### **RESEARCH ARTICLE**

# Exploring the treatment of COVID-19 with Yinqiao powder based on network pharmacology

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Excellent Doctoral Dissertation Incubation Grant of First Clinical School of Guangzhou University of Chinese Medicine, Grant/Award Number: YB201902; Excellent Doctoral Dissertation Incubation Grant of Guangzhou University of Chinese Medicine, Grant/Award Number: GZYXB2020-18; International Program for Postgraduates, Guangzhou University of Chinese Medicine, Grant/Award Number: GZYXB[2019]114 Coronavirus disease 2019 (COVID-19) is caused by severe acute respiratory syndrome coronavirus 2 (SARS-CoV-2). In China, Yingiao powder is widely used to prevent and treat COVID-19 patients with Weifen syndrome. In this study, the screening and verification of active ingredients, target selection and DisGeNET scoring, drug-ingredient-gene network construction, protein-protein interaction network construction, molecular docking and surface plasmon resonance (SPR) analysis, gene ontology (GO) functional analysis, gene tissue analysis, and kyoto encyclopedia of genes and genomes (KEGG) pathway analysis were used to explore the active ingredients, targets, and potential mechanisms of Yingiao powder in the treatment of COVID-19. We also predicted the therapeutic effect of Yingiao powder using TCM anti-COVID-19 (TCMATCOV). Yinqiao powder has a certain therapeutic effect on COVID-19, with an intervention score of 20.16. Hesperetin, eriodictyol, luteolin, guercetin, and naringenin were the potentially effective active ingredients against COVID-19. The hub-proteins were interleukin-6 (IL-6), mitogen-activated protein kinase 3 (MAPK3), tumor necrosis factor (TNF), and tumor protein P53 (TP53). The potential mechanisms of Yingiao powder in the treatment of COVID-19 are the TNF signaling pathway, T-cell receptor signaling pathway, Toll-like receptor signaling pathway, and MAPK signaling pathway. This study provides a new perspective for discovering potential drugs and mechanisms of COVID-19.

#### KEYWORDS

COVID-19, molecular docking, network pharmacology, signaling pathway, Yinqiao powder

Haixiong Lin and Xiaotong Wang contributed equally to this work.

# 1 | INTRODUCTION

In December 2019, several patients with severe acute respiratory syndrome, which is now called COVID-19 by the World Health Organization, were found in Wuhan, China (Sun, Lu, Xu, Sun, & Pan, 2020). The disease is highly transmissible, pathogenic, and recurrent, and large outbreaks have occurred in many countries and regions around the world (Arshad, Baloch, Ahmed, Arshad, & Igbal, 2020). On December 18, 2020, China reported a total of more than 95,491 cases, and the total number of cases worldwide has exceeded 50 million, affecting more than 200 countries and regions. Whole-genome sequencing and phylogenetic analysis indicate that COVID-19 is caused by SARS-CoV-2, which is related to the phylogeny of the SARS bat virus, suggesting that bats may be the main host. The main source and the intermediate source of the transfer to humans are unclear, but the rapid transfer from person to person has been widely confirmed (Shereen, Khan, Kazmi, Bashir, & Siddigue, 2020). To make matters worse, specific antiviral drugs or vaccines for COVID-19 are still undergoing clinical trials.

After more than 2,000 years of development, traditional Chinese medicine (TCM) has formed a comprehensive and unique system from disease diagnosis to prognosis, which plays an important role in the prevention and treatment of human infectious diseases (Sun, Sun, Yan, Li, & Xin, 2020). In addition to strict prevention and control measures, many provinces in China have issued TCM prevention and treatment plans for COVID-19 in response to the outbreak of COVID-19, which has achieved remarkable results. Big data mining analysis found that Yingiao powder was the basic formulation for the Weifen syndrome of COVID-19 (Fan et al., 2020). Pharmacological studies have also shown that Yingiao powder has an antitussive and expectorant effect, improves lung function, alleviates acute lung injury, alleviates pulmonary fibrosis, enhances the antiviral immune response, and alleviates the adverse effects of modern drugs (Rothan & Byrareddy, 2020). In fact, the active ingredients of Yingiao powder are complicated. Some active ingredients found in Yingiao powder by high-performance liquid chromatography analysis may have anti-COVID-19 effects, such as rutin and hesperidin (Shu et al., 2012). Rehman, AlAjmi, and Hussain (2020) and Liang et al. (2020) found that the binding affinity of rutin for the main protease (3CL<sup>pro</sup>) of SARS-CoV-2 was much higher than that of chloroquine, hydroxychloroquine, and remdesivir, and it may inhibit COVID-19 by downregulating IL-6. Balmeh et al. found that hesperidin has an inhibitory effect on human angiotensin-converting enzyme 2 (ACE2), TMPRSS2, GRP78, and AT1R receptors and may have the ability to treat COVID-19 infection (Balmeh, Mahmoudi, Mohammadi, & Karabedianhajiabadi, 2020). Although some biologically active substances and their molecular mechanisms for the treatment of COVID-19 have been under investigation, there is a lack of in-depth exploration of Yingiao powder in the treatment of COVID-19.

Network pharmacology is an emerging discipline. Through the "disease-gene-protein-drug" interaction, the effect of drugs on disease can be systematically and comprehensively observed, thereby revealing the complex relationship between Chinese medicine and disease (Lin et al., 2019). This research method shows integrity and systematic characteristics, which are consistent with the overall theory of Chinese medicine (Li & Zhang, 2013). In previous studies, network pharmacology has been successfully used to reveal the potential active ingredients, targets, and mechanisms of Chinese medicine in disease treatment, such as the Maxing Shigan Decoction (Luo et al., 2020) and the Huashi Baidu Formula for COVID-19 (Xun, Jialei, Shaoju, & Bin, 2020).

In this study, we used absorption, distribution, metabolism, and excretion (ADME) information to screen the potential active ingredients and targets of Yinqiao powder for COVID-19 in the TCMSP database, verified the active ingredients with high-resolution liquid chromatography-mass spectrometry (LC-MS), and predicted the efficacy of Yinqiao powder using TCMATCOV. The next step was the use of the disease-association score of the DisGeNET database to screen the co-genes of COVID-19 and Yingiao powder. Then, we used the STRING database to perform protein-protein interaction (PPI) and topological analyses, performed molecular docking of the identified hub-proteins with their corresponding active ingredients to distinguish the binding activity and site, and used surface plasmon resonance (SPR) analysis to evaluate the affinity. Finally, we performed GO functional, tissue location, and KEGG analyses to identify the mechanism of Yingiao powder in the treatment of COVID-19, which is shown in Figure 1. We expect that the results will enhance our understanding of the effective, potential active ingredients of Yingiao powder for COVID-19 and reveal the biological basis of pharmaceutically acceptable targets, thereby promoting the development of effective COVID-19 therapeutic drugs.

### 2 | MATERIALS AND METHODS

### 2.1 | Acquisition of active ingredients

The TCMSP database (http://lsp.nwu.edu.cn/, Version 2.3) covers 499 kinds of Chinese medicines registered in the Chinese Pharmacopoeia and provides ADME information on the active ingredients of common Chinese medicines (Ru et al., 2014). Totally, 176 ingredients of Yingiao powder were obtained from the TCMSP database, and the potential active ingredients were further screened according to ADME. Oral bioavailability (OB) refers to the relative amount of the drug taken from the liver to the blood circulation after oral drug absorption through the gastrointestinal tract. It is an objective indicator for evaluating drug absorption and affects the effectiveness of clinical drug trials (Xu et al., 2012). The TCMSP database is based on a dataset composed of 805 different drugs or drug-like molecules. The internal model of the OBioavail 1.1 algorithm was used to calculate the OB value, and ingredients with OB ≥ 70% were screened as potential candidate compounds (Sietsema, 1989). In particular, if an active ingredient was present in two or more different drugs for Yinqiao powder, the active ingredient only needed to have an oral availability of OB ≥ 35%. Drug-likeness (DL) reflects the pharmacokinetic characteristics of compounds in humans. The TCMSP database

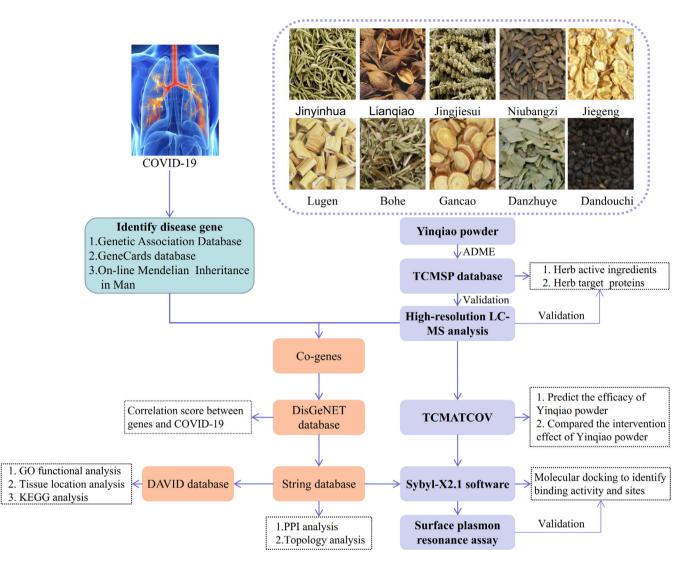


FIGURE 1 Flow chart of this study [Colour figure can be viewed at wileyonlinelibrary.com]

uses the Tanimoto parameters to calculate the DL value, which helps to screen out the highly effective active drug ingredients and improve the hit rate of candidate drug molecules (Yongye & Medina-Franco, 2013). We selected DL  $\geq$  0.18 to screen potential active ingredients and downloaded their structure in the mol2 format.

### 2.2 | High-resolution LC-MS analysis

To verify the active ingredients screened above, LC-MS technology was used to analyze the Yinqiao powder. The decocting program of Yinqiao powder adopts the best strategy screened by the previous orthogonal experiment (Shu et al., 2012). In short, according to the records of *Systematized Identification of Warm (Pathogen) Diseases*, we chose *Forsythiae fructus* (Lianqiao, 30 g), *Lonicera japonica* (Jinyinhua, 30 g), *Platycodonis radix (Jiegeng, 18 g), Lophatheri herba* (Danzhuye, 12 g), *Glycyrrhizae radix et rhizoma* (Gancao, 15 g), *Sojae semen praeparatum* (Dandouchi, 15 g), Great Burdock Achene (Niubangzi, 18 g), and reed rhizome (Lugen, 30 g, purchased from the First

Affiliated Hospital of Guangzhou University of Chinese Medicine), then added 12x water, soaked for 30 min, decocted for 10 min, added Schizonepetae herba (Jingjiesui, 12 g) and Menthae haplocalycis herba (Bohe, 18 g), and decocted for 5 min. The mixture was filtered, and  $200 \ \mu$ l of the filtrate was mixed with 1 ml of 80% methanol liquid (methanol:water = 8:2); this mixture was vortexed to mix evenly and centrifuged for 10 min at 4°C at 20,000 rpm. Extracts were analyzed by high-resolution LC-MS (Q-Exactive, Thermo Scientific<sup>™</sup> Orbitrap Fusion<sup>™</sup>). The specific protocol was similar to that in previous studies with slight modifications (Fagbohun et al., 2020). Briefly, the chromatographic column was an RP C18 column of size 150 mm  $\times$  2.1 mm, 1.8  $\mu m.$  The mobile phase consisted of solvent A composed of 0.1% (v/v) formic acid in water and B composed of 0.1% (v/v) formic acid in acetonitrile. The separation started with 98% of eluent A, dropping linearly to 5% within 20 min. The retention time of the drug was 5 min, and after 1 min, it increased again to 98% within 4 min. The total run time was 30 min, the flow rate was 0.3 ml/min, the injection volume was 5  $\mu$ l, and the column temperature was maintained at 35°C. The LC-MS detection and analysis were conducted in full mass spectrometry-selected ion monitoring mode followed by data-dependent  $MS_2$  (dd- $MS_2$ ), which was equipped with positive and negative polarity switching scanning from m/z 150.0 to 2,000. The capillary temperature was  $300^{\circ}$ C, the sheath flow was 40 arb, the spray voltage was 3,800 V, and the auxiliary temperature was  $350^{\circ}$ C. The overall mass resolution for MS was set to 70,000 and the mass resolution for dd- $MS_2$  was set to 17,500. The detailed analysis method is shown in Supplementary Material 1. The data were matched with the mzCloud (https://www.mzcloud.org/), mzVault (https://mytracefinder.com/tag/mzvault/), and MassList (www.maldimsi.org/mass) databases.

# 2.3 | Acquisition of protein targets of active ingredients

The TCMSP database contains information on 3,311 protein targets, and the relationship between these protein targets and drugs is obtained using the SysDT prediction algorithm (Zhang et al., 2019). A total of 190 protein targets of the verified potentially active ingredients was obtained and downloaded from the TCMSP database. At the same time, published articles were searched to identify the potential protein targets of the active ingredients.

The UniProt database contains three subdatabases: Swiss-Port, PRI-PSD, and TrEMBL, and is the most comprehensive protein database that contains information (Bateman et al., 2019). The UniProt database (http://www.uniprot.org/uniprot/, updated on June 22, 2017) was used to retrieve the protein ID and gene name of the potential active ingredient and was limited to *Homo sapiens*, thereby obtaining the gene of the potential active ingredient. Then, the structure of the corresponding protein was downloaded from the PDB database (http://www.rcsb.org/) in the PDB format.

### 2.4 | Screening of COVID-19-related gene targets

The Genetic Association Database (GAD, https://geneticassociationdb. nih.gov/) collects, standardizes, and archives research data on human genetic associations, making it easy for scientific access (Becker, Barnes, Bright, & Wang, 2004). The GeneCards database (http://www. genecards.org/) integrates gene-centric data from approximately 150 data sources, including genome, transcriptome, proteome, genetics, as well as clinical and functional information (Rebhan, Chalifa-Caspi, Prilusky, & Lancet, 1997). Online Mendelian Inheritance in Man (OMIM, http://www.ncbi.nlm.nih.gov/omim) is a comprehensive database of human genes and genetic traits. This database focuses on the relationship between phenotype and genotype and contains information about all Mendelian inherited diseases and more than 12,000 human genes (Schorderet, 1991). We used the keywords "coronavirus" and "SARScoronavirus" in the GAD, GeneCards, and OMIM databases to search for the COVID-19-related genes, and then removed duplicate genes and false positive genes. The gene targets of the disease were matched with the gene targets of Yinqiao powder to obtain co-genes, which were used as the potential gene targets of the active ingredient of Yinqiao powder to treat COVID-19.

# 2.5 | Correlation score between gene targets and COVID-19

The DisGeNET database (http://www.disgenet.org/web/DisGeNET/ menu, version 5.0) is a detection platform that can be used to study the molecular basis of human disease and its complications, analyze the characteristics of disease genes, and assess the correlation between genes and disease (Pinero et al., 2020). We obtained 5,742 associations between genes and diseases in the DisGeNET database, and screened genes associated with viral diseases in a disease class.

### 2.6 | Construction and analysis of the drugingredient-gene target network

The potential gene targets of Yinqiao powder's active ingredients for treating COVID-19 and the active ingredients of Yinqiao powder were imported into Cytoscape software (version 3.4.0) to construct the Yinqiao powder's active ingredients and co-gene target network. Topological analysis was used to analyze the connection between the active ingredients and the targets.

### 2.7 | Classic anti-COVID-19 prescription validation

The TCMATCOV (http://tcmatcov.bbtcml.com, version 1.0, coinvented by the Institute of Chinese Materia Medica China Academy of Chinese Medical Sciences and Beijing Proteome Research Center) platform can predict the efficacy of TCM against COVID-19 (Guo et al., 2020). It uses the quantitative evaluation algorithm of multitarget drugs for the disturbance of disease networks to predict the potential drug efficacy of the target drugs. Based on the TCMATCOV platform, Qingfei Paidu decoction was used as a positive control and Banxia Baizhu Tianma decoction was used as a negative control to predict the interference score of Yinqiao powder on COVID-19. Qingfei Paidu decoction has been found to have a therapeutic effect on COVID-19 through in silico and experimental studies (Yang et al., 2020). Banxia Baizhu Tianma decoction has been used to treat vertigo (Guo, Su, Wang, Luo, & Lai, 2017).

### 2.8 | Construction and analysis of the PPI network

The STRING database (https://string-db.org/, version 10.5) is a database containing a large number of protein interaction relationships, involving a total of 9,643,763 proteins and 1,380,838,440 interactions, which are detected by experiments or predicted by bioinformatics methods (Szklarczyk et al., 2017). We imported the potential gene targets of Yinqiao powder into the STRING database, restricted the species to *Homo sapiens*, and obtained the protein interaction relationship for further study. The medium confidence was set to 0.4, and the results were saved in the TSV format. Node 1, node 2, and the combined score information were imported into Cytoscape software to perform the interactive network. We also used the Generate style from the statistics tool in Cytoscape to set the node size.

### 2.9 | Molecular docking

The Sybyl software (*Tripos*, version X2.1) was used for molecular docking. This module has the characteristics of high program running speed, accuracy, and reliability. Surflex-Dock scores are expressed in  $-\log 10$  ( $K_d$ ) units to represent binding affinities (Jain, 1996). Surflex-Dock contains the following information: First, the total score of Surflex-Dock is expressed by  $-\log (K_d)$ . Second, "crash" refers to the degree to which a ligand improperly penetrates into a protein and the degree of interpenetration between ligand atoms separated by a rotatable bond. It is advantageous for the crash score to be close to 0. Third, "polar scoring" refers to the contribution of polar interaction to the total score, and it can be used to exclude docking results without hydrogen bonding.

3CL<sup>pro</sup> is an established drug target for the design of inhibitors to stop viral replication (Kneller et al., 2020). ACE2 is the binding protein for SARS-CoV-2 to invade the human body (He, Tao, Yan, Huang, & Xiao, 2020). Therefore, the top four proteins recognized by the PPI network, ACE2 proteins (https://covid-19.uniprot.org/), and 3CL<sup>pro</sup> (https://www.rcsb.org/structure/6M2Q) were used for molecular docking with Svbvl software to identify the binding ability of the active ingredients and targets and screen potential targets and efficient active ingredients. At the same time, we used the commonly used clinical antiviral drug interferon alpha (IFN- $\alpha$ ) (https://pubchem. ncbi.nlm.nih.gov/compound/71306834) as a positive control drug. Molecular docking was performed according to the Sybyl docking (https://v.youku.com/v\_show/id\_XNDU0Mjg0NTYw.html? manual refer=seo operation.liuxiao.liux 00003308 3000 Yvmlba 19042900). First, a docking file was created. Second, docking ligands, including removed water molecules, added polar hydrogen atoms, and extracted original ligands, were used to identify the binding sites. Third, molecular docking was performed, and the results were saved. Fourth, the docking score was analyzed to evaluate the binding activity. Finally, Schrodinger Suites (version 2019-1, Materials) was used to draw the 3D map of the corresponding molecular docking.

### 2.10 | SPR assay

To verify the binding ability of ACE2 to the most effective active ingredients screened by molecular docking, SPR was performed with a NeoSPR-M100 surface plasmon resonance instrument (Hangzhou Neoline Technology Co. Ltd., China). The ACE2 protein (DD04531k1g0wj, Cusabio Biotech Co. Ltd.) was fixed on a carboxyl sensor chip (NS-SCHC, Hangzhou Neoline Technology Co. Ltd., China) with an amide bond, and the active ingredients at 2.73, 10.93, 21.85, 61.19, 87.4, and 139.86  $\mu$ M were injected sequentially into the chamber. The concentration of ACE2 was 25  $\mu$ g/ml, the pH was 4.0, the volume was 100  $\mu$ l, the flow rate was 20  $\mu$ l/min, and the amount was 292 PU. The flow rate of the active ingredients was 20  $\mu$ l/min, the binding time and dissociation time were both 150 s, and the chip was regenerated with 40 mM NaOH. The data were retrieved and analyzed using the TraceDrawer software, assuming a 1:1-binding model.

# 2.11 | GO functional analysis and tissue location analysis

The Database for Annotation, Visualization and Integrated Discovery (DAVID, https://david.ncifcrf.gov/, version 6.8) provides systematic and comprehensive biological function annotation information, including biological process (BP), cellular component (CC), and molecular function (MF), for genes or proteins and can find the most significantly enriched biological annotations (Dennis et al., 2003). The potential genes for the treatment of COVID-19 with the active ingredients of Yinqiao powder were imported into the DAVID database, limiting the species to *Homo sapiens*, GO functional analysis and tissue location analysis were performed, and the results were saved. Finally, GO terms with a *p*-value  $\leq$ .05 and FDR  $\leq$  .05 were selected for further analysis. The top biological processes and tissue positioning were screened, and GraphPad Prism 5.0 software was used to draw biological processes and tissue location maps.

# 2.12 | KEGG analysis and signal pathway integration

The UniProt ID of Yinqiao powder was imported into the KEGG database (http://www.kegg.jp/), and the species was limited to *Homo sapiens* to obtain the signaling pathways of Yinqiao powder in the treatment of COVID-19. The KEGG-enriched advanced bubble chart was designed using Omicshare Tools (https://www.omicshare.com/) and integrated common signal paths.

### 3 | RESULTS

# 3.1 | Screening of active ingredients in Yinqiao powder

A total of 222 active ingredients of Yinqiao powder were obtained from the TCMSP database. According to the OB and DL of Yinqiao powder, 30 active ingredients were selected, including hesperetin, licopyranocoumarin, luteolin, quercetin,  $\beta$ -sitosterol,  $\beta$ -carotene, and naringenin. Details are shown in Table S1. However, only hesperetin, eriodictyol, luteolin, quercetin, and naringenin were verified by mass spectrometry, as shown in Table 1, Figure S1, and Supplementary Material 2.

### 3.2 | Target prediction

A total of 190 gene targets were identified by the above five active ingredients of Yinqiao powder in the UniProt database. By comparing 349 gene targets related to COVID-19 in the Genetic Association Database, GeneCards database, and OMIM database, 43 co-gene targets, such as PTGS1, PTGS2, and DPP4, that may be related to Yinqiao powder for the treatment of COVID-19 were selected. Details are shown in Table S2.

# 3.3 | DisGeNET score between co-genes and COVID-19

In the DisGeNET database, 209 associations were obtained. After deleting duplicate and false results, 33 genes were associated with viral diseases or coronavirus infections, which are shown in Table S3. There were eight genes with DisGeNET scores  $\geq$  0.1 (TNF, TP53, IL6, IL10, STAT1, IFNG, CXCL10, and BCL2), and two genes were related to COVID-19 (MCL1 and ACE2).

# 3.4 | Construction of drug-ingredient-gene target network

Information on the active ingredients and gene targets of Yinqiao powder was imported into Cytoscape software to construct a drugingredient-gene target network, as shown in Figure 2a. There were 6 drug nodes, 5 active ingredient nodes, 43 gene nodes, and 89 kinds of nodes that were connected. The triangle nodes represent the potential anti-COVID-19 drugs of Yinqiao powder, which include Jinyinhua, Lianqiao, Jingjiesui, Jiegeng, Bohe, and Gancao. The square-shaped nodes represent the active ingredients of Yinqiao powder, which include hesperetin, eriodictyol, luteolin, quercetin, and naringenin and are considered to have potential anti-COVID-19 effects. The elliptical nodes represent the genes, and the edges represent the correlation between drugs, active ingredients, and gene targets. The results showed the multicomponent, multitarget characteristics of Yinqiao powder against COVID-19.

# 3.5 | Prediction of Yinqiao powder for the treatment of COVID-19 by TCMATCOV

Using TCMATCOV, we compared the intervention effect of Yinqiao powder with Qingfei Paidu decoction and Banxia Baizhu Tianma decoction on COVID-19. The platform uses network topology analysis to evaluate drug efficacy, including the average connectivity, average shortest path, connectivity centrality, and tightness centrality. Negative average connectivity, connectivity centrality, and tightness centrality represent the destructiveness of the drug for the disease target network. A positive value of the average shortest path indicates the destructiveness of the drug to the disease target network. The larger the value of these indicators, the stronger the destructive effect of the target drug on the disease target network. Based on the above four values, the total interference score was calculated and the disturbance effect of the drug on the disease target network was evaluated at the overall level. The higher the total interference score, the higher the degree of damage to the network stability of the drug. The results suggested that Yinqiao powder and Qingfei Paidu decoction had very close intervention effects on COVID-19, with an intervention score of 20.16 versus 23.28, which was significantly higher than that of Banxia Baizhu Tianma decoction (14.52) (Table S4). In addition, from the four dimensions of average connectivity, shortest path, connectivity centrality, and tightness centrality, it can be seen that Yingiao powder has a significant intervention effect on COVID-19 and that the effect is similar to the effect of Oingfei Paidu decoction, suggesting that Yingiao powder could be used to treat COVID-19.

### 3.6 | Construction and analysis of the PPI network

The PPI network is shown in Figure 2b. The nodes represent proteins, and the lines represent the associations between proteins. A total of 43 nodes and 440 edges were involved. The average node degree was 20.47. Topological analysis found that four proteins ranked in the top four in degree, betweenness centrality, and closeness centrality, namely IL6, mitogen-activated protein kinase 3 (MAPK3), tumor necrosis factor (TNF), and tumor protein P53 (TP53) (Table S5).

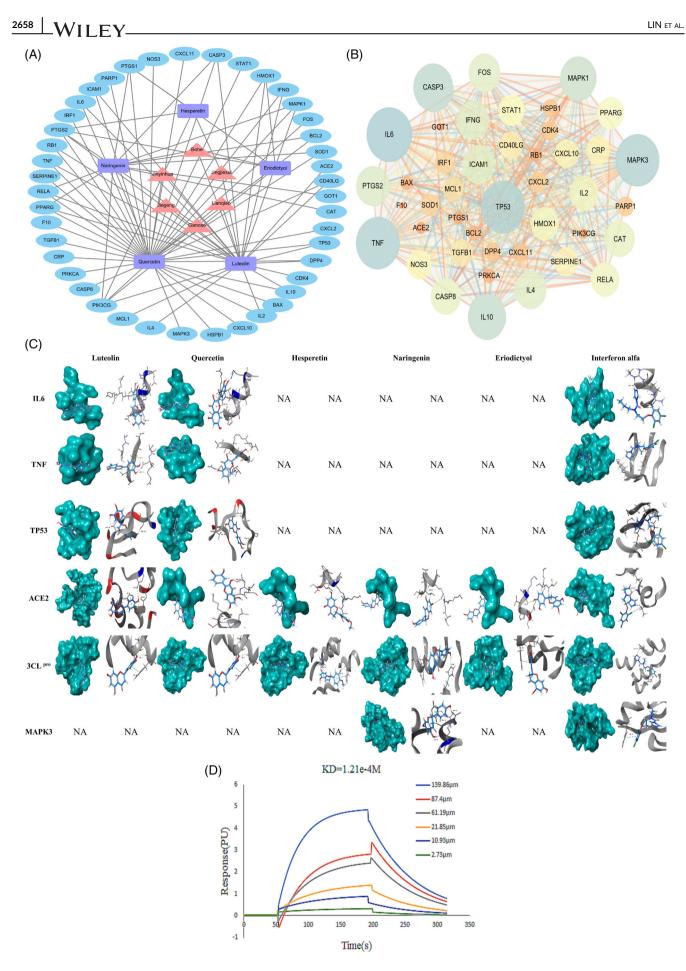
### 3.7 | Molecular docking

The molecular docking results in comparison to those of IFN- $\alpha$ , which is currently a common treatment for COVID-19, are highlighted in Table S6 and Figure 2c. It is generally believed that when the docking score is above 1.0, the molecule has a certain binding activity between the ingredients and the protein targets. A docking score >3.0 indicates that the ingredients have good binding activity to the protein targets, while a docking score >5.0 indicates strong binding activity (Lin et al., 2019). The crash scores were close to 0, indicating that the docking results were reliable. The polar score and total score were similar, indicating that the total score basically reflects the docking of the ingredients and protein targets. Luteolin and ACE2 obtained the highest docking total score, mainly by hydrogen bonds or  $\pi - \pi$  bonds, which was higher than highest docking total score for the binding of IFN- $\alpha$  and ACE2. SPR assays indicated that luteolin is bound to ACE2 with a dissociation constant ( $K_d$ ) of 121  $\mu$ M (Figure 2d). At the same time, 10 molecular docking results with a docking total score of 3.0-5.0 accounted for 58.82%, including luteolin and IL6, TP53, 3CL<sup>pro</sup>; guercetin and IL6, TP53, 3CL<sup>pro</sup>; hesperetin and 3CL<sup>pro</sup>; naringenin and MAPK3, 3CL<sup>pro</sup>; eriodictyol and 3CL<sup>pro</sup>. These five

Annotation source: MassList match	Full match	Full match	Full match	Full match	Full match	:
Annotation source: mzVault search	Full match	Full match	Partial match	Full match	Full match	
mzCloud best match (%)	88.5	76	78.9	86.2	90.3	
Annotation source: mzCloud search	Full match	Full match	Full match	Full match	Full match	
Area	666,388.8127	770,446.0006 Full match	1,440,073.476	300,998.8408	714,046.1477	
RT (min)	14.464	13.345	15.247	12.725	14.208	
Molecular weight	302.07898	288.06324	286.04784	302.04253	272.06841	
Structure	x x x x x x x x x x x x x x x x x x x					
Formula	C16 H14 O6	C15 H12 O6	C15 H10 O6	C15 H10 O7	C15 H12 O5	ā
Name	Hesperetin	Eriodictyol	Luteolin	Quercetin	Naringenin	
Molecule ID	MOL002341	MOL005190	MOL00006	MOL00098	MOL004328	
N	7	N	m	4	ۍ	

 TABLE 1
 Qualitative analysis of chemical components in Yingiao powder

Abbreviations: area, compound peak area; mzCloud best match, MzCloud database matching score (the higher the value, the higher the credibility of the result identified); RT, chromatographic retention time.



active ingredients have good binding ability with 3CL<sup>pro</sup>, which means that they may be highly effective active ingredients for Yinqiao powder to treat COVID-19.

### 3.8 | GO enrichment analysis

GO enrichment analysis refers to a directed acyclic graph composed of the number of proteins or genes at a certain functional level, including BP, MF, and CC. There were 455 BPs involved with the genes. The top five BPs (Figure 3a) were the regulation of apoptosis (25 genes/58.14%), regulation of programmed cell death (25 genes/58.14%), regulation of cell death (25 genes/58.14%), regulation of cell proliferation (25 genes/58.14%), and response to organic substances (23 genes/53.49%). There were 37 CCs involved with the genes, and the top 2 CCs (Figure 3b) were extracellular regions (19 genes/44.19%) and membrane-enclosed lumens (18 genes/41.86%). There were 53 MFs involved with the genes. The top three MFs (Figure 3c) were identity protein binding (11 genes/25.58%), protein dimerization activity (10 genes/23.26%), and cytokine activity (10 genes/23.26%). Tissue analysis (Figure 3f) showed that genes were mainly highly expressed in nine areas, of which the top four areas were placenta (15 genes/34.88%), lung (10 genes/23.26%), liver (8 genes/18.60%), blood (8 genes/18.60%).

### 3.9 | KEGG pathway analysis

KEGG analysis results showed that the gene targets of Yingiao powder for COVID-19 involve a total of 57 signaling pathways. The top 15 important signaling pathways are shown in Figure 3e. The top four signaling pathways closely related to COVID-19 were the TNF signaling pathway (13 genes/30.23%), the T-cell receptor signaling pathway (12 genes/27.91%), the Toll-like receptor signaling pathway genes/25.58%), MAPK (11 and the signaling pathway (10 genes/23.26%). The main signaling pathway of Yingiao powder in the treatment of COVID-19 is shown in Figure 3f, which involves a total of 24 gene targets, accounting for 55.81% of the co-genes. Some gene targets, such as p38, JNK, and MKK3, play a role in multiple pathways, suggesting that they may be the key genes involved in COVID-19.

# 4 | DISCUSSION

Yinqiao powder comes from the *Systematized Identification of Warm* by Wu Jutong in the Qing Dynasty. Using TCMATCOV, we also found

that Yingiao powder has a certain therapeutic effect on COVID-19, with an intervention score of 20.16. Drug-ingredient-gene target network analysis revealed that Jinyinhua, Liangiao, Jingjiesui, Jiegeng, Bohe, and Gancao have potential anti-COVID-19 effects. Some of these drugs have been confirmed to have obvious advantages in improving the clinical symptoms of COVID-19 patients. For example, Zhang, Lei, Xu, Wei, & Hu (2020) found that antiviral drugs combined with Jinyinhua oral solution have a significant benefit in improving fever, fatigue, and cough symptoms and reducing lung injury in patients with COVID-19. A retrospective study of historical classics and Chinese programs to control COVID-19 found that Jinyinhua, Liangiao, and Gancao were commonly used to control COVID-19 (Luo et al., 2020). Zhang, Liang, Kong, and Xiao (2019) found that moxifloxacin combined with Jiegeng was significantly better than moxifloxacin alone in improving cough symptoms in patients with pneumonia and could reduce the WBC and CRP levels in patients.

In our study, 30 ingredients of Yingiao powder were screened from the TCMSP database based on the OB and DL, and five ingredients, namely hesperetin, eriodictyol, luteolin, quercetin, and naringenin, were verified by LC-MS analysis. All of them were flavonoids and were associated with potential anti-COVID-19 genes. A previous study confirmed that flavonoids have antiinflammatory, antioxidant, antiproliferative, antithrombotic, cardioprotective, and neuroprotective effects (Gujar & Wairkar, 2020). In addition, some of these ingredients have been proven to have anti-COVID-19 effects. For example, hesperetin was found to have high affinity for the spike protein and the helicase and protease sites on the ACE2 receptor (Ngwa et al., 2020). Luteolin was found in a variety of anti-COVID-19 Chinese medicine prescriptions, such as Maxing Shigan decoction (Wang et al., 2020) and Tanreging injection (Kong et al., 2020). Kong et al. (2019) found that luteolin inhibits inflammation by inhibiting the expression of cyclic adenosine monophosphate-phosphodiesterases (PDEs) or PDE4 activity and intracellular cell adhesion molecule (ICAM)-1 and soluble ICAM-1 in serum in pulmonary microvascular endothelial cells. Quercetin was also found in a variety of anti-COVID-19 Chinese medicine prescriptions, such as Xiaochaihu decoction (Sun, Zhang, Liu, & Sun, 2020) and Huoxiang Zhenggi oral liquid (Deng et al., 2020). Wang, Leng, Guo, and Jin (2019) confirmed that quercetin could not only reduce the counts of lymphocytes, monocytes, and neutrophils in mice with pneumonia but also downregulate the levels of serum TNF- $\alpha$ , IL-6, and IL-1 $\beta$  to inhibit the inflammatory response, which may be related to the inhibition of the IKK/nuclear factor-kB (NF-kB)/IkB signaling pathway. A previous study also found that naringenin could reduce lung injury by inhibiting the expression of inflammatory cytokines, including IL-6, IL-1 $\beta$ , TNF- $\alpha$ , and TGF- $\beta$ , mediated by autophagy and pulmonary fibrosis (Lin, Tan, Kan, Xiao, &

**FIGURE 2** Drug-ingredient-gene target network, protein interaction network, and molecular docking of Yinqiao powder. (a) Drug-ingredient-gene target network of Yinqiao powder. The triangle ( $\blacktriangle$ ) is the drug of Yinqiao powder, the rectangle ( $\blacksquare$ ) is the main active ingredients of Yinqiao powder, the oval nodes ( $\odot$ ) is the potential targets for treating COVID-19 of Yinqiao powder. (b) Protein interaction network of Yinqiao powder. The size of the node represents the value of the degree (low values to small sizes). (c) Molecular docking. (d) Surface plasmon resonance (SPR) analysis of luteolin and ACE2 [Colour figure can be viewed at wileyonlinelibrary.com]

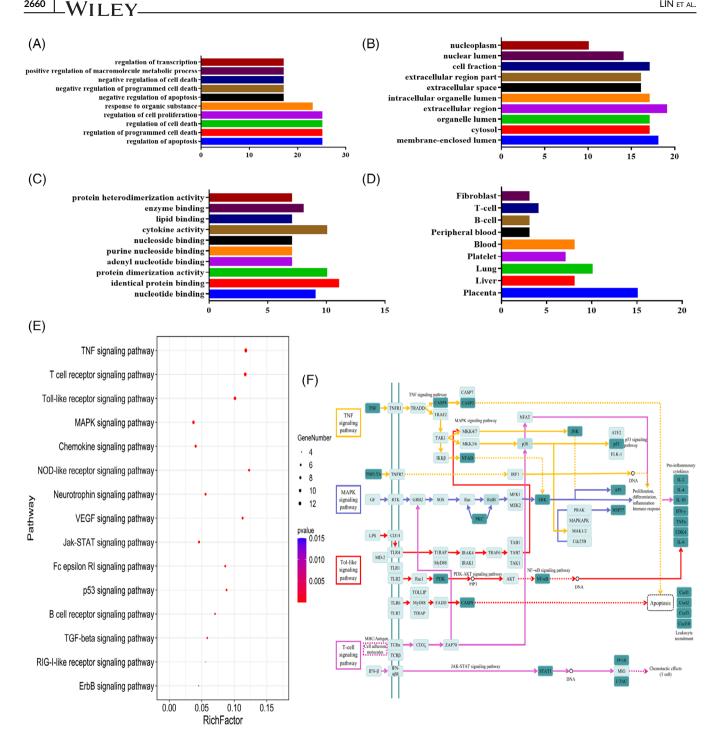


FIGURE 3 Gene ontology (GO) enrichment and KEGG pathway analyses of potential targets for treating COVID-19 from main active ingredients of Yingiao powder: (a) biological process (BP); (b) cellular component (CC); (c) molecular function (MF); (d) gene location; (e) enriched KEGG pathways of potential targets for treating COVID-19 from main active ingredients of Yingiao powder; (f) the potential anti-COVID-19 pathway of the main active ingredients of Yingiao powder ( $\uparrow$ -arrows indicate the promotion effect,  $\top$ -arrow indicates the inhibition effect). The target is marked in light color, and the potential target of Yingiao powder for COVID-19 is marked in dark color [Colour figure can be viewed at wileyonlinelibrary.com]

Jiang, 2018). Therefore, flavonoids may be the main active ingredient in treatments used for COVID-19.

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In our study, PPI analysis found that there were four anti-COVID-19 hub-proteins, namely IL6, MAPK3, TNF, and TP53, some of which have been confirmed by clinical trials. Clinical studies have found that

the accelerated development of the disease in patients with COVID-19 was closely related to the high inflammation state (Saleh, Peyssonnaux, Singh, & Edeas, 2020). Han et al. (2020) also found that the levels of serum cytokines in patients with COVID-19, including TNF- $\alpha$ , IFN- $\gamma$ , IL-2, IL-4, IL-6, IL-10, and CRP, were higher than those

in healthy people. Huang found that neutrophil counts, proinflammatory cytokines (TNF-α, IL-6, IL-1β, and IL-2R), and coagulation dysfunction biomarkers (D-dimer, PT, and Fbg) were closely related to the adverse clinical outcomes of COVID-19 patients through logistic regression analysis (Huang et al., 2020). Xiong et al. (2020) performed transcriptome sequencing of RNA isolated from bronchoalveolar lavage fluid and peripheral blood mononuclear cell specimens of COVID-19 patients and found that SARS-CoV-2 infection may cause lymphocyte apoptosis and that TP53 was an important gene in regulating apoptosis. Di Paola et al. (2009) found that the MAPK3 protein is involved in the inflammatory response of lung injury, and the inhibition of MAPK3/MAPK1 can reduce the level of proinflammatory cytokines, such as TNF- $\alpha$  and IL-1 $\beta$ , in lung injury. Therefore, the antagonistic effect of Yingiao powder on COVID-19 may be closely related to the regulation of these inflammation-related proteins.

To further screen the potential active ingredients, we used molecular docking to identify the binding activity of the active ingredients and anti-COVID-19 protein. We found that luteolin and ACE2 have the best binding ability, mainly through hydrogen bonds or  $\pi - \pi$  bonds, which means that luteolin has a certain role in preventing COVID-19 infection. Jimilihan et al. (2020) also confirmed that luteolin has good binding activity with ACE2 and that hydrogen bonding plays a key role in the recognition and stability of the active ingredients and proteins. SPR analysis showed that luteolin combined with ACE2 had a  $K_{d}$  of 121  $\mu$ M, and the corresponding -log10 (K<sub>d</sub>) value was 3.917, which was lower than the total score of 5.63. This indicated that the molecular docking results obtained by Surflex-Dock may overestimate the actual affinity between the ingredients and the targets. This phenomenon has also been reported in previous studies (Jain, 1996). However, this affinity was still far lower than that of COVID-19 and ACE2  $(K_d 121 \mu M vs. 15 nM)$  (Wrapp et al., 2020). In fact, the role of Yingiao powder in preventing and treating COVID-19 not only depends on the competitive combination of luteolin and ACE2 but also may be related to the joint control of the inflammatory response and antiviruses with multiple ingredients and targets. Interestingly, we also discovered that luteolin and IL6, TP53, and 3CL<sup>pro</sup>; guercetin and IL-6; TP53 and 3CL<sup>pro</sup>; hesperetin and 3CL <sup>pro</sup>; naringenin and MAPK3 and 3CL<sup>pro</sup>; and eriodictyol and 3CL<sup>pro</sup> have good affinity, which means that they may be the effective active ingredients of Yingiao powder to treat COVID-19. These results have been partially confirmed by previous studies. For example, Palombo et al. (2019) confirmed that luteolin could inhibit STAT3 activity in mice to counteract the proliferative effect of the IL-22/IL-6 signaling pathway and could be used as a drug candidate for the treatment of inflammation and proliferative diseases. Lin et al. (2020) confirmed that quercetin could inhibit the expression of inflammatory factors induced by LPS through mouse experiments, such as cyclooxygenase-2 (PTGS2) and IL6. Glinsky (2020) found that quercetin, luteolin, and eriodictyol were structurally similar and could be developed as inhibitors for SARS-CoV-2 infection through drug docking screening and gene expression profile analysis. However, the direct inhibitory effects of hesperetin, eriodictyol, luteolin, quercetin, and naringenin on SARS-CoV-2 have not been verified in clinical trials or animal experiments.

GO analysis revealed that the main BP involved in the anti-COVID-19 gene was the regulation of apoptosis, the main CC was the extracellular region, and the main MF was protein binding. Some of these results have been verified by previous studies. For example, Saleh et al. (2020) believe that the highly inflammatory state of COVID-19 patients and triggered oxidative stress may lead to mitochondrial dysfunction, eventually leading to platelet damage and apoptosis. Couture et al. (2020) found that luteolin could inhibit membrane synthesis and cell proliferation to activate apoptosis, which may be related to the increased expression of related genes such as Fas. Cdkn1a. Atp7b. and TP53. and the increased accumulation of cleaved caspase 3 and PARP. Wrapp et al. (2020) believe that the key to COVID-19 infection lies in the binding between the SARS-CoV-2 spike protein and ACE2 protein, and understanding the structure and affinity of these two proteins will help in the development of antiviral drugs. However, the role of the extracellular region in COVID-19 is still unclear. In addition, it is interesting to find that the anti-COVID-19 genes were mainly expressed in the lung and liver; this finding has also been confirmed in previous studies. For example, Zhang observed that COVID-19 patients have obvious abnormalities in coagulation. which may be caused by liver damage and inflammatory storms (Zhang et al., 2020). In addition, inflammatory storms can cause lung damage (Han et al., 2020).

KEGG analysis revealed that the four important signaling pathways closely related to COVID-19 were the TNF signaling pathway. the T-cell receptor signaling pathway, the Toll-like receptor signaling pathway, and the MAPK signaling pathway. These signaling pathways are related to the inflammatory response, and some have been found to be involved in the pathogenesis of COVID-19. For example, Karki et al. found that some proinflammatory factors in the TNF signaling pathway are also involved in the immune response process of COVID-19 patients, and TNF- $\alpha$  and IFN- $\gamma$  have a synergistic effect in inducing inflammation, tissue damage, and death in COVID-19 patients (Karki et al., 2020). DiNicolantonio and McCarty (2020) found that the Toll-like receptor signaling pathway was involved in thrombosis in patients with COVID-19. In addition, Yang et al. (2020) found that the thrombin and Toll-like receptor signaling pathways may be important antiinflammatory pathways of Maxing Shigan decoction for the treatment of COVID-19 through transcriptomics analysis. The role of the T-cell receptor signaling pathway in COVID-19 is still unclear, but Sallenave and Guillot (2020) found that JAK1-STAT5 could increase CD8<sup>+</sup> T cells and decrease lymphocytes in critical patients with COVID-19 by inhibiting the expression of IL-2/IL-2R. Grimes and Grimes (2020) believe that the p38 MAPK pathway plays a key role in the release of proinflammatory cytokines (such as IL-6), pro-vasoconstriction, and prothrombotic activity, and is related to acute lung injury and myocardial dysfunction. Although these signaling pathways were related to the occurrence and development of COVID-19, there is currently no experiment to further verify the specific role of Yingiao powder against COVID-19 in these signaling pathways.

# 5 | CONCLUSION

In this study, we found that hesperetin, eriodictyol, luteolin, quercetin, and naringenin were potential effective active ingredients against COVID-19 The antagonistic effect of Yingqiao powder on the inflammatory storm caused by COVID-19 may be related to the regulation of IL-6, MAPK3, TNF, and TP53 targets. The specific pathways were the TNF signaling pathway, the T-cell receptor signaling pathway, the Toll-like receptor signaling pathway, and the MAPK signaling pathway. Our study provides a new perspective for discovering potential drugs and mechanisms of COVID-19.

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#### CONFLICT OF INTEREST

The authors declare no conflict of interests.

#### AUTHOR CONTRIBUTIONS

Haixiong Lin and Xiaotong Wang conceived and designed the study. Minyi Liu and Xiaopeng Ye revised the protocol. Haixiong Lin and Xiaotong Wang extracted the data. Junjie Feng, Zhen Shen, Huijun Yang, Minling Huang, and Zige Li checked the data. Minling Huang and Junyan Gao performed statistical analysis. Haixiong Lin and Xiaotong Wang wrote the manuscript. Haixiong Lin and Xiaotong Wang interpreted the results. Haixiong Lin, Xiaotong Wang, and Xiaopeng Ye reviewed and advice. All authors contributed constructive comments on the paper.

#### DATA AVAILABILITY STATEMENT

The data and materials generated or analyzed during this study are available from the corresponding author on reasonable request.

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### SUPPORTING INFORMATION

Additional supporting information may be found online in the Supporting Information section at the end of this article.

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