroatoms (nHet), formal charge (fChar), number of rigid bonds (nRig), flexibility, number of stereocenters, topological polar

# Table 1Content statistics of ETCM v2.0.

Data type	Number	Resources
TCM Formulas	48,442	Traditional Chinese Medicine Formulas
Chinese Patent Drugs	9872	China Food and Drug Administration (http://eng.sfda.gov.cn/ WS03/CL0755/)
Chinese Patent Drugs with quantitative information of marker ingredients	865	Pharmacopoeia of the People's Republic of China (2020 version)
Chinese medicinal materials	2079	
Herbs	2005	The Fourth National Survey on Chinese Materia Medica Resources (http://www.zyzypc.com.cn/), Pharmacopoeia of the People's Republic of China (2020 version), Authoritative Chinese Medical Books and Dictionaries
Animal medicine	44	Pharmacopoeia of the People's Republic of China (2020 version)
Mineral medicine	30	Pharmacopoeia of the People's Republic of China (2020 version)
Chinese medicinal materials with quantitative information of marker ingredients	504	Pharmacopoeia of the People's Republic of China (2020 version)
Herbs with referenced targets	990	Identified by D3CARP platform based on BindingDB database (updated on 2021-11-01)
Ingredients	38,298	Pharmacopoeia of the People's Republic of China (2020 version) and other literatures
Ingredients with referenced targets	25,647	Identified by D3CARP platform based on BindingDB database (updated on 2021-11-01)
Ingredients with drug-likeness evaluation	38,265	A quantitative estimate model of drug-likeness reported by Bickerton group [Nat Chem. 2012 Jan 24; 4 $(2)$ :90–8] <sup>14</sup>
Drug target genes	1040	Identified by D3CARP platform based on BindingDB database
Targets with references	1040	(updated on 2021-11-01)
Diseases	8045	MalaCards v5.0, Human Phenotype Ontology (HPO, Released in
Diseases with relevant genes	8038	2018), Online Mendelian Inheritance in Man (OMIM, Released in April 2018), Database of gene-disease associations (DisGeNET v5.0), the portal for rare diseases and orphan drugs (ORPHANET v5.49.0)

surface area (TPSA), the logarithm of aqueous solubility value (logS), the logarithm of the n-octanol/water distribution coefficient (logP), the logarithm of the n-octanol/water distribution coefficients at pH = 7.4 (logD7.4)], 6 medicinal chemistry properties [quantitative estimate of drug-likeness (QED), synthetic accessibility score (SAscore), natural product-likeness score (NPscore), Lipinski Rule, GSK Rule, Golden Triangle], 22 ADME (absorption, distribution, metabolism, excretion) properties [Caco-2 permeability, MDCK permeability, Pgp-inhibitor, Pgp-substrate, human intestinal absorption (HIA), 20% oral bioavailability (F20%), plasma protein binding (PPB), volume distribution (VD), penetration blood brain barrier penetration (BBB), the fraction unbound in plasms (Fu), CYP 1A2 inhibitor, CYP 2C19 inhibitor, CYP 2C9 inhibitor, CYP 2D6 inhibitor, CYP 3A4 inhibitor, CYP 1A2 substrate, CYP 2C19 substrate, CYP 2C9 substrate, CYP 2D6 substrate, CYP 3A4 substrate, the clearance of a drug (CL), T1/2], 32 toxicity endpoints [FAF-drugs 4 rule, NonBiodegradable rule, Pfizer rule, SR-MMP, SureChEMBL rule, FDA maximum (recommended) daily dose (FDAMDD), IGC50, LC50FM, LC50DM, NR-AR, NR-AR-LBD, NR-Aromatase, NR-ER, NR-ER-LBD, skin sensitization rule, skin sensitization, acute toxicity rule, rat oral acute toxicity, hERG blockers, the human hepatotoxicity (H-HT), drug-induced liver injury (DILI), eye corrosion/irritation, respiratory toxicity, AMES toxicity, genotoxic carcinogenicity rule, nongenotoxic carcinogenicity rule, carcinogenicity, antioxidant response element (SR-ARE), ATPase family AAA domaincontaining protein 5 (SR-ATAD5), SR-p53] calculated by the robust and accurate models in ADMETlab 2.0<sup>13</sup> (https:// admetmesh.scbdd.com/) are provided. Especially, the druglikeness based on desirability (QED)<sup>14–16</sup> and the maximum recommended daily dose by FDA (FDAMDD)<sup>17</sup> of herbal ingredients are provided to evaluate the potentials and the safety as drug candidates, respectively. Among them, the mean QED is 0.67 for the attractive compounds and 0.49 for the unattractive compounds. Thus, we classified all 38,298 ingredients collected in ETCM v2.0 into three groups according to their QED scores, excellent (QED>0.67), medium (0.49  $\leq$  QED  $\leq$  0.67) and poor (QED<0.49). FDAMDD provides an estimate of the toxic dose threshold of chemicals in humans. The output value of FDAMDD is the probability of being toxic, within the range of 0–1. Our ingredients are divided into excellent (0  $\leq$  FDAMDD  $\leq$  0.3), medium (0.3<FDAMDD  $\leq$  0.7) and poor (FDAMDD>0.7).

#### 2.4. The target information

ETCM v2.0 provides the detailed information on the confirmed and/or potential targets for ingredients, herbs, Chinese patent drugs and TCM formulas to facilitate the mechanistic study of TCM and the new drug discovery. We improved the target identification method in ETCM v2.0 based on a two-dimensional ligand similarity search module in our indoor D3CARP platform (the article of D3CARP will be submitted and published in the near future) and the BindingDB database<sup>18</sup> (updated on 2021-11-01) (Fig. 2). Specifically, the platform ligand database is derived from the BindingDB database, which is a public, web-accessible database of measured binding affinities and contains approximately one million small molecules annotated with more than 2.5 million binding data and related literature information<sup>18</sup>. If the calculated similarity value is 1.0, the targets of the reference compound are considered as the confirmed targets for the submitted ingredient. If the calculated similarity value is between 0.8 and 1.0, the targets of the reference compound are considered as potential targets of the submitted ingredient. Notably, the binding activities between each ingredient and its targets are also provided to facilitate the identification of bioactive compounds and the investigation of pharmacological mechanisms of TCMs. Comparing with the existing TCM target prediction tools mainly based on manual retrieval or intelligent retrieval  $^{10,12,19-23}$ , our method may obtain more sufficient and more reliable target information under the appropriate similarity threshold. Moreover, the biological functions and participated pathways of the confirmed and/or potential targets of ingredients/herbs/Chinese patent drugs/TCM formulas are also provided according to the enrichment analysis based on the Gene Ontology<sup>24</sup> and Reactome pathway database<sup>25</sup> using in house python scripts with hypergeometric test.

#### 2.5. The disease information

The number of human diseases has increased from 2266 (ETCM) to 8045 (ETCM v2.0). The detailed information of each disease, including disease name, global category, anatomical category, symptoms, disease-related genes and hallmark gene set annotations, collected from the human disease database (MalaCards v5.0)<sup>26</sup>, Human Phenotype Ontology (HPO, Released in 2018)<sup>27</sup>, Online Mendelian Inheritance in Man (OMIM, Released in April 2018)<sup>28</sup>, Database of gene-disease associations (DisGeNET v5.0)<sup>29</sup>, the portal for rare diseases and orphan drugs (ORPHA-NET v5.49.0)<sup>30</sup>. The inconsistent gene or protein IDs of different resources were manually inspected and converted into Official Gene Symbols and UniProt Accession Numbers. The diseases are linked to ingredients, herbs, Chinese patent drugs and TCM formulas according to the enrichment analysis based on the diseasecausing genes and the confirm/potential drug target genes using in house python scripts with hypergeometric test.

# 3. Direct associations & indirect associations among various data fields

ETCM v2.0 provides comprehensive pairwise associations and cross retrievals between different data sections by combing diverse strategies including database mining, reference mining and bioinformatics mining (Fig. 3). We manually collected a total of 14 direct associations of "TCM Formula/Chinese Patent Drug-Herb", "TCM Formula/Chinese Patent Drug-Disease", "TCM Formula/Chinese Patent Drug-Syndrome", "TCM Formula/Chinese Patent Drug-Symptom", "TCM Formula-Ancient Book", "Chinese Patent Drug/Herb-Quality Control Ingredient", "Herb-Ingredient", "Ingredient-Referenced Target" and "Ingredient-Standard" from ancient Chinese medical books, package insert of drugs and Chinese Pharmacopoeia (2020 version). Among them, the modern diseases, TCM syndromes and clinical symptoms associated with TCM formulas, Chinese patent drugs and herbs are rigorously standardized by clinical expert consensus and subsequent manual verification. The direct associations for "Ingredient-Referenced Target" were identified based on a twodimensional ligand similarity search module in our indoor D3CARP platform and the BindingDB database<sup>18</sup>.

In addition to the above direct associations involving adjacent characteristic parameters, there are also five indirect associations involving non-adjacent parameters, such as "TCM Formula/Chinese Patent Drug-Ingredient" and "TCM Formula/Chinese Patent Drug/Herb-Referenced Target". The indirect associations between TCM formula/Chinese patent drugs and ingredients were obtained using herbs as the middle parameters. Based on the Ingredient-Referenced Target relationship, the TCM formulas/Chinese patent drugs/Herbs were connected to the referenced targets.

#### 4. Drug similarity evaluation

The Jaccard similarity scores among different TCM formulas, Chinese patent drugs and herbs calculated based on their herb compositions, chemical and target profilings are provided in the corresponding sections of ETCM v2.0. In each detailed information page, five TCM formulas/Chinese patent drugs/herbs with the highest similarity to the submitted TCM formula/Chinese patent drug/herb are displayed and also can be linked to their respective detailed information pages (Fig. 4). These similarity evaluation data may be of significance to identify prescriptions/herbs with similar clinical efficacy, to summarize the rules of prescription use, and to find alternative herbs for endangered Chinese medicinal materials.

#### 5. Improved browsing and inquiry functions

ETCM v2.0 not only includes detailed medicinal properties of TCM formulas, Chinese patent drugs, herbs and ingredients, but also provides potential links between TCM with target genes and modern diseases to facilitate TCM related basic researches, clinical applications and drug development. It offers the browse and search pages for users to navigate each data section, and provides the examples and the types of searchable keywords in or below the search menu.

For the novel data section "Traditional Chinese Medicine Formulas" added in ETCM v2.0, we provide additional browsing and searching pages. All 48,442 TCM formulas are classified according to their dosage forms (such as powder preparation, decoction, pill preparation, etc.) and their source of ancient Chinese medical books (such as "ShenJiZongLu", "TaiPing-ShengHuiFang", "PuJiFang", etc.), which are presented in the browse page of the "Traditional Chinese Medicine Formulas" section. Users can view a full list of all TCM formulas belonging to each category by clicking on each above mentioned category. Detailed information of each TCM formula can be retrieved by clicking on its Chinese or Pinyin name, including dosage form, herb-chemical ingredient-target profiling, indications, major syndromes and main symptoms treated by the formula, the source ancient books of TCM, etc. Users can link to the information pages of the herbs, chemical ingredients and targets by clicking the corresponding name in the TCM formula information page. It is worth to note that the TCM formula indication information is described according to the records in the ancient books of TCM, these indications are different from modern diseases, therefore we tried to use genes related to both TCM ingredients and modern diseases to build the links between TCM formula indications and modern diseases. Similarly, TCM formulas collected in the ETCM

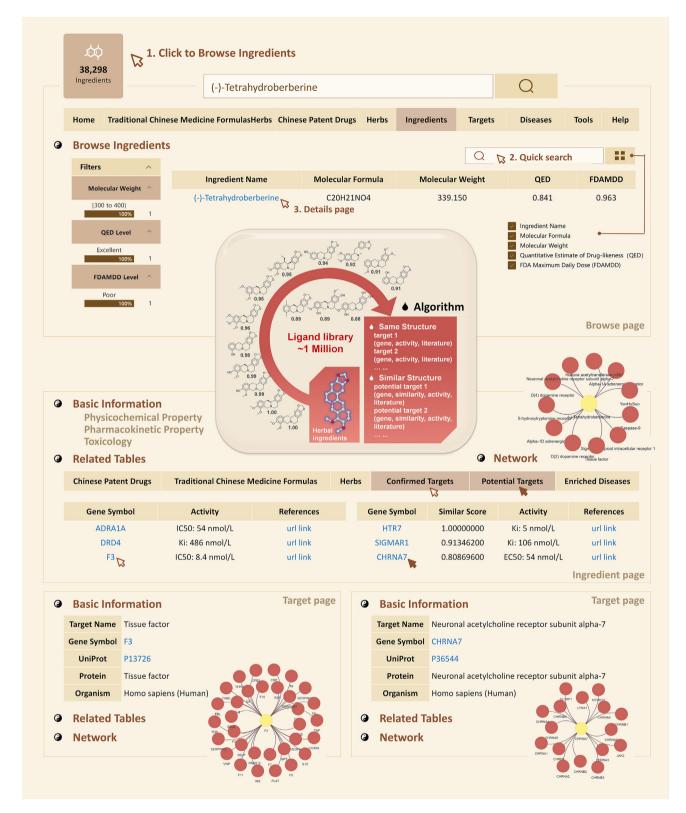


Figure 2 Pipeline of ETCM v2.0 target identification and prediction, and detailed information of target genes of a certain ingredient. To facilitate the mechanistic research and new drug discovery, the target identification method of ETCM v2.0 was improved based on a twodimensional ligand similarity search module, which provides the confirmed and/or potential targets of each ingredient, as well as their binding activities.

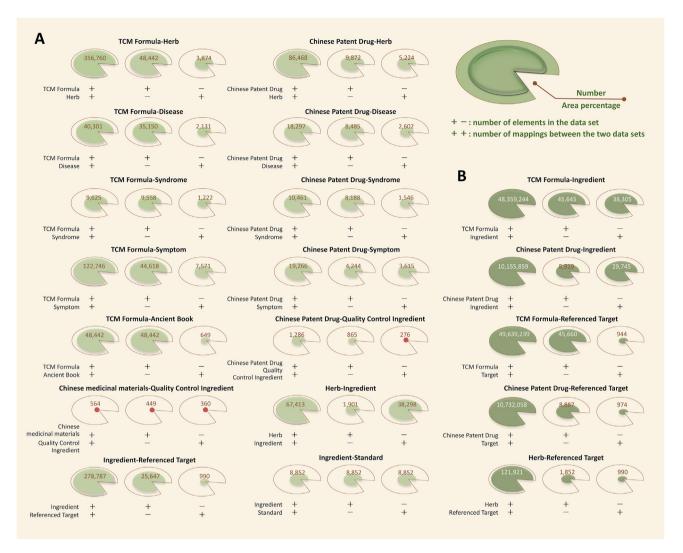


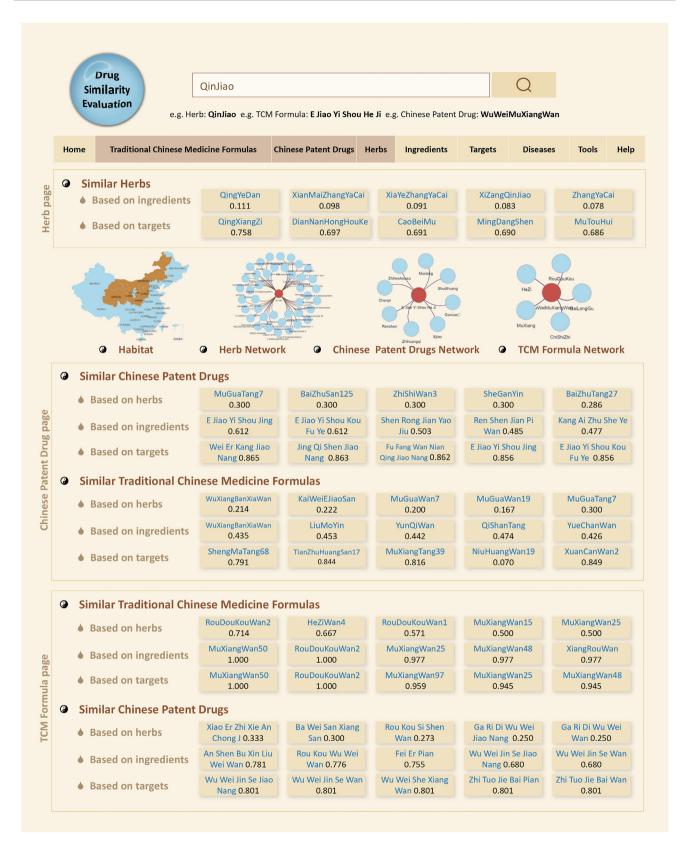
Figure 3 The number of curated TCM formulas, Chinese patent drugs, herbs, ingredients, targets and diseases, and their associations shown as pie charts (A) Includes direct associations of "TCM Formula/Chinese Patent Drug-Herb", "TCM Formula/Chinese Patent Drug-Disease", "TCM Formula/Chinese Patent Drug-Syndrome", "TCM Formula/Chinese Patent Drug-Symptom", "TCM Formula-Ancient Book", "Chinese Patent Drug/Herb-Quality Control Ingredient", "Herb-Ingredient", "Ingredient-Referenced Target" and "Ingredient-Standard" associations (B) Includes indirect associations of "TCM Formula/Chinese Patent Drug-Ingredient", "TCM Formula/Chinese Patent Drug/Herb-Referenced Target".

v2.0 database are also classified based on the corresponding TCM syndromes, such as blood deficiency, heat syndrome, etc.

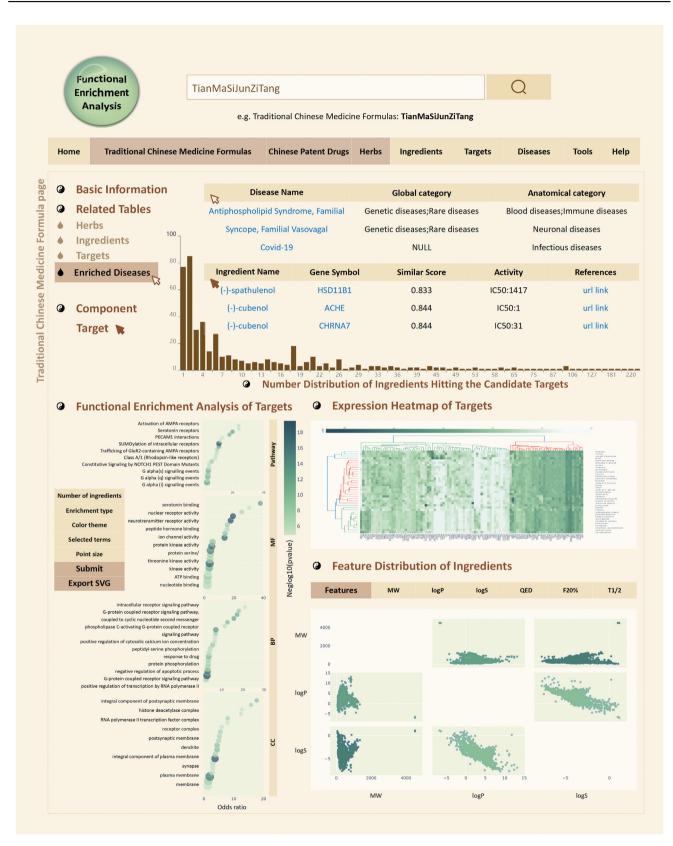
To facilitate the understanding of TCM functions from the modern science point of view, we improved our target identification model for ingredients of the collected herbs, TCM formulas and Chinese patent drugs according to the two-dimensional ligand similarity search module between TCM ingredients and ligands derived from the BindingDB database, and considered the target genes of ligands as the confirmed and/or potential targets of TCM ingredients based on the calculated similarity values. Besides the information of the target profiling, the binding activities between each herbal ingredient and its targets are also provided (Fig. 5). Moreover, the collective targets of all ingredients of a herb, a TCM formula or a Chinese patent drug are indicated as the confirmed and/ or potential targets of the herb, TCM formula or Chinese patent drug. Diseases significantly associated with those target genes in the enrichment analysis are also shown as diseases that may be cured by the herbs, TCM formulas or Chinese patent drugs. Gene Ontology terms or pathways enriched by genes targeted by certain ingredients, herbs, TCM formulas, Chinese patent drugs or associated with certain diseases, are also included in ETCM v2.0 (Fig. 5).

# 6. Enhanced network visualization capabilities

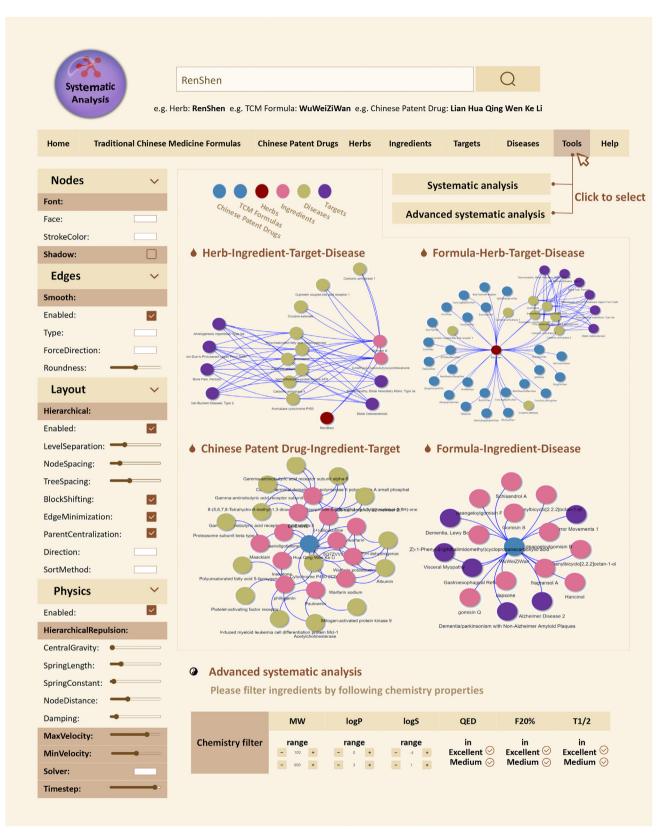
To better illustrate the relationships among TCM formulas, Chinese patent drugs, herbs, ingredients, target genes, gene-involved pathways and diseases, ETCM v2.0 provides an enhanced JavaScript-based network visualization tool for creating, modifying, and exploring multi-scale biological networks, which may be the characteristic function of our database and not available in other databases of the same type, such as HERB<sup>10</sup>, SuperTCM<sup>11</sup> and HIT 2.0<sup>12</sup>, YaTCM<sup>31</sup>, TCMID 2.0<sup>19</sup> and TCMSP<sup>32</sup>. Users are allowed to choose to display relationships among TCM formulas, Chinese patent drugs, herbs, ingredients, targets, disease-related genes, and diseases according to their research aims, as well as design, add, delete, shape, and edit the details of network nodes and edges as they like (Fig. 6). The gene-gene interaction

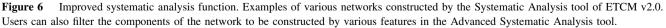


**Figure 4** Drug similarity evaluation results in each detailed information page. Five TCM formulas/Chinese patent drugs/herbs with the highest similarity to the submitted TCM formula/Chinese patent drug/herb are displayed and also can be linked to their respective detailed information pages.



**Figure 5** Improved biological relevance mining functions. In the detailed information page, the target profiling of each herb, Chinese patent drug and TCM formula, and the corresponding enriched diseases and biological functions are provided. In addition, the expression heatmap of targets and feature distribution of ingredients are also displayed for each herb, Chinese patent drug and TCM formula.





data were collected from five existing molecular interaction databases, including STRING (https://cn.string-db.org/, version 11.5)<sup>33</sup>, Reactome (https://reactome.org/, version 81)<sup>34</sup>, Human Protein Reference Database (HPRD, http://www.hprd.org/, Release 9)<sup>35</sup>, IntAct molecular interaction database (https://www. ebi.ac.uk/intact, updated in August 2021)<sup>36</sup> and Database of Interacting Proteins (DIP, https://dip.doe-mbi.ucla.edu/dip/, updated in Feb 13, 2017)<sup>37</sup>. Links among TCM formulas, Chinese patent drugs, herbs, pathways and diseases are established by the ingredients and the confirmed/potential targets of each ingredient. The dynamic layout of the network can be feasibly customized and the final network can be exported in SVG and JPG formats.

# 7. Discussion

With a long history of widespread clinical applications, TCM has made important contributions to the prosperity of human beings, especially in East Asia. In recent years, TCM has also been frequently used in Western countries. On the basis of the systematic associations among TCM formulas, Chinese patent drugs, herbs, ingredients, targets and diseases, TCM gives specific prescriptions to each individual patient according to their disease conditions, which may be consistent with the goals of precision medicine. Although a growing number of TCM databases have been established with various data sources and similar functions, they may be lack of standardization and comprehensiveness. Herein, ETCM v2.0 is the latest curated database focusing on comprehensive resource and rich annotations for the TCM-derived drug discovery and repurposing, and the investigation of underlying mechanisms of TCMs against various human diseases (Table 2).

Using ETCM v2.0, researchers and drug developers can view primary data as well as the data- and algorithm-driven mapping results among TCM formulas/Chinese patent drugs, herbs, ingredients, targets and diseases, allowing easy identification of new potentially effective therapeutics and discovery of novel drug combination with synergistic effects. In addition, ETCM v2.0 offers the ingredients of Chinese herbs and prescriptions, and the evaluation results on their drug-likeness and safety, as well as the confirmed and/or potential target lists and the corresponding biological function enrichment analysis, which may be helpful in discovering the novel drug candidates.

Polypharmacological prediction of known TCM prescriptions by the similarity comparison based on herbal compositions, chemical and target profiling is very useful to find new therapeutic applications of existing TCM prescriptions and to discover multitarget drugs with improved efficacies. ETCM v2.0 provides highly similar TCM formulas/Chinese patent drugs/herbs/ingredients and the corresponding similar scores which may help screening TCMs that connect to targets of known drugs and discovering their new therapeutic effects.

Accumulating studies have revealed that TCM network pharmacology may play a crucial role in elucidating the network-based biological basis of complex diseases, TCM formula and herb therapeutics<sup>38,39</sup>, and the first international standard of network pharmacology—Network Pharmacology Evaluation Method Guidance has been issued<sup>40</sup>. On this context, ETCM v2.0 also provides the confirmed and/or potential drug targets, the diseaserelated genes, and the interactions among them, as well as userfriendly network visualization, which all may be of great significance to promote the exploration of the "multi-component, multitarget and multi-pathway" integrated therapeutic paradigm of TCM medicinal prescriptions.

Total No.	Chinese Patent Drugs Total No. of drugs No. with mark		. <u>E</u>	erage . of	ps B	Ingredients Total No No. ing	. of redients		Targets Total No.	No. of referenced		Diseases Total No. of No. disease-
ingredients	s		materials with ingredients mark ingredients per herb		referenced targets		with referenced standards target pairs	referenced target pairs		targets		gene pairs
865		2079	504	35	066	38,298 6417	6417	278,787	1040	1040	8045	22,122,972
I		1250	I	I	I	1237	I	10,031	2208	2208	Ι	1
I		9191	I	I	I	61,965	I	I	15,179	I	32,529	I
I		6516	I	I	I	55,772	I	I	543	1	8634	T
I		7263	I	16	291	49,258	I	4815	12,933	1241	28,212	I
478		403	263	I	I	7274	I	I	2266	1	4323	I
I		6220	I	I	I	47,696	I	I	18,697	1	Ι	1
I		8159	I	2	I	43,413	I	I	17,521	1	4633	1
I		499	I	I	1	29,384	1	I	3311	1	837	1

Over the past three years since ETCM was released, our database has attracted an increasing attention of pharmacologists and scholars in the research field of TCM, and function as an important connector to link TCM with modern researches<sup>41,42</sup>. With more and diverse data becoming available, we updated our ETCM database to ETCM v2.0 to provide a more comprehensive and integrated resource of TCM big data for identifying bioactive constituents and quality markers of TCMs, promoting new drug research and development, accelerating the drug repurposing, and facilitating the mechanistic investigation and clinical application of TCMs. With a convenient web interface, users can browse, search, visualize and download key information from ETCM v2.0. In the future, we plan to continuously improve this database with new types of data fields and analysis toolkits as much as possible.

All data of ETCM is available at http://www.tcmip.cn/ETCM2/ front/#/.

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#### Author contributions

Yanqiong Zhang participated in the database design, data preparation and validation, and prepared the manuscript. Xin Li and Yulong Shi performed data collection and processing, and developed the target prediction algorithm, respectively. Haiyu Xu participated in the study design and coordination, and offered material support for the obtained funding and supervised the study. The other authors performed parts of the database construction. All authors reviewed and approved the final manuscript.

#### **Conflicts of interest**

The authors declare that there is no conflict of interests regarding the publication of this paper.

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