REVIEW

Knowledge Mapping of Drug Repositioning's Theme and Development

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Background: In recent years, the emergence of new diseases and resistance to known diseases have led to increasing demand for new drugs. By means of bibliometric analysis, this paper studied the relevant articles on drug repositioning in recent years and analyzed the current research foci and trends.

Methodology: The Web of Science database was searched to collect all relevant literature on drug repositioning from 2001 to 2022. These data were imported into CiteSpace and bibliometric online analysis platforms for bibliometric analysis. The processed data and visualized images predict the development trends in the research field.

Results: The quality and quantity of articles published after 2011 have improved significantly, with 45 of them cited more than 100 times. Articles posted by journals from different countries have high citation values. Authors from other institutions have also collaborated to analyze drug rediscovery. Keywords found in the literature include molecular docking (N=223), virtual screening (N=170), drug discovery (N=126), machine learning (N=125), and drug-target interaction (N=68); these words represent the core content of drug repositioning.

Conclusion: The key focus of drug research and development is related to the discovery of new indications for drugs. Researchers are starting to retarget drugs after analyzing online databases and clinical trials. More and more drugs are being targeted at other diseases to treat more patients, based on saving money and time. It is worth noting that researchers need more financial and technical support to complete drug development.

Keywords: drug repositioning, drug discovery, bibliometric, citation analysis, trend analysis

Introduction

Drug repositioning is the identification of new indications for already developed and marketed drugs to treat new areas of disease not mentioned in the current specifications.¹ The discovery and development of novel drugs are estimated to cost hundreds of millions of dollars, take many years to develop and market and have a low success rate.^{2,3} It is a high-risk, high-investment process, and the pace of pharmaceutical R&D is failing to keep up with the needs of society.⁴ A drug target may play a role in several different diseases,⁵ or the drug may have multiple targets, each of which is associated with a different disease.⁶ Drug repositioning was first proposed in 2004 to increase the efficiency of drug development for pharmaceutical companies, finding new uses for and improving existing drugs.⁷ As research continues, the definition of drug repositioning has been expanded to include active substances that do not enter the clinical stage due to toxicity or poor efficacy and drugs that are withdrawn from the market for safety reasons.⁸ It is an emerging area of drug development that attracts an increasing number of scholars.

Drug repositioning has made significant progress in recent years of research. Many drugs have been repurposed from their original indications to new indications. For example, in recent years, due to the rapid spread of COVID-19, many anti-AIDS medicines have been repurposed to fight the virus. In addition, for rare diseases, tumors, tuberculosis, and other difficult-to-cure diseases, drugs on the market are screened from the gene bank for clinical trials to save development time. New uses for various types of drugs have been listed in the literature and are summarized below.

The most famous example is that of Sildenafil, which was repositioned as a critical drug for erectile dysfunction; initially, its side effect since its primary purpose had been the treatment of hypertension and angina.^{9,10} Rifampicin, an anti-tuberculosis drug, has been repositioned as an analgesic to relieve pain in joint cavities.¹ Eculizumab, initially indicated for uremia, has also been repositioned to treat myasthenia gravis.¹¹ Minoxidil has been repositioned for hypertension and hair loss prevention.^{12–14} Everolimus has been repositioned from transplant rejection prevention to treating tuberous sclerosis and inhibiting tumor growth.¹⁵ Verapamil and cimetidine are both inhibitors of CYP enzymes that inhibit the direct effects of Pgh1 and increase antimalarial activity.^{16,17} Even though they do not have antimalarial activity alone, they show synergistic effects when combined with antimalarials.¹⁸ Drug associations increase the success of repositioning. The use of combinations of drugs can provide synergistic effects, thereby reducing the risk of cytotoxicity being triggered when drugs are used alone; while also reducing the concentration of drugs being used.¹⁹ For example, the combination of Prednisone and Perphenazine, 6-Thiourea, can be used against histiocytosis.²⁰ Some studies have shown that Propranolol, used as a beta-blocker in combination with etodolac, reduces surgical and inflammatory stress responses and promotes tumor metastasis.²¹ The most notable example currently includes repositioning drugs initially used to treat diseases such as HIV and malaria to treat novel coronaviruses.^{22–24} Due to the global outbreak of the novel coronavirus, Hydroxychloroquine, combined with Azithromycin, has been proposed as a potential therapy.²⁵

Citespace is a literature visualization and analysis software that uses econometric analysis to create visual maps of particular literature, allowing analysis of the current state of research and inference of trends.²⁶ HistCite is a citation analysis tool that quickly maps trends in a given field and organizes the number of times articles are cited to identify critical research and scholars.²⁷ By analyzing a lot of data, it was found that these literature analysis tools could effectively show the correlation between articles, and obtained reliable data and clear pictures. They could summarize and analysis the literature with a large amount of data, which was beneficial for researchers to explore related fields.

There are many articles on drug repositioning. Most of the content provides examples of repurposing drugs or describes the methods and significance of drug repurposing. However, the use of bibliometric tools to analyze the content of recent articles has not yet been widely implemented. Therefore, this paper reviews thousands of pieces of literature, including keywords, authors, and research institutions. This step is essential. From the perspective of visual analysis, the associations between literature can be displayed through tables and figures, providing a scientific basis and data for future researchers studying this field.

Materials and Methods

Data Sources

Web of Science (WOS) is a primary source of citation information in bibliometric research. Associations between citations can be analyzed using this database. The total number of papers published in WOS exceeds those in Scopus, PubMed, China National Knowledge Infrastructure (CNKI), Chinese Social Science Citation Index (CSSCI), and other well-known databases. WOS also provides bibliometric software for general statistics and citation analysis. Many software and online sites only accept data exported from WOS, therefore our data were also filtered from the WOS database.

The core collection of the Web of Science database was searched with "drug repositioning" as the subject term and "repositioning drug;" "drug repurposing;" "repurposing, drug;" "rescue, drug" and "drug rescue" as synonyms for the search. The period was from January 1, 2001, to July 31, 2022. The investigation was conducted in August 2022, and 6215 articles were retrieved. The articles that met the requirements were obtained after removing those that did not.

Analytical Tools

Data from countries/regions, institutions, and journals were analyzed statistically and then visually, using HistCite software and the Journal Impact Factor (IF) from Journal Citation Report (2021). Using CiteSpace, keywords, related institutions, authors and journal citations can be parsed. By analyzing information about drug repositioning and constructing co-occurrence networks, the research foci and trends in related research in recent years can be determined.

When constructing the keyword and institution-related graphs for this study, CiteSpace 6.1.R2 was set to Slice=3, g-index k=25, to ensure that each time slice gets the same amount of node information. Set Purning to "Pathfinder;" "Purning sliced networks" and "Pruning the merged network". When constructing the literature co-citation network, the software parameters were set as Slice=1, Top N=30. No cropping was done to the network, The settings of other parameters are the same as those of the keyword.

Results

Literature Statistics

As shown in Figure 1, a total of 3814 documents were included through screening, classified into six types, from 102 countries and regions, 4670 institutions, 20,207 authors, and 993 journals, containing 6853 keywords written in seven languages. By calculating the global citation scores, 279 documents were found to have been cited more than 100 times.

As shown in Figure 2, no relevant research articles were published from 2001 to 2003, while the number of published articles increased annually since 2004, with 50 articles published before 2011 and 993 articles published in 2021, which is 19.86 times more than the total number before 2011. The first article was published in 2004 with a high Total Global Citation Score (TGCS), indicating that its content will be helpful for future research. The number of articles in 2011 and 2013 was not significant; TGCS was high due to the high scores of the articles, indicating that these two years were critical for research in this area. After 2019, although the number of articles was rising, the TGCS value was low, and this decline could be due to a lack of content innovation or minimal research significance.

Geographical Distribution of the Literature

The United States, China, India and the United Kingdom are relatively active in this area. Figure 3 shows that the United States has the highest number of publications, with 1097, accounting for 29.43% of the total publications retrieved. The top ten countries involved in the study are listed in Table 1, and it is evident that research institutes in Asia have contributed to many publications. Four Asian countries have 1522 publications, accounting for 39.90% of the total publications referred. The top three countries in terms of Average Citation Index (ACI) value were the USA, China, and India, which indicates that these three countries are at a more mature stage of development in this area with more valuable research content than other countries in this field.

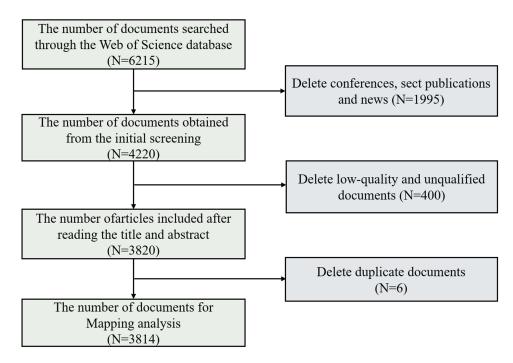


Figure I The process of literature screening.

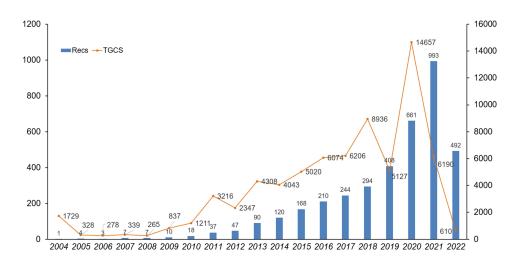


Figure 2 Yearly output and score.

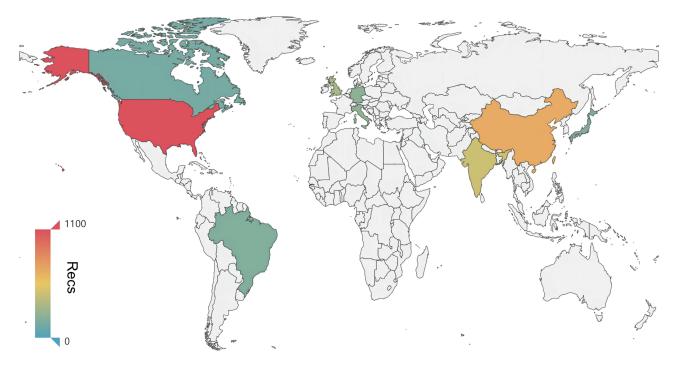


Figure 3 Distribution of global publications in the field of drug repositioning.

As shown in Table 2, the top institution in terms of the number of published articles, the Chinese Acad Sci (N=79, 2.07%), belonged to China, followed by Harvard Med Sch (N=57, 1.49%). The Case Western Reserve Univ had higher ACI values than the other institutions, indicating good article content and a high overall rating. Next were the NIH and Harvard Med Sch, with ACI values of 43.76 and 39.65, respectively. It is worth noting that although the number of publications from Chinese institutions is high, the average citation score is low, whereas the quality of literature published by institutions in the US is superior.

Analysis of Journals

Table 3 lists the top ten journals with the highest total global citation score (TGCS) in drug repurposing research. *NUCLEIC ACIDS RESEARCH* had the highest TGCS, but the number of its publications was small. This indicates that the articles published by *NUCLEIC ACIDS RESEARCH* were the most cited and studied, and their quality was more

Rank	Country	Region	Recs	Percentage	TGCS	ACI	h-Index
I	USA	North America	1097	29.43	30,680	27.97	94
2	China	East Asia	686	18.40	12,846	18.73	76
3	India	Southern Asia	422	11.32	4106	9.73	76
4	UK	Western Europe	324	8.69	7933	24.48	72
5	Italy	South Europe	240	6.44	4955	20.65	69
6	Germany	Central Europe	225	6.04	5533	24.59	65
7	South Korea	East Asia	224	6.01	2766	12.35	56
8	Japan	East Asia	190	5.10	2868	15.09	55
9	Brazil	South America	177	4.75	1944	10.98	67
10	Canada	North America	143	3.84	5366	37.52	59

Table I The Top 10 Productive Countries in the Studies

Abbreviation: Recs, records.

 Table 2 The Top 10 Institutions (Based on Records and TGCS, Respectively)

Rank	Institution	Country	Recs	TGCS	ACI
I	Chinese Acad Sci	China	79	1520	19.24
2	Harvard Med Sch	USA	57	2260	39.65
3	Univ Sao Paulo	Brazil	41	441	10.76
4	Cent South Univ	China	39	250	6.41
5	Univ Cambridge	UK	39	789	20.23
6	Case Western Reserve Univ	USA	38	2081	54.76
7	Kings Coll London	UK	38	640	16.84
8	NIH	USA	38	1663	43.76
9	Shanghai Jiao Tong Univ	China	38	506	13.32
10	Stanford Univ	USA	37	1895	51.22

valuable. It may be that due to the recent spread of COVID-19, more researchers have paid attention to the virus and increased their research efforts in nucleic acids. Among these journals, *SCIENTIFIC REPORTS* published the total number of papers (N=122, 3.20%), followed by *JOURNAL OF BIOMOLECULAR STRUCTURE & DYNAMICS* (N=107, 2.81%). The highest ACI value was for the *JOURNAL OF BIOMOLECULAR STRUCTURE & DYNAMICS* (4.43), followed by *BBRIEFINGS IN BIOINFORMATICS* (2.79) and the *JOURNAL OF CHEMICAL INFORMATION AND MODELING* (2.75). *NATURE* published only four relevant articles, but its high number of citations indicates that the content of the articles in this journal is good and valuable for research.

Figure 4 shows a double map overlay of journals. The left of the diagram represents citing journals, and the right side of the graph represents the relationship between the referenced journals. The orange and green lines indicate that articles published in Molecular/Biology/Immunology are mainly cited in Molecular/Biology/Genetics journals. The longer the horizontal axis of the ellipse, the more articles are published in the corresponding journal. The longer the vertical axis of the ellipse, the more authors there are. We found that articles in similar journals frequently cited each other, and the

Rank	Journal	Recs	TGCS	ACI	Feq	IF (2021)
I	NUCLEIC ACIDS RESEARCH	18	3077	2.17	1419	19.16
2	PLOS ONE	93	2588	2.11	1227	3.752
3	NATURE	4	2573	2.27	1135	69.504
4	NATURE REVIEWS DRUG DISCOVERY	5	2226	2.50	892	112.288
5	BIOINFORMATICS	59	2052	2.62	783	6.931
6	BRIEFINGS IN BIOINFORMATICS	65	1660	2.79	595	13.994
7	SCIENTIFIC REPORTS	122	1581	1.24	1278	4.996
8	PROCEEDINGS OF THE NATIONAL ACADEMY OF SCIENCES OF THE UNITED STATES OF AMERICA	19	1530	1.99	770	12.779
9	JOURNAL OF CHEMICAL INFORMATION AND MODELING	44	1423	2.75	518	6.162
10	JOURNAL OF BIOMOLECULAR STRUCTURE & DYNAMICS	107	1421	4.43	321	5.235

Table 3 The Top 10 Journals

relationship between molecular biology and immunology, and genetics was closely connected, which provided the basis for drug exploration and discovery.

Analysis of Cooperative Relationships

Figure 5 illustrates the collaborations between authors, institutions and countries. Figure 5A illustrates collaboration between countries, with the US having the most collaboration with other countries, followed by the UK and China. Figure 5B represents the collaborations between institutions. Each node on the plot represents an institution, with the size of the node indicating the number of articles published by the institution. The connecting lines between the nodes represent the collaborations between different institutions, with the thickness of the lines indicating the strength of those collaborations. The nodes are colored differently based on the publication periods. A higher centrality of a node indicates a greater level of cooperation with other institutions. Nodes with a centrality greater than or equal to 0.1 are enclosed by purple circles, such a node is considered to have high centrality. Currently, the highest centrality is Massachusetts General Hospital (N=16, Centrality=0.35), followed by NCI (N=25, Centrality=0.34) and Shanghai Jiaotong University (N=38, Centrality=0.32). Although these institutions do not publish many articles, they collaborate extensively with other

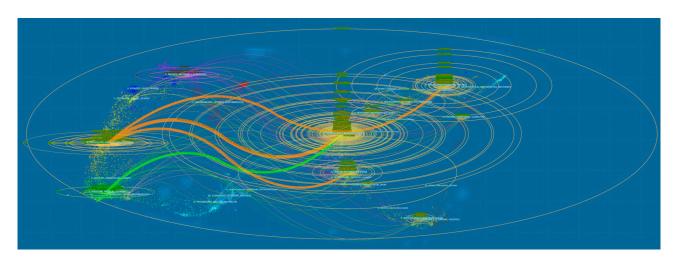


Figure 4 The dual-map overlay.

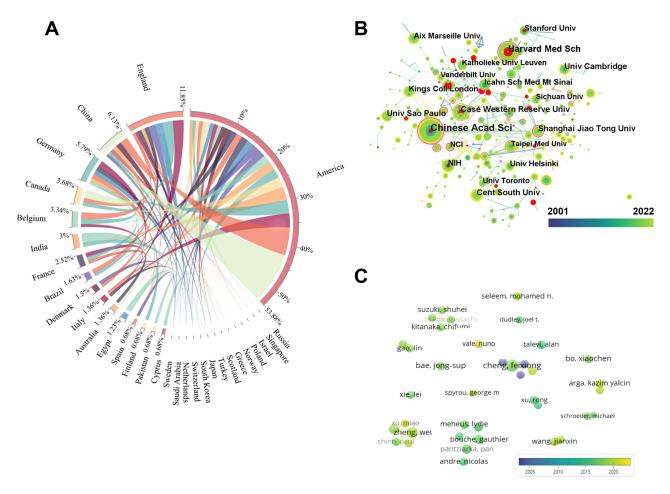


Figure 5 Map of cooperative networks among countries, researchers and institutions. (A) Academic cooperation networks between countries/regions; (B) Academic cooperation networks between institutions; (C) Academic cooperation networks between authors.

institutions. The majority of the top-ranked institutions are university institutions or research institutes, with hospitals being rare. This indicates a bias toward fundamental research in the drug repositioning area. Figure 5C represents the relationship between authors using VOSviewer.²⁸ Due to the large number of authors, only nodes with a high degree of collaboration are selected. The authors were selected based on the number of publications and the level of collaboration.

Keywords

The top five keywords in terms of frequency were "drug repositioning", "molecular docking", "virtual screening", "molecular dynamics" and "drug discovery." From the above statements, we can identify the main elements of the research direction as well as other important research areas of the central nodes. The visualization of high-frequency cooccurring words is presented in Figure 6A. Figure 6B shows the top ten most cited terms, which include "inflammatory bowel disease", "systems biology", "gene expression" and "drug-target interaction prediction." These words represent areas of research that have received significant attention and are indicative of trends and developments in this field. They are marked with red dots in Figure 6A. The information related to the top 20 high-frequency keywords are summarized in Table 4, which reflects the main keywords explored in recent literature.

Literature Co-Citation Analysis

Our aim was to identify the latest research trends by analyzing articles from recent years. When we searched the database to count the number of citations in the past three years, we found that the top ten articles were all published in 2020. Nine out of ten articles were related to the SARS-CoV-2 virus. Only one article explores the possibility of reusing

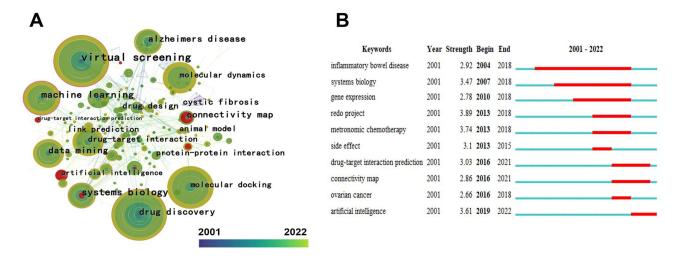


Figure 6 (A) networks of keyword in the studies; (B) The top 10 strongest strength citation burst.

antimicrobials as drugs by creating deep neural network models. The disease outbreak in late 2019 made the articles consistent in their research focus, with all of them eager to investigate the most urgently needed treatment options. The basic information of these articles is presented in Table 5.

To understand the connections between the articles, we conducted a co-citation analysis on them. During this analysis, we identified the top three most cited articles in the field of drug repositioning. We then performed a content analysis of these three articles and found that all three were representative of the field. The first article was related to the initiation of drug repositioning, while the second and third articles were focused on treatment methods and the type of medication used for the SARS-CoV-2 virus. These articles continue to be highly influential.

Co-citation analysis of the included literature and co-citation network was obtained and clustered to obtain Figure 7.^{2,3,29–64} The different colors represent the different clustering blocks, including nine significant clusters: #0 predicting drug-disease association; #1 CoV-2 main protease; #2 chemical-protein interactome; and #3 CoV-2 infection. Table 6 shows the representative articles in each clustering block,^{38,65–72} that are highly cited or have high TGCS scores. It also shows the importance of these articles for the researchers. The representative articles employ different approaches, such as bioinformatic analysis or deep learning for retargeting of drugs. Potential drugs are discovered through analysis

Rank	Keywords	Count	Centrality	Rank	Keywords	Count	Centrality
I	Drug repositioning	1904	1.2	П	Drug resistance	37	0.08
2	Molecular docking	223	0.11	12	Gene expression	30	0.04
3	Virtual screening	170	0.22	13	Connectivity map	27	0.03
4	Molecular dynamics	139	0.02	14	Artificial intelligence	24	0.02
5	Drug discovery	126	0.19	15	Combination therapy	21	0.03
6	Machine learning	125	0.08	16	Chagas disease	18	0.01
7	Drug-target interaction	68	0.07	17	Candida albican	18	0.02
8	Data mining	50	0.05	18	Antiviral drug	17	0.02
9	Alzheimer's disease	49	0.09	19	Precision medicine	16	0.01
10	Systems biology	46	0.09	20	Trypanosoma cruzi	16	0.01

 Table 4 The Top 20 Keywords in the Studies

TGCS	First Author	Title	Year	Journal
1323	Gordon DE	A SARS-CoV-2 protein interaction map reveals targets for drug repurposing	2020	NATURE
1070	Wu CR	Analysis of therapeutic targets for SARS-CoV-2 and discovery of potential drugs by computational methods	2020	ACTA PHARMACEUTICA SINICA B
736	Zhou YD	Network-based drug repurposing for novel coronavirus 2019- nCoV/SARS-CoV-2	2020	CELL DISCOVERY
658	Liu C	Research and Development on Therapeutic Agents and Vaccines for COVID-19 and Related Human Coronavirus Diseases	2020	ACS CENTRAL SCIENCE
476	Elfiky AA	Ribavirin, Remdesivir, Sofosbuvir, Galidesivir, and Tenofovir against SARS-CoV-2 RNA dependent RNA polymerase (RdRp): A molecular dockingstudy	2020	LIFE SCIENCES
409	Stokes JM	A Deep Learning Approach to Antibiotic Discovery	2020	CELL
305	Fantini J	Structural and molecular modelling studies reveal a new mechanism of action of chloroquine and hydroxychloroquine against SARS-CoV-2 infection	2020	INTERNATIONAL JOURNAL OF ANTIMICROBIAL AGENTS
300	Jeon S	Identification of Antiviral Drug Candidates against SARS-CoV-2 from FDA-Approved Drugs	2020	ANTIMICROBIAL AGENTS AND CHEMOTHERAPY
297	Beck BR	Predicting commercially available antiviral drugs that may act on the novel coronavirus (SARS-CoV-2) through a drug-target interaction deep learning model	2020	COMPUTATIONAL AND STRUCTURAL BIOTECHNOLOGY JOURNAL
269	Wang JM	Fast Identification of Possible Drug Treatment of Coronavirus Disease-19 (COVID-19) through Computational Drug Repurposing Study	2020	JOURNAL OF CHEMICAL INFORMATION AND MODELING

Table 5 The Top 10 Most Cited Articles

of drug and disease targets. Re-dosing for the treatment of the novel coronavirus and drug combinations to improve therapeutic outcomes have also been foci of research in recent years.

Discussion

Based on the literature analysis, it is clear that among the 3814 articles, there has been a significant increase in the quality and quantity of articles published after 2011. Furthermore, there is cooperation between countries, particularly between China and the United States, and the papers are highly cited. Most of the research is carried out through collaborations between schools and institutes. However, most co-authors reside in the same country, and there are not many collaborations between domestic and foreign scholars. The main focus of the literature revolves around drug repositioning, discoveries, and gene expression, which are all current research topics in this field. There are many citations between journals, and the top cited articles are periodic, with excellent research significance, deserving the attention of researchers.

We used data analysis software to identify the top three cited articles, which have had a significant impact on the field of drug repositioning and contain high-quality content that will be useful for future research.

Ashburn TT and Thor KB published "Drug Repositioning: Identifying and Developing New Uses for Existing Drugs" in 2004. This article was cited the most (N=1729) and was the first one to be published in this field. It analyzed the major pharmaceutical companies at the time, which were trying to improve productivity and create new uses for existing drugs. This resulted in shortened development times and reduced risk. The article also provided several examples of successful drug repositioning, including duloxetine for stress-related urinary incontinence and depression, dapoxetine for premature

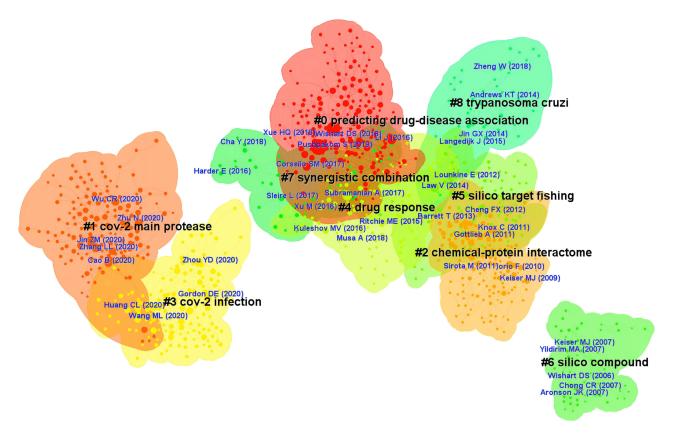


Figure 7 The cluster map of document co-citation.

ejaculation, and thalidomide, which was found to be a tumor necrosis factor inhibitor once again.⁷ The article analyzes the obstacles that may be encountered and suggests ways to overcome them. It marks a significant beginning for the field of drug repositioning, as a SARS-CoV-2 protein interaction map has revealed potential targets for drug repurposing. In the citation index, the article by Gordon DE, Jang GM, Bouhaddou et al which targets the SARS-CoV-2 virus, came in second place (N=1323). Mass spectrometry identified 332 high-confidence protein interactions with human proteins, as well as sixty-six druggable human proteins or host factors from 69 compounds. Two sets of pharmacological agents that show antiviral activity to combat the virus were also identified.³⁷ In 2020, Wu CR, Liu Y, Yang YY, Zhang P, Zhong et al published an analysis of therapeutic targets for SARS-CoV-2 and discovered potential drugs using computational methods. Their article was the third most cited (N=1070) on the treatment of the SARS-CoV-2 outbreak in Wuhan, China, in late 2019. The authors systematically analyzed the genetic code of the virus, predicted the target structure, and screened eligible drugs using currently available databases of antiviral drugs. One application of drug repositioning is to use already-marketed drugs to treat sudden unknown viruses or novel diseases.⁵⁷

Table 5 summarizes the top 10 articles based on the number of citations. The reason for the high number of citations and the seriousness with which these articles have been taken is the rapid spread of the SARS-CoV-2 virus at the end of 2019, as well as the extremely harmful nature of the virus. As people are pressed for time, a more effective and faster treatment method involves retargeting and screening the existing antiviral drugs to identify the most appropriate ones. In subsequent results, we found that this method was effective in curbing the spread of the virus. Researchers are still fighting viruses through various research methods, such as mass spectrometry analysis, protein data screening, and molecular docking simulation binding in drug libraries. By combining existing drugs with new scientific and technological means, more updated discoveries in the field of new virus research are expected.

Our analysis of the top 10 cited articles revealed that the majority were related to the SARS-CoV-2 virus. However, drug repositioning is applicable to multiple diseases, not only viral infections. Therefore, we selected ten articles from the top 100 cited articles, based on disease type and citation count. All of these articles focus on the process and significance

Cluster	Coverage	TGCS	Title	First Author	Year
0	186	31	Saverunner: a network-based algorithm for drug repurposing and its application to covid-19.	FISCON, G	2021
I	160	8	Covid-19 therapy: what weapons do we bring into battle?	De Almeida SMV	2020
2	160	99	Old friends in new guise: repositioning of known drugs with structural bioinformatics.	haupt, v	2011
3	106	736	Network-based drug repurposing for novel coronavirus2019-nCoV /SARS-CoV-2	Zhou, YD	2020
4	109	40	Individualized network-based drug repositioning infrastructure for precision oncology in the panomics era	CHENG, F	2017
5	62	435	PREDICT: a method for inferring novel drug indications with application to personalized medicine	Gottlieb A	2011
6	63	20	Drug repositioning using in silico compound profiling.	DUBUS, E	2009
7	46	28	Improving therapy of severe infections through drug repurposing of synergistic combinations.	CHENG, Y	2019
8	44	43	Niclosamide and its analogs are potent inhibitors of wnt/beta-catenin, mtor and stat3 signaling in ovarian cancer.	AREND, R	2016

Table 6 Key Articles in Each Cluster

of drug repurposing in various conditions. Figure 8 displays the articles and their basic information. These articles provide valuable insights into the field of drug repurposing.

In terms of cancer, repositioning of combination enhanced tumor treatment and prevention and reduced drug resistance and toxicity.⁷³ Target profiles of kinase inhibitors were analyzed by proteomics, suggesting potential therapeutic uses. Cabozantinib could be used to treat acute leukemia.⁷⁴ In terms of enteropatia, many targeted drugs have been proven to have a particular effect on intestinal bacteria, reusing non-antibiotic treatment, broadening the research field of antibiotic resistance, and effectively avoiding side effects.⁷⁵ The authors used gene expression databases to reintegrate drugs for inflammatory bowel disease. Topiramate was used as an example because of its high score after the screening, and it was experimentally proved to have the potential to be used in inflammatory bowel disease.⁷⁶ In terms of tuberculosis (TB), through whole-cell screening methods, new anti-TB drug candidates could be identified, anti-TB drugs could be redirected from existing antibacterial drugs, the efficiency of drug production and development could be improved, and the reused drugs could be used in combination to increase efficacy.⁷⁷ In terms of osteoporosis, before 2000, osteoporosis drugs were discovered mainly based on animal experiments or clinical observation. In recent years, driven by basic bone biology experiments, new drugs have been explored through treatment schemes such as rare bone diseases.⁷⁸ In terms of parasitosis, due to the increasing drug resistance of parasitic diseases in recent years, existing drugs were insufficient to control the global spread of the disease. High-throughput screening of compounds in the database, such as antineoplastic drugs, antibiotics, and antifungal drugs. Repurposing drugs or developing new drug combinations was the best approach.²⁹ Regarding cerebrosis, MMP-9 inhibitors had essential significance in treating ischemic strokes, such as neuroprotection and extension of the thrombolytic window. These included biotherapies using viral vectors, an endogenous inhibitor of MMP-9, repurposing of old drugs such as Minocycline, new chemical entities like DP b99, and other therapeutic approaches like therapeutic hypothermia.⁷⁹ There were three methods for treating Alzheimer's Disease (AD): one was to develop molecular target drugs corresponding to the pathogenesis, the second was to treat AD as a combination of multi-target medications, and the third was to reposition existing drugs in AD to promote the success of clinical trials.⁸⁰ In terms of psychological illness, genome-wide association studies have been conducted on thousands of people to screen genes and drug targets related to bipolar disorder through the identified genomic loci.

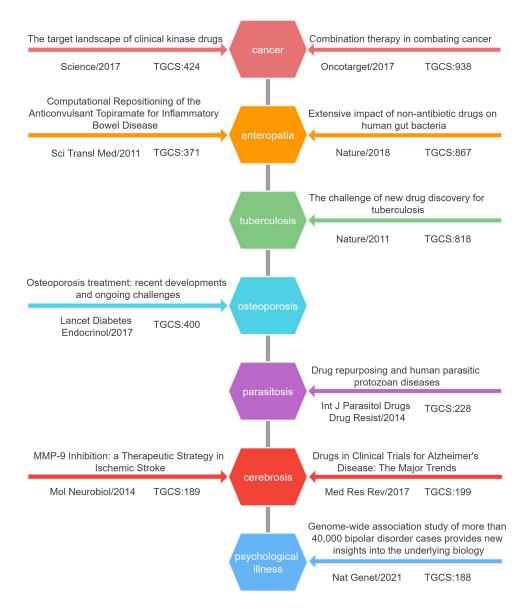


Figure 8 Different diseases with the strongest impact of TCGS in the top 100 literature.

These new data may allow investigators to select the drugs available to treat bipolar disorder and perform different drug combinations.⁸¹

We have learned that there are five broad pathways for drug repositioning. The first one is when a drug is found to be effective in treating another disease by chance. For example, Aspirin was originally marketed as an analgesic, but it was later discovered by researchers to also have anti-platelet coagulation properties in serendipitous discovery;⁸² Dimethyl Fumarate was initially used as a treatment for psoriasis, but it has now also been repurposed to treat autoimmune diseases,⁸³ and Thalidomide has been redirected to treat multiple myeloma.⁸ The second pathway is the discovery of drugs with a new activity, such as Nelfinavir, an HIV protein inhibitor that is now a potent broad-spectrum antitumor agent.⁸⁴ The third approach is where pathways are re-identified. For example, Duloxetine was initially used as an antidepressant. However, the discovery that Serotonin and Norepinephri. The second pathway involves discovering drugs with new activities. For instance, Nelfinavir was originally developed as an HIV protein inhibitor, but it has now been repurposed as a potent broad-spectrum antitumor agent.^{85,86} The fourth pathway involves discovering that the protein targeted by a drug is also implicated in treating another disease. For example, Everolimus has been repurposed to treat

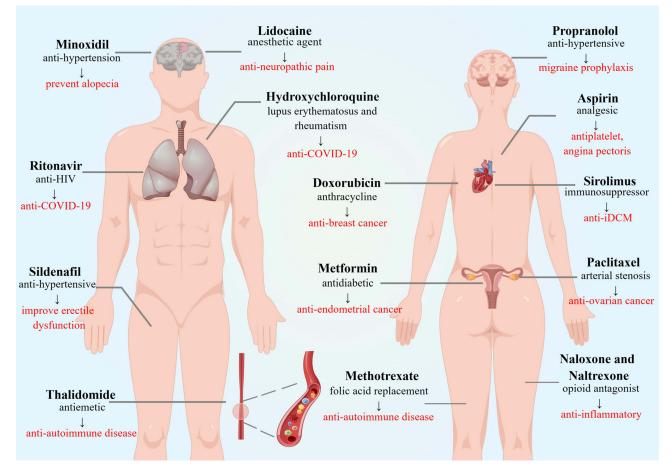


Figure 9 Examples of drug repositioning at different sites are presented.

breast cancer based on the discovery that the protein it targets is also involved in the development of this disease;⁸⁷ and a fifth pathway is the unexpected discovery of side effects in clinical trials, such as what occurred with Sildenafi.^{10,88,89}

Drug repositioning examples were summarized employing in Figure 9 by Figdraw. The selected drugs were searched in databases, and the top-ranked drugs were presented according to the number of relevant studies and citations.

Lidocaine was initially used as an anesthetic agent for surgical procedures, but it was later discovered also to have the ability to inhibit neuropathic pain. Metformin, developed originally as a classical antidiabetic agent, has been repurposed as an analgesic in treating endometrial cancer. Naloxone and Naltrexone, initially created as opioid antagonists, have also been repurposed as anti-inflammatories that act systemically. Propranolol, Sildenafil, and Minoxidil were all antihyper-tensive and were later used for migraine prevention, erectile dysfunction, and hair loss prevention. Ritonavir had been used for anti-HIV. Hydroxychloroquine was used to treat lupus erythematosus and rheumatism, and later, it was used to fight the new disease due to the onset of SARS-CoV-2. Sirolimus and Aspirin were later used for cardiovascular diseases. Thalidomide and Methotrexate, formerly antiemetic and folic acid replacement, had been reintroduced as drugs for treating autoimmune diseases. Doxorubicin, an anthracycline drug, was originally used as a chemotherapy agent for cancer treatment. Paclitaxel, on the other hand, was initially used to treat arterial stenosis but was later found to be effective against tumors. Many targeted drugs have been repurposed from drugs that were already on the market, demonstrating the potential of drug repositioning. This strategy is based on the idea that different diseases can be linked trough the drugs used to treat them. Interestingly, many seemingly unrelated diseases can be linked through the drugs used to treat them. Figure 10 provides a visualization of these relationships. The yellow part of the figure represents the main disease types for which the drug is re-utilized. The pink section is the original disease type. Blue represents

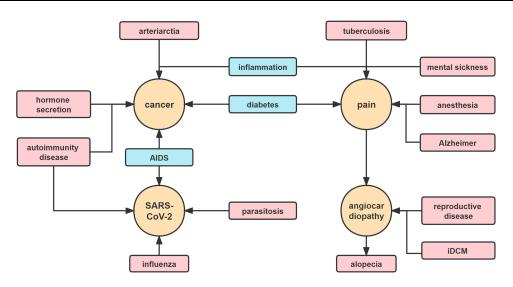


Figure 10 Relationships between different diseases.

disease drugs that can be used for a variety of new diseases. The arrow direction is from the old disease type to the new disease type.

Drug repositioning has the potential to treat diseases in various parts of the body, and many drugs that have been repositioned by researchers have played a significant role in treating new disease areas. These drugs deserve focused attention, as they only represent a small fraction of the drugs that have been rediscovered for new uses. As more efforts are focused on repurposing drugs, an increasing number of drugs are in the experimental development stage for new applications. It is expected that more drugs will be redefined for clinical use in the future.

The advantages of drug repositioning are two-fold. Firstly, by using already available drug ADMET data, the preclinical study phase can be omitted, saving both time and money in drug development while reducing risk and increasing revenue. This is because the drug has already undergone preclinical studies during its initial development for another indication. Secondly, experimental validation may not be necessary by analyzing drug targets and screening relevant drug candidates based on available databases, which have been calculated from large amounts of data. This saves time and resources that would have been required for experimental validation.^{90,91} While drug repositioning has numerous advantages, there are also some shortcomings. One such challenge is the difficulty in patenting drugs that have been repositioned, particularly when the drug is already trademarked based on its initial indication. This can make it challenging for pharmaceutical companies to recoup their investment in drug development and limit the incentive for further research in this area.⁹² Another challenge with drug repositioning is that developing drugs for new indications requires significant funding and expertise, which can be difficult for small drug development companies to address. Small companies may not have access to the necessary resources or expertise required to conduct the extensive research and clinical trials needed to gain regulatory approval for a repositioned drug. As a result, this may limit the number of drugs that are repositioned, as larger pharmaceutical companies may be better equipped to handle the financial and regulatory demands of drug development.^{93,94} Many countries do not provide sufficient funding despite their enthusiasm for drug development breakthroughs. This has led to a year-on-year decline in the rate of drug development.

Conclusion

Upon review of the literature, it was observed that many studies employed network analysis to predict new targets, pathways, and localizations for repositioned drugs.^{95–97} Lotfi Shahreza M et al predicted drug repositioning from different aspects by analyzing other databases and utilizing software involved in generating metabolic networks, molecular interaction networks, gene regulatory networks, and protein interaction networks.^{98–101} Matching the prediction results with clinical or experimental studies shortens the study duration and helps treat unknown diseases, but there are shortcomings. Network analysis is biased towards using old drugs with multiple uses and significant side effects.

However, the data related to side effects are unbalanced and still need to rely on extracting clinical performance from cases, which is the right direction for future research.^{102–105}

In this study, we conducted a bibliometric analysis of literature related to drug repositioning retrieved through the Web of Science database using Citespace, HistCite, and VOSviewer,^{106–108} and performed a quantitative and qualitative analysis of the research contributions of different countries, institutions, journals, and authors in the field in recent years. The strength of this paper lies in unearthing the development of the discipline through analysis of the literature in recent years and identification of the distinct periods of publication and critical authors and their articles. It also provides a clear picture of the current research trends and research foci in the field,^{109,110} thereby providing a background for future researchers to study drug repositioning. The drawback is that only the Web of Science database was searched, and no other databases were used. Some unpublished or ongoing publications have not been explored, which may lead to incomplete data statistics. Lastly, there are limitations as only the popular trends in the literature were analyzed, which need to be refined with clinical information. The development of drug repositioning will be continuously followed up.

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The authors declare that the research was conducted without any commercial or financial relationships construed as a potential conflict of interest.

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