

# Bibliometric Analysis of Publications on Clinical Studies Leveraging Natural Language Processing During 2000 - 2023

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**ABSTRACT** The number of clinical studies using natural language processing is quite large. Therefore, it is important to examine in depth the development of clinical studies using Natural Language Processing over the years. However, there are a limited number of studies in the literature examining the research status of this field. The article presents a bibliometric analysis of studies on the keywords "clinical AND studies AND natural AND language AND processing" indexed in Scopus between 2000 and 2023. This study aims to evaluate academic outputs in the relevant field quantitatively, make sense of the data, reveal the state of scientific knowledge in the field, and give scientists a general perspective on the subject. Bibliometrix and Microsoft Excel programs were used for bibliometric analysis. Nineteen thousand two hundred seventy-three different authors identified a total of 4535 studies. 77.5% of these studies were research articles (3516), 14.8% were conference papers (669), 6.8% were reviews (307), and 0.9% were book chapters (43). Journal of Biomedical Informatics was the journal in which the most studies were published, with 226 articles. Only the United States (2637) contributed 58.1% to the studies. Liu, H. was the most prolific author, with 85 articles. Harvard Medical School was the most productive institution, with 304 studies. The most cited article was Discontinuation of Statins in Routine Care Settings, A cohort study.

## KEYWORDS

Clinical studies  
Natural language processing  
Bibliometric analysis  
Citation analysis  
Network analysis

## INTRODUCTION

Natural Language Processing (NLP) is a branch of artificial intelligence and linguistics that enables computers to understand expressions or words written in human languages (Khurana *et al.* 2023). In the 1950s, NLP initially focused on rule-based methods to enable computers to understand natural language. However, these insufficient methods have transformed over time with the developments in machine learning methods (Nadkarni *et al.* 2011). NLP studies have recently been included in various fields, such as machine translation, e-mail spam detection, information extraction, summarization, and medical question-answering (Khurana *et al.* 2023).

Most clinical information sources contain significant amounts of information. But most of this information comes in unstructured form (Meystre and Haug 2005). NLP is extremely important in transforming unstructured information into structured information, improving healthcare, and advancing medicine (Wang *et al.* 2017). NLP has applications in medical information processing and rich research achievements (Chen *et al.* 2018). NLP medical applications include numerous research topics, such as its use for mental health (Le Glaz *et al.* 2021; Corcoran and Cecchi 2020), extraction of structured information from radiology reports (Casey *et al.* 2021), coding clinical notes (Tavabi *et al.* 2022), and monitoring Alzheimer's disease (Garcia *et al.* 2020).

NLP has significant potential in clinical trials. This technology is expected to help increase the efficiency and effectiveness of medical research. NLP-supported medical research is rapidly increasing and becoming more attractive. However, there are a limited number of studies examining the research status of clinical studies on NLP. Therefore, it is essential to conduct an in-depth

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analysis to understand the latest developments in this field. This study aims to examine the academic output of NLP in clinical studies.

Bibliometric analysis is a field of research that deals with numerical analysis of scientific literature, used to search and analyze comprehensive scientific data. This analysis may include research publication frequency, citations, authors, and topics. The state of the art in a field of current scientific knowledge can be mapped using bibliometrics. Bibliometrics is an important tool for analyzing the output of scientists, collaborations between universities, the effects of science funding on research and development performance, and educational productivity. Therefore, theoretical and practical tools are needed to measure experimental data. Bibliometric analysis has increased in popularity in recent years as the availability and accessibility of software such as Gephi, Leximancer, VOSviewer, and Bibliometrix and scientific databases such as Scopus and Web of Science have increased. Bibliometric analysis can measure research outputs, identify trends, and evaluate research performance (Akmese 2022; Falagas et al. 2006; Moral-Muñoz et al. 2020; Sengupta 1992; Donthu et al. 2021).

Bibliometric methods are now considered scientific expertise and have become integral to research evaluation methodology, especially in scientific and applied fields (Ellegaard and Wallin 2015). Bibliometric methods are often used to process data (Wallin 2005). These methods have greatly benefited from computerized data processing. Accordingly, there has been a great increase in the number of publications in this field in recent years. Increasing data volume and more widespread use of computers were effective in this increase (Ellegaard and Wallin 2015).

This study covers top journals, institutions, keyword features in the field, citation network analysis, and review of top articles, and offers the potential to illustrate historical and geographic trends. This study aims to make sense of the large number of data obtained, to quantitatively evaluate the academic outputs of relevant research, to provide scientists in this field with a general perspective on the subject, and to reveal the state of scientific knowledge.

This study can make various contributions to the field of research in question. It can provide domain experts with a comprehensive overview of the research topic. It can help better understand research outcomes. In addition, it can provide researchers with the most important information about potential authors, institutions, journals, and countries. It can help identify research trends or track the popularity and importance of topics. Moreover, it can increase researchers' awareness when deciding on topic selection. It can also help improve the quality and efficiency of research. Finally, it can explain how the topic has developed over time.

## MATERIAL AND METHODS

The Scopus database was preferred to collect bibliometric information. All journals in the Scopus database are reviewed annually to maintain high-quality standards (Kokol et al. 2021). It has been determined that Scopus offers its users a more comprehensive journal profile than other databases and provides faster results from more articles in citation analysis.

All publications indexed in Scopus (access date: 18.12.2023) between 2000 and 2023 regarding clinical studies using natural language processing were analyzed using bibliometric methods. "clinical AND studies AND natural AND language AND processing" were used as search keywords. Documents were searched by article title, abstract, and keywords. Scopus codes used in the search are as follows: TITLE-ABS-KEY ( clinical AND studies AND natural AND language AND processing ) AND PUBYEAR > 1999

AND PUBYEAR < 2024 AND ( LIMIT-TO ( DOCTYPE , "ar" ) OR LIMIT-TO ( DOCTYPE , "cp" ) OR LIMIT-TO ( DOCTYPE , "re" ) OR LIMIT-TO ( DOCTYPE , "ch" ) )

This search method found all articles published between 2000 and 2023 in the studies' title, abstract, and keywords in the Scopus database. The number of studies may increase when 2023 is completed. Microsoft Excel and Bibliometrix (Aria and Cuccurullo 2017) were used for bibliometric network visualizations.

## ANALYSIS

### Literature Distribution

Four thousand five hundred thirty-five publications of different genres from 2000 to 2023 were evaluated. These publication types are articles (3516, 77.5%), conference proceedings (669, 14.8%), reviews (307, 6.8%), and book chapters (43, 0.9%).

As seen in Figure 1, clinical studies using Natural Language Processing, "Medicine" (3534, 45%), "Computer Science" (1113, 14%), "Health Professions" (584, 7%), "Engineering" (536, 7%), "Biochemistry, Genetics and Molecular Biology" (435, 6%), "Neuroscience" (275, 3%) and "Others" (1431, 18%). The total number of studies is more than 4535 because a study can be matched in more than one category.

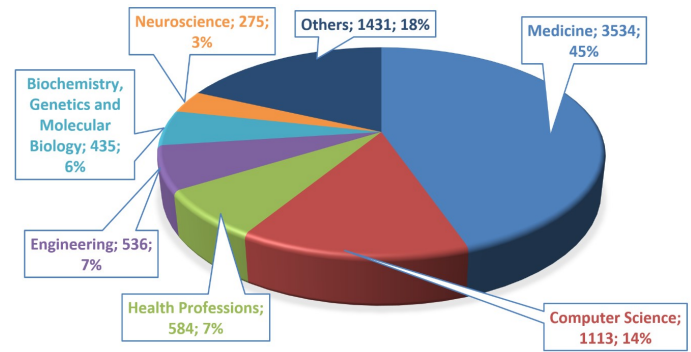


Figure 1 The distribution of subject areas

### Development of Publications

The annual production graph of scientific studies of 4535 studies is shown in Figure 2. Despite some fluctuations, there has been an increase in the number of scientific studies in general. It is seen that the number of studies decreased in 2016. In the following years, the number of publications tends to increase continuously.

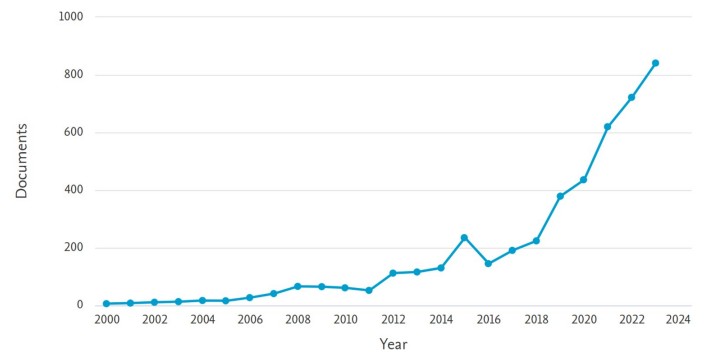


Figure 2 Document by year

### Active Authors

Nineteen thousand two hundred seventy-three authors produced a total of 4535 works. The top five producing authors are Liu H. (85, 1.9%), Xu H. (74, 1.6%), Denny J.C. (47, 1%), Stewart R. (44, 1%), and Wu Y. (41, 0.9%). These authors were important research pioneers in their respective fields. Figure 3 shows the top 15 authors with the highest number of studies.

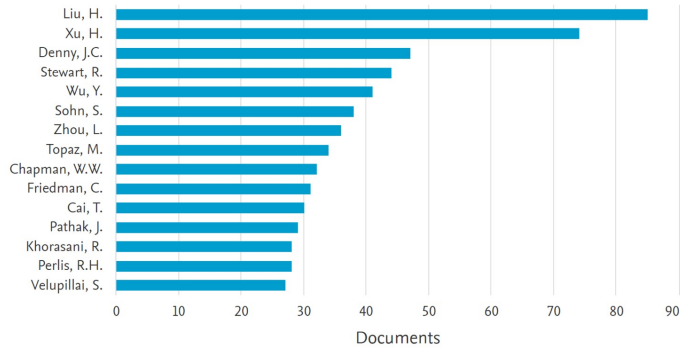


Figure 3 Top 15 authors with the highest number of studies

The collaboration network of the top 50 authors is shown in Figure 4. The size of the circles is directly proportional to the number of studies and collaboration between authors. Colors represent different clusters. The thickness of the lines expresses the strength of the collaboration between writers.

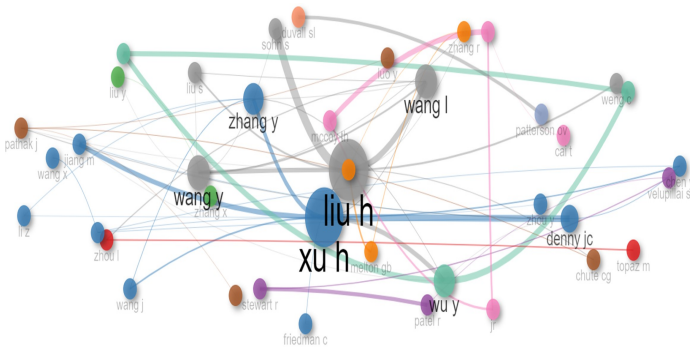


Figure 4 Authors Collaboration Network

### Active Affiliation

The top 5 institutions that contributed the most to the literature were Harvard Medical School (304, 6.7%), Brigham and Women’s Hospital (196, 4.3%), Massachusetts General Hospital (173, 3.8%), Mayo Clinic (169, 3.7%) and The University of Utah (137, 3%). Figure 5 shows the top 15 institutions that contributed the most according to the number of studies published by the institutions in the 2000-2023 period.

The collaboration network of the top 50 institutions is seen in Figure 6. The size of the circles is directly proportional to the number of studies and cooperation between institutions. Different colors represent clusters. The thickness of the lines expresses the strength of cooperation between institutions.

### Active Journals

Table 1 shows the top 25 journals with the highest *h\_index*. A total of 4535 studies were published in 1335 sources. 18.9% of the

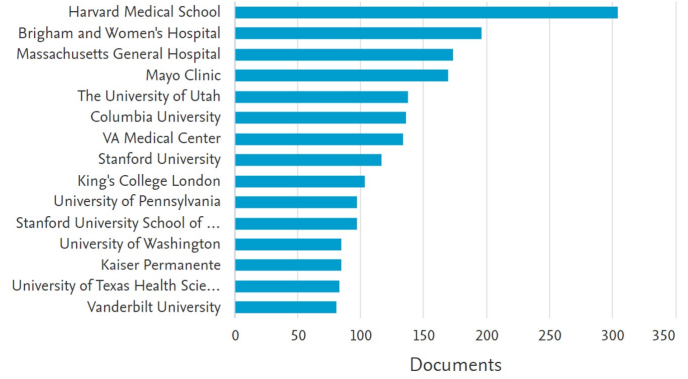


Figure 5 The top 15 organizations that contribute the most, according to the number of studies

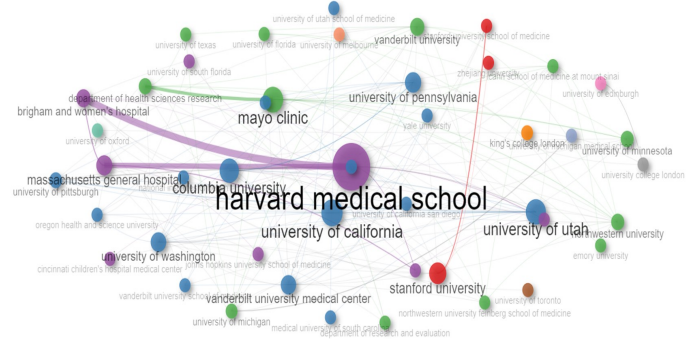


Figure 6 Institutions collaboration network

studies consist of the first five sources, and 38.5% comprise the 25 sources in Table 1.

Figure 7 shows the increase in the number of publications of the top five journals according to their number of publications between 2000 and 2023. According to the chart, the Journal of Biomedical Informatics, Journal of the American Medical Informatics Association, Studies In Health Technology and Informatics, Journal of Medical Internet Research, and Jmir Medical Informatics sources are the most productive.

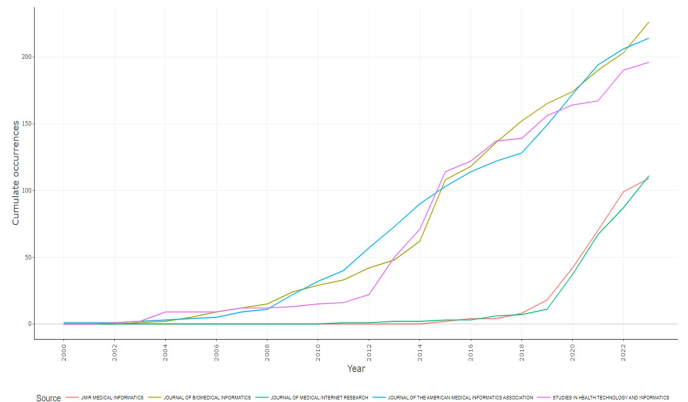


Figure 7 Top 5 journals with the highest number of articles

■ **Table 1 Top 25 journals with h-index**

No	Journal	h-index	g-index	m-index	TC	NP	PY_start
1	JOURNAL OF THE AMERICAN MEDICAL INFORMATICS ASSOCIATION	53	90	2.208	9816	214	2000
2	JOURNAL OF BIOMEDICAL INFORMATICS	50	80	2.381	8374	226	2003
3	INTERNATIONAL JOURNAL OF RADIATION ONCOLOGY BIOLOGY PHYSICS	34	56	2.125	3228	65	2008
4	INTERNATIONAL JOURNAL OF MEDICAL INFORMATICS	27	44	1.286	2279	97	2003
5	BMC MEDICAL INFORMATICS AND DECISION MAKING	26	43	1.3	2241	94	2004
6	AMIA ... ANNUAL SYMPOSIUM PROCEEDINGS / AMIA SYMPOSIUM	26	39	1.368	1889	90	2005
7	PLOS ONE	25	37	1.786	1668	94	2010
8	JOURNAL OF MEDICAL INTERNET RESEARCH	23	38	1.769	1785	111	2011
9	JMIR MEDICAL INFORMATICS	19	33	2.111	1383	109	2015
10	STUDIES IN HEALTH TECHNOLOGY AND INFORMATICS	16	29	0.727	1353	196	2002
11	RADIOLOGY	15	16	0.682	1656	16	2002
12	BMJ OPEN	13	32	1.444	1053	49	2015
13	AMIA ... ANNUAL SYMPOSIUM PROCEEDINGS. AMIA SYMPOSIUM	13	24	0.929	644	45	2010
14	ARTIFICIAL INTELLIGENCE IN MEDICINE	13	22	0.619	511	41	2003
15	JOURNAL OF THE AMERICAN COLLEGE OF RADIOLOGY	13	20	0.813	438	28	2008
16	JCO CLINICAL CANCER INFORMATICS	12	18	1.714	386	41	2017
17	METHODS OF INFORMATION IN MEDICINE	12	17	0.667	326	31	2006
18	COMPUTERS IN BIOLOGY AND MEDICINE	12	24	0.632	628	30	2005
19	COMPUTER METHODS AND PROGRAMS IN BIOMEDICINE	11	14	0.733	221	18	2009
20	BMC BIOINFORMATICS	11	17	0.647	490	17	2007
21	JAMA NETWORK OPEN	10	18	1.667	371	32	2018
22	NPJ DIGITAL MEDICINE	10	19	1.667	454	19	2018
23	JAMIA OPEN	9	14	1.5	253	34	2018
24	APPLIED CLINICAL INFORMATICS	9	14	0.643	241	26	2010
25	IEEE JOURNAL OF BIOMEDICAL AND HEALTH INFORMATICS	9	18	1	324	21	2015

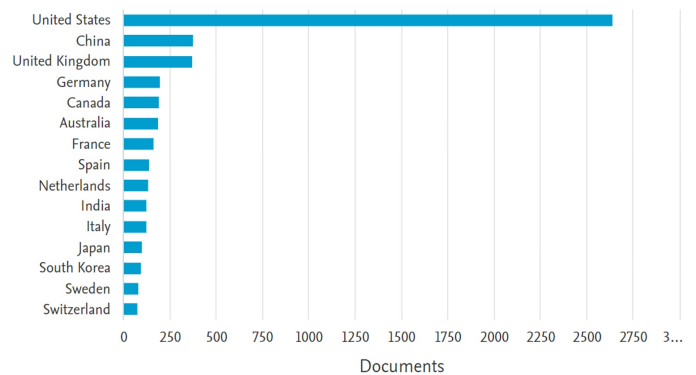
TC: Total Citation, NP: Number of Publication, PY\_start: Start of Publication Year

**Active Countries**

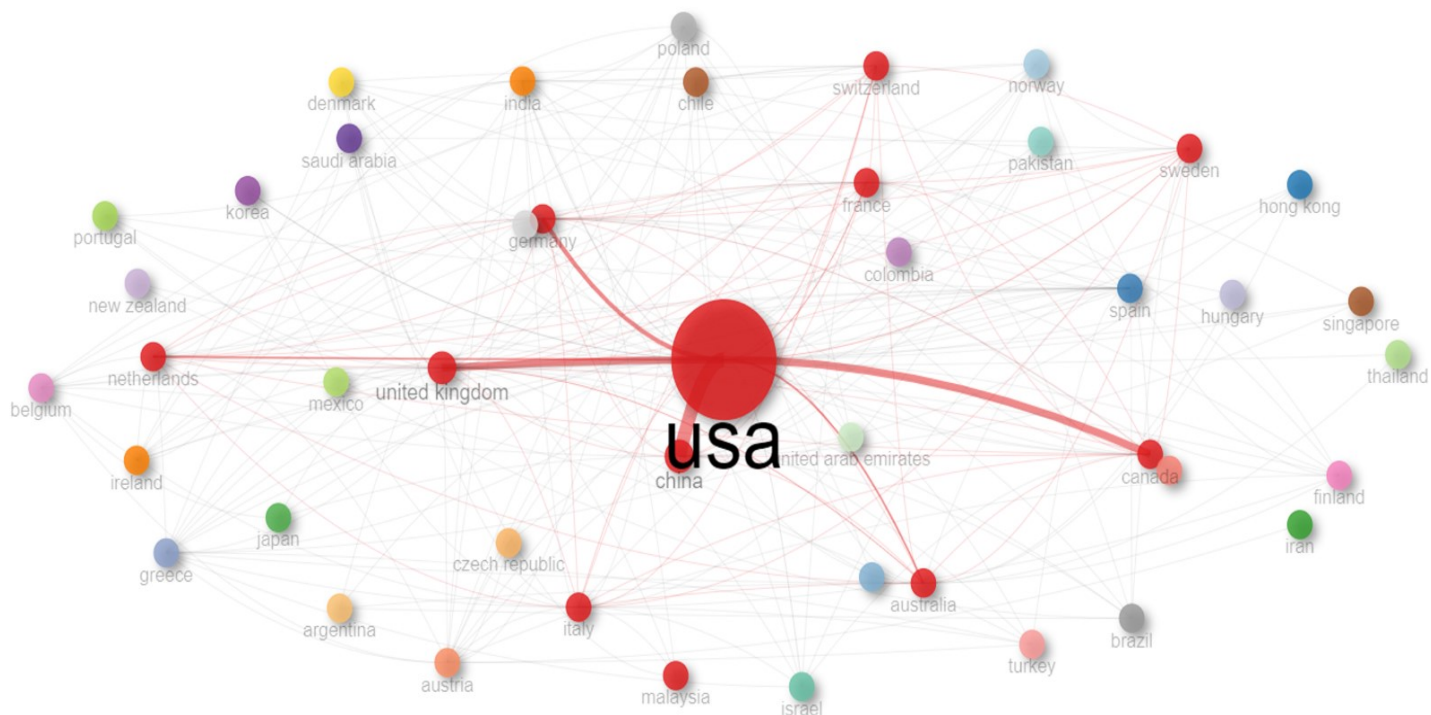
Analysis showed that the articles covered 95 countries or territories. The publication numbers of the first 15 countries are shown in Figure 8. The United States ranked first with 2637 (58.4%) studies, considering the number of publications. China ranked second with 374 (8.3%) studies. The United Kingdom ranked third with 366 (8.1%) studies. Germany ranked 4th with 194 (4.3%), and Canada ranked 5th with 191 (4.2%).

The network visualization map for countries' international cooperation can be seen in Figure 9. The size of the circles is directly proportional to the number of studies and cooperation between countries. Colors represent different clusters. The thickness of the lines expresses the strength of cooperation between countries.

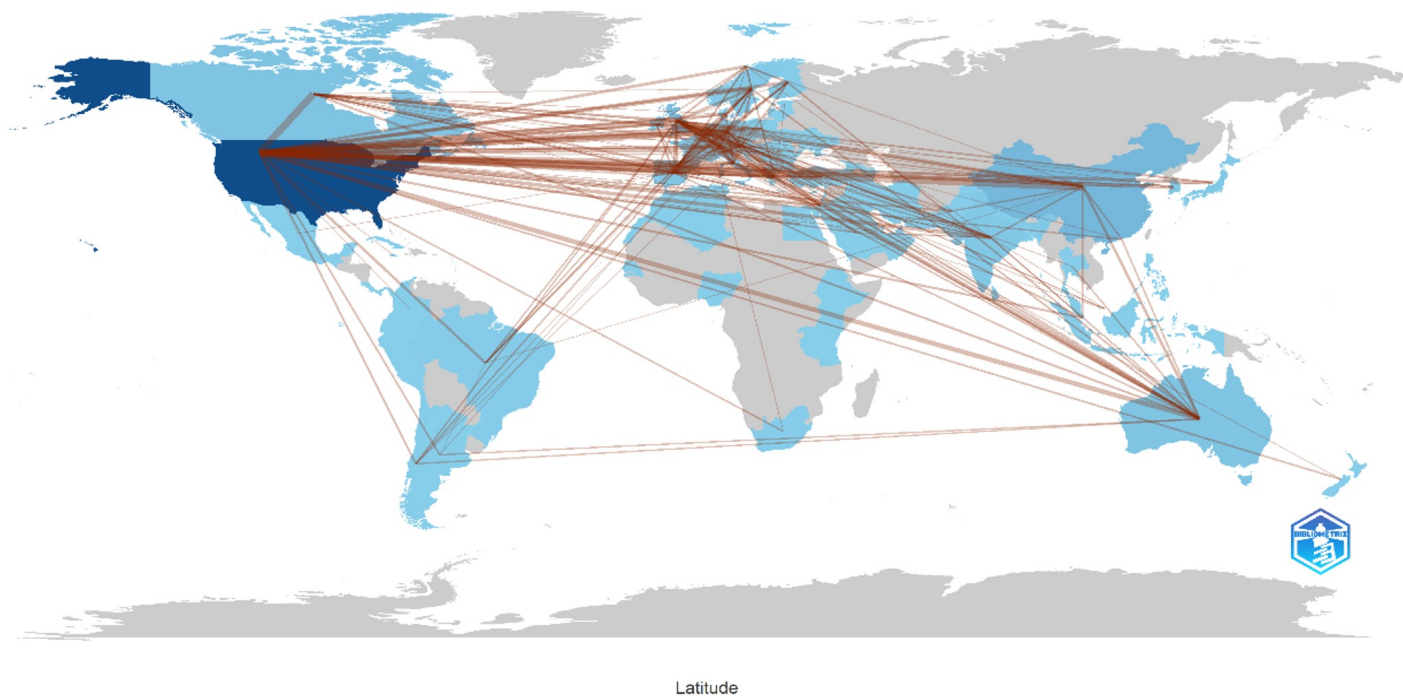
The geographical distribution of country collaboration for the overall study period is shown in Figure 10.



**Figure 8** Bar chart showing the 15 most productive countries in the world



**Figure 9** Network visualization map of countries' international cooperation



**Figure 10** Country collaboration map

### Citations

Citation status by publications is shown in Table 2. Figure 11 shows the co-citation network of the top 50 authors. As the size of the circle increases, the number of citations also increases. Colors represent different clusters. The thickness of the lines expresses the strength of the citation collaboration between authors.

### Keyword Analysis

The 50 most used keywords in 4535 articles were visualized. The network visualization map of trend keywords obtained according to the topicality of publications is shown in Figure 12. As the size of the circle increases, the number of keyword uses also increases. The thickness of the lines expresses the strength of the connection

■ **Table 2 Top 25 Papers by Total Citations (TC)**

No	Paper	DOI	Total Citations	TC per Year	Normalized TC
1	ZHANG H, 2013, ANN INTERN MED	10.7326/0003-4819-158-7-201304020-00004	461	41.91	14.99
2	WANG Y, 2018, J BIOMED INFORMATICS-a	10.1016/j.jbi.2017.11.011	405	67.50	13.03
3	GOULD MK, 2015, AM J RESPIR CRIT CARE MED	10.1164/rccm.201505-0990OC	382	42.44	11.08
4	MILLER DD, 2018, AM J MED	10.1016/j.amjmed.2017.10.035	382	63.67	12.29
5	BEDI G, 2015, NPJ SCHIZOPHR	10.1038/npjschz.2015.30	380	42.22	11.02
6	LIANG H, 2019, NAT MED	10.1038/s41591-018-0335-9	349	69.80	13.51
7	MURFF HJ, 2011, J AM MED ASSOC	10.1001/jama.2011.1204	349	26.85	7.02
8	FRIEDMAN C, 2004, J AM MED INFORMATICS ASSOC	10.1197/jamia.M1552	343	17.15	7.25
9	BATES DW, 2003, J AM MED INFORMATICS ASSOC	10.1197/jamia.M1074	338	16.10	3.77
10	PONS E, 2016, RADIOLOGY	10.1148/radiol.16142770	337	42.13	9.61
11	PERERA G, 2016, BMJ OPEN	10.1136/bmjopen-2015-008721	323	40.38	9.21
12	SHIVADE C, 2014, J AM MED INFORMATICS ASSOC	10.1136/amiajnl-2013-001935	304	30.40	9.67
13	MEHTA N, 2018, INT J MED INFORMATICS	10.1016/j.ijmedinf.2018.03.013	284	47.33	9.13
14	HANAUER DA, 2015, J BIOMED INFORMATICS	10.1016/j.jbi.2015.05.003	282	31.33	8.18
15	CALVERT GA, 2003, J COGN NEUROSCI	10.1162/089892903321107828	280	13.33	3.12
16	SARKER A, 2015, J BIOMED INFORMATICS	10.1016/j.jbi.2014.11.002	273	30.33	7.92
17	TING DSW, 2019, PROG RETINAL EYE RES	10.1016/j.preteyeres.2019.04.003	273	54.60	10.57
18	TANG C, 2014, INT J RADIAT ONCOL BIOL PHYS	10.1016/j.ijrobp.2014.04.025	270	27.00	8.59
19	TITANO JJ, 2018, NAT MED	10.1038/s41591-018-0147-y	268	44.67	8.62
20	BOSELER A, 2003, J AUTISM DEV DISORD	10.1023/B:JADD.0000006002.82367.4f	263	12.52	2.93
21	KISSLER J, 2006, PROG BRAIN RES	10.1016/S0079-6123(06)56008-X	260	14.44	4.62
22	NEAMATULLAH I, 2008, BMC MED INFORMATICS DECIS MAK	10.1186/1472-6947-8-32	258	16.13	7.23
23	RITCHIE MD, 2010, AM J HUM GENET	10.1016/j.ajhg.2010.03.003	250	17.86	5.02
24	HARKEMA H, 2009, J BIOMED INFORMATICS	10.1016/j.jbi.2009.05.002	247	16.47	5.34
25	KHO AN, 2011, SCI TRANSL MED	10.1126/scitranslmed.3001807	242	18.62	4.87



and (Bedi *et al.* 2015), *npj Schizophrenia* journal "Automated analysis of free speech predicts psychosis onset in high-risk youths", respectively.

The articles' first five most frequently used keywords were *Natural Language Processing, Human, Article, Humans, and Female*. Limitations of the study: Although the Scopus database is advantageous compared to other databases regarding the number of publications, not all could be included. Additionally, since 2023 has not been completed, there may be a slight deficiency in the number of publications.

## CONCLUSION

This study provides a holistic review of studies on clinical trials using Natural Language Processing between 2000-2023. According to the findings, it was observed that there was a decrease in the annual number of studies produced in 2016 and an increase in the following years. It was seen that the author with the most publications on the subject was Liu H., most articles were published in the JOURNAL OF BIOMEDICAL INFORMATICS, and the institution that contributed the most to the literature was Harvard Medical School. The most cited article (Zhang *et al.* 2013) was published in the Annals of Internal Medicine titled "Discontinuation of statins in routine care settings: a cohort study". The most productive countries in terms of the number of publications are developed or overpopulated countries. Participation of researchers in developing or underdeveloped countries in multinational studies may allow them to conduct further research on this subject.

### Availability of data and material

Not applicable.

### Conflicts of interest

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

### Ethical standard

The authors have no relevant financial or non-financial interests to disclose.

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