Network pharmacology for the identification of phytochemicals in traditional Chinese medicine for COVID-19 that may regulate interleukin-6

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Objective: Three formulas and three medicines, namely, Jinhua Qinggan Granule, Lianhua Qingwen Capsule, Xuebijing Injection, Qingfei Paidu Decoction, HuaShi BaiDu Formula, and XuanFei BaiDu Granule, were proven to be effective for coronavirus disease 2019 (COVID-19) treatment. The present study aimed to identify the active chemical constituents of this traditional Chinese medicine (TCM) and investigate their mechanisms through interleukin-6 (IL-6) integrating network pharmacological approaches.

Methods: We collected the compounds from all herbal ingredients of the previously mentioned TCM, but those that could down-regulate IL-6 were screened through the network pharmacology approach. Then, we modeled molecular docking to evaluate the binding affinity between compounds and IL-6. Furthermore, we analyzed the biological processes and pathways of compounds. Finally, we screened out the core genes of compounds through the construction of the protein–protein interaction network and the excavation of gene clusters of compounds.

Results: The network pharmacology research showed that TCM could decrease IL-6 using several compounds, such as quercetin, ursolic acid, luteolin, and rutin. Molecular docking results showed that the molecular binding affinity with IL-6 of all compounds except γ-aminobutyric acid was \(-5.0\) kJ/mol, indicating the potential of numerous active compounds in TCM to directly interact with IL-6, leading to an anti-inflammation effect. Finally, Cytoscape 3.7.2 was used to topologize the biological processes and pathways of compounds, revealing potential mechanisms for COVID-19 treatment.

Conclusion: These results indicated the positive effect of TCM on the prevention and rehabilitation of COVID-19 in at-risk people. Quercetin, ursolic acid, luteolin, and rutin could inhibit COVID-19 by down-regulating IL-6.

Introduction

In December 2019, in Wuhan, Hubei Province, China, the Chinese Center for Disease Control and Prevention identified a highly contagious novel coronavirus (SARS-CoV-2) [1]. On February 11, 2020, in Geneva, Switzerland, Tedros Adhanom Ghebreyesus, director-general of the World Health Organization, announced that the novel coronavirus pneumonia would be named coronavirus disease 2019 (COVID-19). Now, the COVID-19 pneumonia has spread to more than 200 countries worldwide and placed a tremendous pressure on the health-care system.
Figure 1. Herbs–Compounds–IL-6 network

The Herbs–Compounds–IL-6 network was constructed using Cytoscape 3.7.2. The complex relationship between each other could be observed in this network. The blue hexagon represents herb, and the red diamond represents compound. The green V represents IL-6.

Table 1 Pharmacokinetic parameters of compounds

| Compound       | OB(%) | DL  | BBB  | HL  | RBN |
|----------------|-------|-----|------|-----|-----|
| Rutin          | 3.20  | 0.68| -2.75| -   | 6   |
| Matrine        | 63.77 | 0.25| 1.52 | 6.69| 0   |
| Melatin        | 26.40 | 0.67| -0.63| -   | 0   |
| Luteolin       | 36.16 | 0.25| -0.84| 15.94| 1  |
| Caffeine       | 89.46 | 0.08| -0.01| 13.64| 0  |
| Aucubin        | 4.17  | 0.33| -2.90| -   | 4   |
| Piperine       | 42.52 | 0.23| 0.62 | 10.25| 3   |
| Wogonin        | 30.68 | 0.23| 0.04 | 17.75| 2   |
| Daunorin       | 19.44 | 0.19| -0.22| -   | 1   |
| Myricetin      | 13.75 | 0.31| -1.01| -   | 1   |
| Quercetin      | 46.43 | 0.28| -0.77| 14.40| 1  |
| Ursolic acid   | 16.77 | 0.75| 0.07 | -   | 1   |
| Resveratrol    | 19.07 | 0.11| -0.01| -   | 2   |
| Paoniflorin    | 53.87 | 0.79| -1.86| 13.88| 7   |
| Sinomenine     | 30.98 | 0.46| 0.43 | 1.79 | 2   |
| Atractylonolide| 37.37 | 0.15| 1.29 | 7.10 | 0   |
| γ-aminobutyric acid | 24.09 | 0.01| -0.57| -   | 3   |

Abbreviations: BBB, blood–brain barrier; DL, drug-likeness; HL, half-life; OB, oral bioavailability; RBN, rotatable bond number.

One of central challenges for COVID-19 treatment is the myriad of proinflammatory cytokines released during the disease progression, known as a cytokine release syndrome (CRS) [2]. CRS has been considered to be the main cause of morbidity of SARS-CoV- and MERS-CoV-infected patients [3]. Patients with severe COVID-19-associated pneumonia may exhibit systemic hyperinflammation, known as macrophage activation syndrome or cytokine storm [4]. Mudd et al. performed a single-cell RNA transcriptional
profiling of peripheral blood mononuclear cells from COVID-19 subjects and found that 28 of their 35 cytokines had lower mean cytokine levels, though not all were statistically significant. Only two cytokines were higher in number among COVID-19 subjects than among influenza subjects (IL-6 and IL-8) [5]. Sinha et al. proved that sarilumab or tocilizumab, the IL-6 inhibitor, could improve COVID-19 outcomes [6]. Meanwhile, the increase in IL-6 and other inflammatory cytokine levels in serum is a marker of CRS [7]. Some studies have indicated that CRS caused by IL-6 was common in COVID-19 patients and closely related with acute respiratory distress syndrome (ARDS) [8,9]. Early reports suggest that tocilizumab, an IL-6 receptor antagonist, may help suppress cytokine storms in COVID-19 patients. However, preliminary data from randomized trials remain unclear [10].

Traditional Chinese medicine (TCM) has been proven effective for COVID-19 treatment [11–13]. Up to now, the National Health Commission of China published seven versions of diagnosis and treatment guidelines. The National Administration of TCM recommended ‘three formulas and three medicines’, namely, Jinhua Qinggan Granule, Lianhua Qingwen Capsule, Xuebijing Injection, Qingfei Paidu Decoction, Huashi BaiDu Formula, and XuanFeiBaiDu Granule [14]. The recent study by Nanshan Zhong et al. showed that Lianhua Qingwen Capsule is safe and effective for COVID-19 and can significantly improve COVID-19 patients’ clinical symptoms and clinical outcomes by suppressing inflammation [15,16]. Furthermore, an empirical study from Wuhan showed that Qingfei Paidu decoction contributed to the recovery of various disease progresses in COVID-19 patients [17].

Figure 2. Diagram of the chemical structures of rutin, matrine, melanin, luteolin, caffeine, aucubin, piperine, wogonin, daidzein, myricetin, quercetin, ursolic acid, resveratrol, paeoniflorin, sinomenine, atractylenolide-I, and γ-aminobutyric acid.
Figure 3. The rank of compounds according to oral bioavailability

Figure 4. The rank of compounds according to drug-likeness
Figure 5. The rank of compounds according to blood–brain barrier permeability

Table 2 The distribution of compounds in medicines and formulas

|                      | Jinhua Qinggan granules | Lianhua Qingwen capsules | Xuebijing Injection | Qingfei Paidu Decoction | XuanFeiBaiDu Granule | HuaShiBaiDu Formula |
|----------------------|--------------------------|---------------------------|---------------------|--------------------------|----------------------|---------------------|
| Rutin                | ✓                        | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Matrine              |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Melanin              |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Luteolin             | ✓                        | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Caffeine             |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Aucubin              |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Piperine             |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Wogonin              | ✓                        | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Daidzein             |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Myricetin            | ✓                        | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Quercetin            | ✓                        | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Ursolic acid         | ✓                        | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Resveratrol          |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Paeoniflorin         |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Sinomenine           |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| Atractylenolide I    |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |
| γ-aminobutyric acid  |                          | ✓                         | ✓                   | ✓                        | ✓                    | ✓                   |

Quercetin, Ursolic acid, Luteolin, Rutin, and so on could be found in medicines and formulas. Quercetin, Ursolic acid, Luteolin, and Rutin were the most frequently used compounds in these medicines and formulas.

Our research aimed to systematically investigate the active components of ‘three formulas and three medicines’ for COVID-19 treatment and the mechanism based on IL-6 integrating network pharmacological methods.
Materials and methods
Identification of ingredients in TCM
Supplementary Table S1 outlines Jinhua Qinggan Granules, Lianhua Qingwen Capsules, Xuebijing Injection, Qingfei Paidu Decoction, XuanFeiBaiDu Granule, and HuashibaiDu Formula, which were obtained from traditional medicine guidelines and Chinese Clinical Trial Registry up to April 30, 2020. The information on the active compounds of these ingredients in TCM was downloaded from the Traditional Chinese Medicine Systems Pharmacology (TCMSP, http://www.tcmspw.com/tcmsp.php) database [18].

Pharmacokinetic parameters (chemical structure; oral bioavailability (OB); drug-likeness (DL); blood–brain barrier (BBB) permeability; half-life of compounds) were obtained from the TCMSP database and confirmed by the DrugBank (www.drugbank.ca) database.

Screening compounds targeting at IL-6
CRS is the main cause of morbidity in SARS-CoV and MERS-CoV patients [3]. Previous research has shown that the increase in IL-6 and other inflammatory cytokines in serum is a marker of CRS [7]. The present study also found that CRS caused by IL-6 was common in COVID-19 patients and closely associated with ARDS [8]. Hence, therapies are urgently needed to suppress IL-6 in COVID-19 patients.

The information on the active compounds that interact with IL-6 was downloaded from the TCMSP database, and then we identified and confirmed those that could down-regulate IL-6 [19–35].

Network construction and analysis
In recent years, based on bioinformatics and systems biology, network pharmacology has been applied in many fields of life sciences, such as in the identification of new drug targets, compound discovery, and evaluation of preclinical
Table 3 Compounds and their binding affinity with IL-6 were presented

| Compound     | Chemical formula | Molecular weight | Binding affinity (kJ/mol) |
|--------------|------------------|------------------|--------------------------|
| Rutin        | C_{27}H_{30}O_{16} | 610.517          | -5.9                     |
| Matrine      | C_{15}H_{24}N_{2}O_{6} | 248.364        | -7.0                     |
| Melanin      | C_{18}H_{10}N_{2}O_{4} | 318.283        | -7.1                     |
| Luteolin     | C_{18}H_{15}N_{6}O_{6} | 286.236        | -8.1                     |
| Caffeine     | C_{9}H_{10}N_{6}O_{6} | 194.191        | -5.5                     |
| Caffeine     | C_{15}H_{22}O_{7} | 346.338          | -5.7                     |
| Piperine     | C_{17}H_{10}N_{2}O_{3} | 285.338        | -5.7                     |
| Wogonin      | C_{16}H_{12}O_{6} | 300.263          | -7.3                     |
| Daidzein     | C_{13}H_{10}O_{4} | 254.237          | -5.7                     |
| Myricetin    | C_{15}H_{10}O_{4} | 318.235          | -8.2                     |
| Quercetin    | C_{15}H_{10}O_{7} | 302.236          | -8.2                     |
| Ursolic acid | C_{20}H_{16}O_{3} | 456.7            | -6.4                     |
| Resveratrol  | C_{14}H_{12}O_{3} | 228.243          | -5.5                     |
| Paonilinor   | C_{20}H_{16}O_{4} | 480.462          | -6.1                     |
| Sinomenine   | C_{10}H_{12}O_{4} | 329.39           | -6.7                     |
| Atractylolide | C_{13}H_{20}O_{2} | 230.302          | -6.4                     |
| γ-Aminobutyric acid | C_{4}H_{9}NO_{2} | 103.12          | -3.1                     |

All compounds except γ-aminobutyric acid molecular binding affinity with IL-6 were less than −5.0 kJ/mol, indicating that several bioactive chemical compounds in TCM have the potential to interact directly with IL-6.

The thinking method of integrated regulation of multiple targets based on molecular docking, construction of drug–target network, and analysis of network characteristics is used gradually in predicting the main active components and potential targets of TCM and elaborating the mechanism of TCM. To further characterize the molecular mechanism and topological structure of the medicine/formula, compounds, and IL-6, interaction networks were built and visualized using Cytoscape 3.7.2 (http://cytoscape.org/) [36]. These graphical networks showed that the medicine/formula, compounds, and IL-6 were expressed as nodes, whereas their interactions as edges.

**Molecular docking of TCM chemical constituents with IL-6**

ChemOffice software was used for the construction of the 3D structures of the chemical constituents of TCM. Then, MMFF94 force field was used to minimize the energies of chemical constituents. The RCSB Protein Data Bank (PDB) was used to obtain the 3D structure of IL-6 in PDB format [37]. PyMOL was used to analyze protein dehydration, hydrogenation, and other operations. AutoDock software was used to convert the compound and target protein format to the PDBQT format [38]. Finally, AutoDock Vina was run for virtual docking [39]. It is generally accepted that the lower the energy is, the more likely the binding is to occur. In the present study, ≤−5.0 kJ/mol binding energy was selected as the screening criteria.

**Gene ontology and pathway enrichment analysis for active compounds**

To understand the biological processes and pathways of TCM in COVID-19 treatment, Cytoscape 3.7.2 was used to analyze the biological processes and pathways of their compounds. It integrates several authoritative databases, such as GO, KEGG, and DrugBank, hence providing researchers with comprehensive and detailed information on genes. The genes of compounds were obtained from the TCMSP database and confirmed by the DrugBank database. All the gene names were standardized through the UNiProtKB (http://www.uniprot.org/) database with the ‘Homo sapiens’ [40].

**Gene cluster identification and protein–protein interaction (PPI) network analysis**

Gene clusters are groups of genes with the same or similar functions, which are closely related in some biological processes and pathways. We then intended to identify the hub genes in compound-related genes. Table 4 shows the genes of compounds, which were uploaded to STRING to obtain the protein network interaction diagram [41], the result of which was imported into Cytoscape 3.7.2. The cluster analysis of genes was conducted using the Molecular Complex Detection (MCODE) plug-in [42].
Figure 7. Alluvial diagram showing the relationship between herbs and compounds

The result showed that Forsythiae Fructus (rutin, luteolin, aucubin, wogonin, myricetin, quercetin, and ursolic acid), Lonicerae Japonicae Flos (rutin, luteolin, quercetin, and ursolic acid), Carthami Flos (rutin, luteolin, myricetin, and quercetin), and Verbenae herb (luteolin, aucubin, quercetin, and ursolic acid) had the most abundant compounds.

Results

Several chemical compounds could decrease IL-6 expression

Active compounds that interact with IL-6 were retrieved from the TCMSP database, and then we identified and confirmed those that could down-regulate IL-6. Table 1 shows that several compounds, such as quercetin and rutin, could down-regulate IL-6. In Figure 1, Cytoscape 3.7.2 was used to topologize the structure of the herb, compound, and IL-6 interaction networks, showing their complex relationship.

Figure 2 shows the chemical structure of the compounds. Furthermore, Table 1 shows several pharmacokinetic parameters that were collected to characterize compounds in detail, wherein OB and DL are seen as the most important parameters. In Figures 3-5, we ranked compounds according to OB and DL. Previous studies have found that the virus could be widespread in various parts of the body such as the cerebrospinal fluid. So, we ranked compounds according to BBB permeability. Taken together, these results showed that several active substances could down-regulate IL-6, thereby reducing the risk of CRS in patients.

Jinhua Qinggan Granules, Lianhua Qingwen capsules, Xuebijing Injection, Qingfei Paidu Decoction, XuanFeiBaiDu Granule, and HuaShi BaiDu Formula could have a therapeutic effect by targeting IL-6

We then investigated whether TCM could suppress IL-6. Table 2 shows the distribution of compounds in TCM. Figure 6 shows the tree map with the frequency of each compound in TCM. The most common compounds in TCM were quercetin, ursolic acid, luteolin, and rutin.

To obtain the best combination scheme of Chinese herbs, we made an alluvial diagram of Chinese herbs pertaining to the above-mentioned compounds. Figure 7 shows Forsythiae Fructus, Lonicerae japonicae flos, Carthami flos, and Herba Verbenae had the most abundant compounds.

In summary, first, these results suggested that TCM could have a therapeutic effect by reducing IL-6 (Figure 8). Second, Forsythiae Fructus, Lonicerae japonicae flos, Carthami flos, and Herba Verbenae could be the best combination scheme of Chinese herbs for COVID-19 treatment.
Figure 8. Herbs–Compounds–IL-6 networks of Jinhua Qinggan Granules, Lianhua Qingwen Capsules, Xuebijing Injection, Qingfei Paidu Decoction, XuanFeiBaiDu Granule, and HuaShiBaiDu Formula

The results indicated that they could exert therapeutic effects by suppressing IL-6 production. The hexagon represents herb, and the blue diamond represents compound. The red triangle represents IL-6.

Molecular docking with IL-6 and anti-CRS potential of compounds

To know whether the chemical constituents of TCM will interact directly with IL-6, molecular docking was modeled, evaluating the binding affinity between them. Figure 9 shows that, after preliminary screening, the binding affinity between 17 constituents and IL-6 was calculated. Table 3 shows that the molecular binding affinity with IL-6 of all compounds except γ-aminobutyric acid was $<-5.0 \text{ kJ/mol}$, indicating the potential of numerous bioactive compounds in TCM to interact directly with IL-6, in addition to their effects on the body.

Cytoscape showed biological processes and pathways of compounds

We downloaded the information on compound-related genes from the TCMSP database (Table 4). Then, Cytoscape 3.7.2 was used to analyze the biological processes and pathways of compounds. Figure 10 shows that the response to reactive oxygen species, cellular response to chemical stress, and cellular response to reactive oxygen species were mainly involved biological processes and pathways in quercetin. IL-17 signaling pathway was mainly involved in myricetin. IL-17 signaling pathway, fluid shear stress, and atherosclerosis were mainly involved in luteolin. AGE-RAGE signaling pathway in diabetic complications and positive chemotaxis were mainly involved in ursolic acid. And the regulation of acute inflammatory response, positive regulation of oxidoreductase activity, regulation of alcohol biosynthetic process, and positive regulation of superoxide anion generation were mainly involved in rutin. These results showed that those compounds may have a therapeutic effect on COVID-19 treatment through anti-inflammation and antioxidation.

Figure 10 shows the biological processes and pathways of wogonin, melanin, matrine, sinomenine, resveratrol, atracylenolide I, paeoniflorin, aucubin, piperine, daidzein, and caffeine as well as their analysis. Although these
Table 4 Genes relating to active compounds

| Compound        | Target genes                                      |
|-----------------|---------------------------------------------------|
| Matrine         | TNF; IL-6                                         |
| Paeoniflorin    | TNF; IL-6                                         |
| Atractylenolide I | IL1B; CD40LG; IL6; GABRA1; PGF; VEGFA             |
| Resveratrol     | PTGS1; MAPK3; MAPK1; VEGFA; TNF; IL-6             |
| Melanin         | PTGS1; PTGS2; MAPK3; MAPK1; VEGFA; TNF; IL-6      |
| Aucubin         | SERPIND1; CA2; PTGDR2; DPP4; CD40LG; BCL2; IL6; FAM213B |
| Caffeine        | MAPK1; SLC6A2; TP53; GR2A; ADRB2; PDE4B; ADORA2A; CYP1A2; 
|                 | TNF; IL-6; PTGS1; DRD2; ADORA1; PTGS2; CD40LG; JUN; NPSR1; CDK1; INS IL6; GABRA1; ITG5B |
| Rutin           | CAT; IL1B; SOD1; HMGCR; CD40LG; ALOX5; INS; ITG5B; GSTP1; IL6; TXA2R TOP2B; POR |
| Myricetin       | MMP2; PROC; IL1B; ATR1B; PPAR; PCK1; HSP90AA1; DPP4; TOP1; PTGS1 PTGS2; CD40LG; JUN; AR; XDH; TH; IL6; TOP2B; NCOA2 |
| Ursolic acid    | MMP2; CD4K; IL1B; FG2; CD6k; TP53; MMP10; MMP3; FASN; MMP1; SELECT |
| Piperine        | LTA4H; IL1B; CHRM3; IL1B; SLC6A3; ADRB2; CHRM1; ADRA1B; MAOA PDE3A; PTGS2; SOAT1; CD40LG; MAOB; IL6; ADR2A; SCNSA; ABCB; ENSG00000196689 |
| Sinomenine      | SLC6A2; IL2; IFNG; OPRD1; CHRM3; ADRB2; CHRM1; ADRA1B; HSP90AA1 |
| Luteolin        | MAPK1; HMOX1; MMP2; IL2; IFNG; CD4K; RB1; TP53; INS; PRSS1; APBA3 MET; MMP1; HSP90AA1; TOP1; PTGS1; PTGS2; CASP7; CD40LG; JUN; AR; XDH; IL6 NCOA2; VEGFA |
| \(\text{\textbackslash} \text{Wogonin}\) | CCL2; MAPK14; KDR; CDK2; TP53; PPARG; ADRB2; PRSS1; MMP1; GSK3B |
| Daidzein        | NOS2; P4HB; POP4; HSP90AA1; PTGER3; PDE3A; DPP4; PTGS1; CD40LG PDE4B; CD40LG; JUN; AR; BCL2; IL6; CHEK1; GABRA1; ESR1; SCNSA; RXRA |
| Quercetin       | SERPIND1; MAPK1; HMOX1; MMP2; PLAT; PON1; PCN2; MPO; CCL2; COL1A1 SULT1E1; IL2; IFNG; CD1; CTSD; GSTM2; AHR; KNO2; IL1B; EGF; RB1; TP53 SOD1; EGRF; GJA1; AKR1B1; PPARG; VCaM1; MMP3; ACHE; INSB; COL3A1 ADRB2; PRSS1; GSTM1; NQO1; MMP1; ACP; HSP94; SELECT; PTGER2; F3 HSP90AA1; ALOX5; CD40LG; JUN; PLAU ALD5X; AR; F7; THBD; MAOB; XDH; CDK1; BCL2; GSTP1; IL6; GABRA1; ITG5B NCOA2; SCNSA; FAM213B; RXRA; POR; COX14; MGAM; VEGFA; ACACA |

These genes were downloaded from TCMSP database and confirmed by Drugbank database. All the genes names were standardized through UNiProtKB database with the ‘Homo sapiens’.

Compounds were not common in TCM, it is of note that they could have a potential in treating COVID-19 based on their favorable affinity with IL-6.

Construction of PPI network and excavation of gene clusters of compounds to sieve the core genes of compounds, we uploaded the genes in Table 4 to STRING for further analysis and obtained PPI networks. Data files were then processed with Cytoscape 3.7.2. Figure 11 shows that MCODE was used to process the network data for the identification of gene clusters. Table 5, on the other hand, shows that we divided each PPI network into Model A to D based on their cluster score, genes in the Model a gene cluster with the highest score for each compound, showing the effects of the compounds on biological processes and pathways through these core groups of genes.

**Discussion**

In December 2019, in Wuhan, Hubei Province, China, some hospitals successively found a number of pneumonia cases of an unknown cause with a history of exposure to the South China seafood market, which has now been confirmed as an acute respiratory infectious disease caused by a novel coronavirus (COVID-19).

Although several western medicines exerted protective effects on vulnerable people [43,44], the remarkable curative effect of TCM on the COVID-19 cannot be neglected. According to the State Administration of TCM, ‘three formulas and three medicines’, namely, Jinhua Qinggan Granule, Lianhua Qingwen Capsule, Xuebijing Injection, Qingfei Paidu Decoction, HuaiShi BaiDu Formula, and XuanFeiBaiDu Granule, have been proven to be effective for COVID-19 treatment. One should pay attention on the significant adverse reactions that may occur when taking TCM. After the ‘three formulas and three medicines’ are taken, very few patients may suffer from mild malignancy,
Figure 9. Candidate compounds and representative results of molecular docking with IL-6
Schematic diagrams demonstrating the IL-6-binding sites and the proximate affinity of candidate compounds in TCM.

Table 5 Specific cluster score of gene clusters were collected and presented in a tabular form

| Compound  | Model A | Model B | Model C | Model D |
|-----------|---------|---------|---------|---------|
| Rutin     | 4.500   | 3.000   | /       | /       |
| Melanin   | 6.333   | /       | /       | /       |
| Luteolin  | 9.800   | 4.000   | /       | /       |
| Caffeine  | 7.000   | 3.000   | /       | /       |
| Piperine  | 5.000   | /       | /       | /       |
| Wogonin   | 11.538  | /       | /       | /       |
| Daidzein  | 11.833  | 3.000   | /       | /       |
| Myricetin | 7.111   | /       | /       | /       |
| Quercetin | 18.700  | 4.000   | 3.500   | 3.000   |
| Ursolic acid | 13.571  | /       | /       | /       |
| Sinomenine| 5.000   | 3.333   | /       | /       |

dizziness, stomach discomfort, etc., but most of them can be alleviated by taking continuously, without serious adverse reactions.

However, the potential mechanism of these medicines remains poorly understood. Emerging evidence indicates that high levels of IL-6 are observed in COVID-19 patients [45]. Furthermore, the present study has suggested that CRS caused by IL-6 is common in COVID-19 patients and is responsible for the severe COVID-19 acute respiratory distress among these patients [8]. An anecdotal experience on the use of tocilizumab, an IL-6-receptor blocking antibody, showed that it could not only decrease CRS but also rapidly improve symptoms in both intubated and non-intubated patients from China [46]. Hence, in the present study, we investigated whether TCM has a therapeutic effect by reducing IL-6. First, we identified 17 compounds that down-regulated IL-6 and then evaluated molecular docking with IL-6 and anti-CRS potential of these compounds. Finally, we screened out a group of compounds with favorable molecular docking results. Our results showed that Jinhua Qinggan Granule, Lianhua Qingwen Granule,
Figure 10. Biological processes and pathways of compounds analyzed using Cytoscape 3.7.2
ClueGO plug-in was used to analyze the interaction networks of enriched biological processes and pathways. The multiple color dots show that it revolved in multiple biological processes and pathways.

Xuebijing Injection, Qingfei Paidu Decoction, HuaShi BaiDu Formula, and XuanFeiBaiDu Granule could decrease IL-6 through several compounds, such as quercetin, ursolic acid, luteolin, and rutin, showing a therapeutic effect on COVID-19 treatment (Figure 12).

As a naturally occurring flavonoid, quercetin is widely distributed in every part of the plant, such as the roots, stems, leaves, flowers, and fruits. Quercetin has a wide range of pharmacological effects on many diseases. A growing body of evidence indicates that the alleviation of diabetic encephalopathy and protection of human oral keratinocytes could be seen in quercetin through antioxidant, anti-inflammatory, and antiapoptotic effects [47,48]. Furthermore, it can lower blood pressure, enhance capillary resistance, and reduce capillary fragility in ischemic disease [49]. Recent numerous studies used drug-docking for the COVID-19 viral spike protein to screen out quercetin as a disturbing binding partner, impeding coronavirus S-protein:ACE2 interface–ligand binding complex [50,51].

Ursolic acid (UA) was the second common compound in the present study. UA is a pentacyclic triterpenoid compound, which is widespread in plants [52] and has exhibited several pharmaceutical properties in many diseases. A previous study has shown that antibacterial, anticancer, antioxidant, and antymycotic properties could be seen in UA [53]. Furthermore, several studies showed that UA could have an antiviral effect on many viruses, such as rotavirus, HIV, influenza virus, and hepatitis B and C viruses [54–56]. A recent study reported that UA could potentially inhibit the main protease (M) of COVID-19 by using integrated molecular modeling approaches [57].

Like quercetin, luteolin is also a common antioxidant [58]. It is the main flavonoid in honeysuckle and could attenuate TNFα-activated generation of IL-6 in human endothelial cells [59]. It also played an important regulatory role in the cytokine storms of the lung of COVID-19 patients [60]. Lately, the treatment efficacy analysis of TCM from Wuhan, China, also showed that luteolin has a positive role in COVID-19 recovery [17].

Rutin is one of the classic flavonoids. Several studies have investigated its anti-tumor and anti-inflammatory effects [61]. A recent research showed that rutin was a powerful inhibitor, which could bind to the active site of the SARS-CoV-2 protease (PDB: 6Y84) [62]. Although other compounds were not as common as those four compounds above, given their favorable affinity with IL-6, they can potentially be effective drugs for COVID-19 treatment in the future.
Figure 11. MCODE was used to process the data obtained from the STRING to further mine the gene clusters of compounds. We divided each PPI network into Model A to Model D based on their cluster score; genes in Model A cluster had the highest score for each compound.

Figure 12. Graphical abstract of the present study

In summary, quercetin, UA, luteolin, and rutin were polyphenols extracted from plants that have a wide range of biological effects, including anti-carcinogenic, anti-inflammatory, and anti-viral, which reduce lipid peroxidation, platelet aggregation, and capillary permeability. The compounds from the ‘three formulas and three medicines’ could...
hopefully treat COVID-19. The limitation of this manuscript is the lack of clinical trials on these compounds for COVID-19 treatment.

Conclusions

Our study indicated that several compounds such as quercetin, UA, luteolin, and rutin could decrease IL-6 expression, showing an anti-CRS effect in COVID-19 patients.

Data Availability

The data used to support the findings of the present study are included within the article. Any further data can be made available from the corresponding author upon request.

Competing Interests

The authors declare that there are no competing interests associated with the manuscript.

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Author Contribution

Wen-hao Niu and Feng Wu designed the study. Wen-yue Cao analyzed the data. Wen-yue Cao, Yu-Chieh Chao, and Zong-gui Wu provided support to this research. Wen-hao Niu and Feng Wu wrote this study. Chun Liang and Fei Peng revised this manuscript.

Abbreviations

BBB, blood–brain barrier; COVID-19, coronavirus disease 2019; DL, drug-likeness; HL, half-life; IL-6, interleukin-6; OB, oral bioavailability; PPI, protein–protein interaction; RBN, rotatable bond number; TCM, traditional Chinese medicine.

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