

Article

Bibliometric analysis of SARS, MERS, and Covid-19 studies from India with focus on sustainable development

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Abstract: India is ranked 5th in world in terms of Covid-19 publications accounting for 6.7% of the total. About 60% of the Covid-19 publications in the year 2020 are from United States, China, UK, Italy, and India. We present a bibliometrics analysis of the publication trends and citation structure along with identification of major research clusters. By performing network analysis of authors, citations, institutions, keywords, and countries, we explore semantic associations by applying visualization techniques. Our study shows lead taken by United States, China, UK, Italy, India in Covid-19 research may be attributed to the high prevalence of Covid-19 cases in those countries witnessing the first outbreak and also due to access to Covid-19 data, access to labs for experimental trials, immediate funding, and overall support from the govt. agencies. Large number of publications and citations from India are due to co-authored publications with countries like United States, UK, China, and Saudi Arabia. Findings show health sciences with highest the number of publications and citations, while physical sciences and social sciences and humanities counts were low. A large proportion of publications fall into the open access category. With India as focus, by comparing three major pandemics SARS, MERS, Covid-19 from bibliometrics perspective, we observe much broader involvement of authors from multiple countries for Covid-19 studies as compared to SARS and MERS. Finally, by applying bibliometric indicators, we see an increasing number of sustainable development-related studies from the Covid-19 domain, particularly concerning the topic of good health and well-being. This study allows for a deeper understanding on how the scholarly community from a populous country like India pursued research in the midst of a major pandemic which resulted in closure of scientific institutions.

Keywords: COVID-19 ; Coronavirus; pandemic; bibliometrics, SARS; MERS

1. Introduction

The present Covid-19 pandemic has affected every socioeconomic sector. Globally, everything from manufacturing to entertainment has been affected. Academia is no exception. In fact, most universities globally have suspended on campus activities and have moved online [1]. While teaching practices can to some extent be mitigated by digital interventions and online teaching, research is more complex and often requires campus collaboration and laboratory facilities [2]. While safety norms may require research to be suspended, research is also an essential first step in understanding and fighting this

pandemic. Given that it is a novel virus, research regarding its characteristics is integral to developing mechanisms for fighting it. Similarly, methods of detection, isolation, protection, etc. also need to be developed at a fundamental level. In addition, given the scale of the pandemic, research on its effects on other aspects ranging from the global supply chain to mental health need to be understood and any adverse effects mitigated [3][4]. In light of all these needs, the researchers across the world have continued their work even under these challenging conditions, generating an impressive volume of research during this time [5]. In fact, during the early stages of the Covid-19 pandemic, researchers produced a significant number of publications, and the number started growing exponentially, doubling every two weeks by April 2020 [6]. Furthermore, as of early June 2021, over 167,000 papers on Covid-19 studies have been published despite the restrictions imposed by university closures, social-distancing norms, and disruptions caused by lockdown[7]. Much of the information pertaining to the virus and the pandemic has also been made available in the public domain by the leading research institutions in the world.

Two large outbreaks of this coronavirus family had previously been documented with at least one of them receiving the official designation of "global pandemic" [8]. The first incidence of the Severe Acute Respiratory Syndrome (SARS) disease was recorded on November 16, 2002, in the Guangdong province of Southern China. By 2003, the disease had spread across continents, forcing the World Health Organization to designate it a pandemic. In fact, SARS is dubbed "the First Pandemic of the Twenty-First Century" [9]. On June 13, 2012, the first instance of the Middle Eastern Respiratory Syndrome (MERS) was detected in Jeddah. Until Covid-19 came along, these were the two most significant coronavirus epidemics. Each of these prior epidemics, like Covid-19, had their own literature [10], although on a much lesser scale.

There has in fact been a massive global push for open data sharing during the pandemic. For example, in January 2020, 117 research-related organizations agreed on an open-access data-sharing policy, making any research available to any researcher. The signatories included the likes of Springer and ProMed [8]. UNESCO prompted over 122 countries to implement an open access policy to combat the pandemic and set up an open access platform for the same [9]. The European Union adopted a similar policy by March 2020 [10]. In order to accelerate the speed of publication, a number of preprint services were set up as well. Though they lack the stringency of a detailed peer review process, such approaches have aided in rapid information sharing [11][12]. When compared to other similar infections such as MERS and SARS, Covid-19 has resulted in a mass mobilization of scientific effort, with over 12,000 papers being generated in under five months. The volume of work available at present on this virus alone is greater than the number of publications generated on all coronaviruses over the last two decades [13]. Clearly, the research community has pulled its weight when it comes to achieving

a deeper understanding more regarding this virus and pandemic, and effectively making the information available to the scientific community.

This is despite the limitations imposed by lockdowns across the world. Lockdowns and other preventive measures such as social distancing have varied in intensity from country to country. In fact, the Oxford Covid-19 Government Response Tracker (Ox-CGRT)[14] defines the Oxford Stringency index, which assesses the severity of lockdown restrictions. Countries such as India, Russia, and Mexico had the most stringent lockdowns globally, with India being the most populous country to impose an extremely strict lockdown (Blavatnik School of Government, n.d.). Other countries such as China, Greenland, and many European countries had a more relaxed lockdown in comparison (Blavatnik School of Government, n.d.). And other countries such as Sweden and Japan continued to remain relatively open while adhering to social-distancing norms. For comparison, lockdown in India involved complete suspension of rail, air and road transport between various states and territories. Furthermore, schools, colleges, and public institutions were completely shut down and people were instructed to stay indoors except for accessing essential services [15]. Public institutions, transport, and educational institutions remained open in Japan with limited restrictions, while Sweden did not impose any major restrictions.

Most of Europe had less stringent policies than India as well [16]. All these approaches had varying degrees of success. Even within India, the success of the response varied from state to state, some faring better than others [17]. However, the overall death rates and per-capita deaths in India have been lower than those of most countries. As of May 31st, 2021, India's death per million people since the beginning of this pandemic is 252, while that of the United States is 1,841 and that of Germany is 1071 [18]. The limited restrictions in Sweden, with lack of lockdowns, has led to 1,426 deaths per million, almost twice as much as the rest of Scandinavian countries combined. While some error in these numbers is possible due to insufficient testing, it is safe to assume that the lockdown has aided in mitigating the adverse effects of Covid-19 to a significant extent in the country. While this lockdown certainly affected educational institutions from schools to higher research centers, it is interesting to note that India has contributed significantly to research regarding the pandemic. In fact, despite the stringent lockdown and continued travel restrictions, India ranks 5th in number of publications related to Covid-19 worldwide.

This study focuses on academic literature on Covid-19 globally, and the performance of Indian Scientific community in comparison to its counterparts. The study compares how India's overall scientific output in the year 2020, and research specific to Covid-19 for the same period can be valued relative to global output. This is done by comparing several parameters such as publications, citations, international collaborations, journal

sources, government funding etc. As a starting point, a brief literature summary of research publication growth and sharing is presented in the next section. This will aid in understanding the global collaborations, nature of Covid-19 publications, and how the response of the scientific community with regards to Covid-19 differs from its response to other diseases.

We have structured the paper as follows: Section 2 discusses the study methodology using bibliometrics including the search strategy. Section 3 presents the results in terms of publications, citations, institutions, and countries. Section 4 provides the network analysis with visual representation of bibliographic data while Covid-19 studies connected to Sustainable development are presented in Section 5. And finally section 6 is about conclusions of the study with future directions.

Study methodology using bibliometrics

Bibliometrics is a set of methods to measure scholarly impact from research publications. Bibliometrics tools have been used in a variety of analyses [19][20], including those of authors, journal sources, and citation trends [21] or country [22]. Many journals have published bibliometric studies on pandemics such as SARS, MERS, and more recently on Covid-19 [13][23-26].

Selection of bibliometric software mapping tools and data sources

The VOSviewer [27] software was used to analyze the co-occurrence network for keywords, co-authorship network [28], citations [29] and bibliographic coupling [30]. The h-index [31] which is widely used in bibliometric studies [32] was also analyzed.

In our study we also considered data sources, <https://www.worldometers.info/coronavirus> for data on Covid-19 deaths and cases, as well as www.scimagojr.com for Scimago Journal Rankings (SJR). Average of the daily score of the Oxford Stringency index was taken from (<https://COVIDtracker.bsg.ox.ac.uk/>) for the period on the 31st of December 2020. A minimum threshold of daily score of 30 was set to account for varying dates of lockdown measures.

Search strategy

For our bibliometric analysis we chose Scopus which is a large abstract and citation database with over 74 million records from 23500 peer-reviewed publications in the fields of science, technology, medicine, social sciences, and arts and humanities [33][34].

Publications were retrieved via a topic search (title/ abstract/ key words) from Scopus database for year 2020 as on 1st January 2021. The following search queries were created with the goal of reducing the amount of data overlap across the SARS, MERS, and

Covid-19 datasets [35]. In order to eliminate overlap, relevant phrases from various literatures were joined with the Boolean operator "AND NOT" in each search. The time period for each search was determined by considering the year in which each virus epidemic occurred.

SARS: (TITLE-ABS-KEY ((("Severe acute respiratory syndrome" OR "SARS") AND (coronavirus*)) OR ("SARS virus" OR "SARS disease" OR "Severe acute respiratory syndrome disease" OR "Severe acute respiratory syndrome virus" OR "SARS-Cov")) AND NOT TITLE-ABS-KEY (("covid" OR "nCov" OR "Covid-19" OR "covid19" OR "SARS-Cov-2" OR "Severe acute respiratory syndrome-2" OR "MERS" OR "middle east respiratory syndrome"))) AND PUBYEAR > 2001.

MERS: (TITLE-ABS-KEY ((("Middle east respiratory syndrome" OR "MERS") AND (coronavirus)) OR ("MERS-Cov" OR "MERS virus" OR "MERS disease" OR "Middle east respiratory syndrome virus" OR "Middle east respiratory syndrome disease"))) AND NOT TITLE-ABS-KEY (("nCov" OR "Covid-19" OR "covid19" OR "SARS-Cov" OR "SARS-Cov-2" OR "SARS" OR "Severe acute respiratory syndrome"))) AND PUBYEAR > 2011.

Covid-19: TITLE-ABS-KEY ("covid-19" OR "covid19" OR "coronavirus disease 2019" OR "2019-nCov" OR "Novel Coronavirus" OR "Novel Corona virus" OR "SARS-Cov-2") AND PUBYEAR > 2018.

Results on Publications, Citations, Institutions and Countries

Publication and citation trends

A total of 93,485 Covid-19-related publications, between Jan 1st, 2020, and Dec 31st, 2020, are indexed in Scopus as of Jan 1st, 2021, based on our search strategy. Out of this total, 58,643 (60.2%) were from United States, China, UK, Italy, and India with United States having the highest total of 23,608 (25.4%) publications. Publications in English were 87,529 (94.1%) with 7,723 (5.9%) in Spanish, German, Chinese, French. This information is summarized in Table 1.

Table 1. Covid-19 related publications and citations worldwide

Country	Number of Publications	% Publications	Citations	Citations/ Publication	Cases/1M population	Deaths/1M population	Oxford Stringency Index
United States	23608	25.4%	194117	8.2	60900	1057	68.1
China	10356	11.1%	273493	26.4	60*	3*	70.5
UK	10002	10.7%	90474	9.0	37347	1089	69.6
Italy	8454	9.0%	74527	8.8	35245	1235	65.2

India	6223	6.7%	20816	3.3	7404	107	78.7
Spain	3834	4.1%	23603	6.2	41415	1087	67.2
Canada	3818	4.1%	31004	8.1	15371	412	66.5
Germany	3531	4.0%	41895	11.9	20924	410	60.6
France	3526	3.8%	36776	10.4	39796	985	63.9
Australia	3437	3.7%	29772	8.7	1108	35	65.8

*Data about cases and deaths from China were not updated at the source of information for Table 1 but given the early outbreak of Covid-19 in China, we chose to include it in our study.

United States had both the highest number of cases and deaths per million population while Australia had the lowest score in the stringency index. India has the highest score 78.7, which may provide a possible explanation of low number of cases and deaths per million population. China had the highest number of citations per publication possibly due to the effect of the first outbreak of the Covid-19 virus and easy availability of data among Chinese authors to write papers and cite each other’s work. A total of 6,223 publications, with affiliation as India for at least one author, were found for the year 2020. These publications were written by 12,417 authors and published in 1,370 sources. Out of this, 2,513 (40.3%) publications had at least one citation in Scopus, providing a total of 20,816 citations. This resulted in an average citations per paper of 3.3 and citations per author of 1.7.

It is seen that Indian authors have collaborated with researchers in 147 countries, with 4,667 (74.9%) publications having international co-authorships. This indicates a healthy international collaboration during the pandemic. The largest number of collaborations were with the United States, followed by China, UK, Saudi Arabia, Japan, Italy, Columbia, and South Korea, as seen in Table 2. These seven collaborating countries accounted for 1,866 (30.1 %) publications. For publications from India, the number of citations is highest for publications from United States followed by those from China, UK, and Italy. The number of citations per publication varies from 22.7 for Nepal to 7.1 for United States. However, given that a larger number of publications are generated in Italy, China, US, and UK, researchers have diverse options for citing work from these countries, thereby moderating the number of citations per publication. With a very limited number of publications from Nepal and Japan (58 and 70 papers each), leads to larger number of citations on the ones available. The quality of research work can therefore not be assessed based on same metric.

Table 2. Top collaborating countries with India for Covid-19 studies

Country	Number of Citations	Number of Publications	Citations/Publications
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United States	4233	595	7.1
China	2528	212	11.9
UK	2420	335	7.2
Saudi Arabia	1545	175	8.8
Japan	1517	70	21.7
Italy	1367	160	8.5
Colombia	1322	87	15.2
South Korea	1321	106	12.5
Nepal	1319	58	22.7
Spain	1126	66	17.1
France	1038	57	18.2
Brazil	1011	82	12.3

Although the number of publications and citations related to SARS and MERS increased since the respective outbreaks took place, Indian authors took more interest in them only in the year 2020 when Covid-19 happened, as shown in the Table 3. The surge in coronavirus research triggered by the Covid-19 outbreak, on the other hand, appears to be on a scale that is unprecedented in the history of coronavirus research, and probably perhaps in the history of science.

Table 3. Comparison of Publications and Citations for SARS, MERS, and Covid-19

Outbreaks	SARS	MERS	Covid-19
Publications	167	558	6223
Citations	2207	7109	20816

Structure of publications

Analyzing the total number of Covid-19 related publications globally, it is seen that 50,865 (54%) are research 'Articles' as shown in Table 4. Trend is similar in India with 3,186 (51%) publications. Furthermore, in India, Letters and Reviews add up to 2,392 (38%), while the share of such publications is only 25,203 (27%) globally. Other publications take up 10% of overall share in India and 19% globally. It should be noted that such a high share of non-article publications is abnormal, and generally 71% of all publications in India are articles in year 2020. This higher fraction of non-articles related to

Covid-19 may be attributed to the time required for peer review process as softer letters and reviews do not have to pass that hurdle.

Table 4. Covid-19 publications by type

Publication Type	India	%	World	%
Article	3186	51%	50865	54%
Letters, Review	2392	38%	25203	27%
Others	645	10%	17417	19%

Top contributing institutions

Globally, Harvard Medical School (USA) published the largest number of Covid-19 related publications followed by Huazhong University of Science and Technology and Tongji Medical College from China, as can be observed in Table 5. Both private and public institutions are represented well in the top-10 in the world for institutions with most Covid-19 publications.

Table 5. Top contributing institutions in the world for Covid-19 studies

Institution Name	Number of Publications	Country	Ownership	Discipline
Harvard Medical School	1552	United States	Private	Medical
Huazhong University of Science and Technology	1203	China	Public	Multidisciplinary
Tongji Medical College	1143	China	Private	Medical
Inserm	1050	France	Public	Medical
University of Toronto	999	Canada	Public	Multidisciplinary
Università degli Studi di Milano	851	Italy	Public	Multidisciplinary
University of Oxford	838	United Kingdom	Private	Multidisciplinary
Università degli Studi di Roma La Sapienza	797	Italy	Public	Multidisciplinary
University College London	774	United Kingdom	Private	Multidisciplinary
Massachusetts General Hospital	735	United States	Private	Medical

When comparing the publications and citations achieved by public and private institutions in India, the former has a clear upper hand, as shown in Table 6. A much larger number of publications were produced by public medical institutions such as AIIMS,

and PGI Chandigarh. The private medical institute with the highest number of publications is Saveetha, where the medical and dental departments together roughly match the number of publications by PGI Chandigarh. However, in terms of number of citations, public medical institutes are far ahead of private institutes. IVRI (Veterinary) has 15 citations per publication while ICAR New Delhi has 14.4 citations per paper. Tata Memorial has a citation per publication score of 6.2. However, among private sector institutes, the highest citation per publication is 3.7 for CMC Vellore. Clearly, public medical institutes have exceeded their private counterparts in academic excellence in this area. This is partly due to government funding and ease of access enjoyed by these institutes with regards to viral samples and data for clinical studies.

Table 6. Top contributing institutions in India for Covid-19 studies

Institution Name	Number of Publications	Number of Citations	Citations/ Publication	Ownership	Discipline
AIIMS New Delhi	427	942	2.2	Public	Medical
PGI Chandigarh	309	1248	4.0	Public	Medical
Saveetha (Medical)	171	24	0.1	Private	Medical
Saveetha (Dental)	162	40	0.2	Private	Dental
Datta Meghe Wardha	138	77	0.6	Private	Medical
DY Patil Pune	132	293	2.2	Private	Medical
ICMR New Delhi	109	515	4.7	Public	Medical
Manipal, MAHE	107	439	4.1	Private	Multidisciplinary
NIMHANS Bengaluru	100	446	4.5	Public	Medical
SG PGI Lucknow	97	346	3.6	Public	Medical
AIIMS Jodhpur	93	146	1.6	Public	Medical
Tata Memorial	91	564	6.2	Public	Medical
ICAR New Delhi	90	1295	14.4	Public	Agriculture
King George Lucknow	86	484	5.6	Public	Medical
IVRI (Veterinary)	87	1309	15.0	Public	Medical
University of Delhi	82	248	3.0	Public	Multidisciplinary
AIIMS Rishikesh	81	127	1.6	Public	Medical
Homi Bhabha Mumbai	72	374	5.2	Public	Multidisciplinary
Amity University	66	89	1.3	Private	Multidisciplinary

VMMC, Safdarjang Hospital	66	198	3.0	Public	Medical
CMC Vellore	63	232	3.7	Private	Medical
Jamia Millia Islamia	62	403	6.5	Public	Multidisciplinary
JIPMER Pondicherry	57	499	8.8	Public	Medical

When we compare the three outbreaks, we observe that the research interest from Indian institutions in conducting coronavirus studies has increased by a factor of three from 160 in SARS to 249 in MERS to 523 institutions for Covid-19. This interest is also reflected in the very large number of publications and citations related to Covid-19 studies.

Most influential journals

A list of journal sources with number of publications, citations, Scimago Journal Rankings (SJR) and h-index are listed in Table 7. The highest citation per publication is achieved by the Journal Science of the Total Environment which is a Q1 journal with a high h-index of 224. Similarly, the Journal Diabetes Research and Clinical practice, another Q1 journal with a high h-index of 107 has over 23 citations per publication. The Journal of Biomolecular Structure and Dynamics, a Q2 journal, with a relatively moderate h-index of 32 has the highest number of Covid-19 related publications while Nature Medicine and The Lancet, the most reputed journals in the field have a very limited number of Covid-19 related publications (4 each), likely owing to the highly stringent review process and high article processing charges.

Table 7. Most influential journals

Journal title	Number of Publications	Number of Citations	Citations /Publication	SJR (Q1-Q4)	h-index
Journal of Biomolecular Structure and Dynamics	274	2868	10.5	Q2	32
Indian Journal of Medical Research	186	856	4.6	Q2	81
Asian Journal of Psychiatry	93	517	5.6	Q2	29
PLOS ONE	54	118	2.2	Q1	300
Chaos Solitons and Fractals	47	381	8.1	Q1	132
Diabetes Research and Clinical Practice	42	970	23.1	Q1	107
Life Sciences	41	387	9.4	Q1	156

Dermatologic Therapy	41	179	4.4	Q2	62
Diabetes and Metabolic Syndrome	38	232	6.1	Q2	29
Science of the Total Environment	37	964	26.1	Q1	224
Indian Journal of Paediatrics	27	578	21.4	NA	NA
Virus Research	23	262	11.4	Q2	114
JCO Global Oncology	15	288	19.2	NA	NA
Journal of Medical Virology	13	211	16.2	Q2	111
The Lancet	12	170	14.2	Q1	747
Aging and Disease	11	571	51.9	Q1	43
Brain Behavior and Immunity	10	282	28.2	Q1	140
Travel Medicine and Infectious disease	8	614	76.8	Q1	40
Kidney International	5	180	36	Q1	266
Nature Medicine	4	80	20	Q1	524
The Lancet Infectious Diseases	4	50	12.5	Q1	217

When we observe the data on studies about SARS, MERS and Covid-19 published in journals, we see a large surge in the number of different journals where Covid-19 studies were published. While SARS studies were limited to 124 journals, MERS had 310 while Covid-19 studies were published in over 1370 journals.

Top performing subject areas

A majority of publications related to Covid-19 are from health sciences (76,657, 82.1%), with medicine alone accounting for (64,505, 69.3%) globally. The proportion is slightly lower for India, with 4,165 (67.2%) publications coming from health sciences, as indicated in Table 8. Of these, 3,790 (91.4%) are from medicine. However, life sciences also contributed a healthy 43% of the total share of Covid-19-related articles, while physical sciences and social sciences made up the rest at 29% and 15% respectively. It is also interesting to note that within physical sciences, computer science and engineering which are technology oriented constitute a higher share than that of pure sciences such as chemistry or physics. Within social sciences, art and humanities contribute the least while pure social science contributes the highest share.

Table 8. Top performing subject areas in India

Subject Area	Subject Area Classifications	Number of Publications
Health Sciences (67%)	Medicine	3825
	Dentistry	138
	Health Professions	85
	Nursing	77
	Veterinary	40
Life Sciences (43%)	Biochemistry, Genetics and Molecular Biology	1098
	Pharmacology, Toxicology and Pharmaceutics	724
	Immunology and Microbiology	459
	Agricultural and Biological Sciences	208
	Neuroscience	190
Physical Sciences (29%)	Computer Science	341
	Engineering	296
	Environmental Science	284
	Mathematics	198
	Chemistry	141
	Physics and Astronomy	118
	Chemical Engineering	116
	Energy	103
	Materials Science	90
	Earth and Planetary Sciences	70
	Decision Sciences	64
Social Sciences (15%)	Social Sciences	452
	Economics, Econometrics and Finance	175
	Psychology	150
	Business, Management and Accounting	94
	Arts and Humanities	59

Open Access publications

Overall, there is a rise in the number of open-access publications, especially with those related to Covid-19. This indicates an interest from the academics in increasing the availability of their work to a wider audience without the barriers of restricted access. In fact, with regards to publications related to Covid-19, worldwide 75,242 (80.4%) are in open access, and in India, the trend is similar with 4,841 (77.7%) in open access. This is especially relevant in India, given that only 26% of all publications from India are in open access for the entire year 2020. Essentially, a large portion of Covid-19 publications fall into the open access category. The fraction of Open Access medical publications is especially high, with 83.8% and 82.9% of Covid-19 related medical papers being open access globally and in India, respectively.

It is important to note that although authors have been publishing in open access for several years only in the last few years, several of the established journals have started publishing in full open access mode. This is reflected in the very high number of Open Access articles for Covid-19 studies (4841) compared with 431 for MERS and 113 for SARS.

Major funding sources

From all the Covid-19 related publications studied, 20,134 (22.5%) reported the funding sources involved. Led by United States, National Institutes of Health, National Science Foundation and National Institute of Allergy and Infectious Diseases funded largest number of 2,776 (13.7%) Covid-19 studies. The National Natural Science Foundation from China was second with 2,111 (10.4%) funded studies followed by UK's National Institute for Health Research with 459 (2.2%) and European Commission with 236 (1.1%) funded studies. When it comes to funding by private sources, the following number of studies were funded: Wellcome Trust, 388; Pfizer, 255; Bill & Melinda Gates Foundation, 243.

Government funding was relatively lower in India with agencies Science & Engineering Research Board (SERB) Indian Council of Medical Research (ICMR), Department of Science & Technology (DST), Department of Bio-Technology (DBT) and University Grants Commission (UGC) accounting for 129 (0.5%) studies. However, countries hit earlier by Covid-19 such as United States and China are more likely to have allocated more funding to research at that stage.

Network analysis: Co-authorship, Co-occurrence, and Bibliographic couplings

Co-authorship network and publications

In order to study the collaboration networks of authors, we used co-authorship network analysis which is a widely accepted practice in bibliometric studies [36].

In a network graph, each author is represented by a bubble and the bubble size is proportional to the number of publications attributed to the author. Two authors who have collaborated on any paper are linked by a line, with each line representing collaboration on a single paper. Colors indicate clusters of authors that are relatively strongly connected by co-authorship links and authors with a high degree of collaboration are located close to each other.

We investigated the co-authorship network in India, with authors having at least 15 Covid-19 related publications. This resulted in 7 major collaboration clusters with a total of 132 authors, as can be observed in Fig. 1.

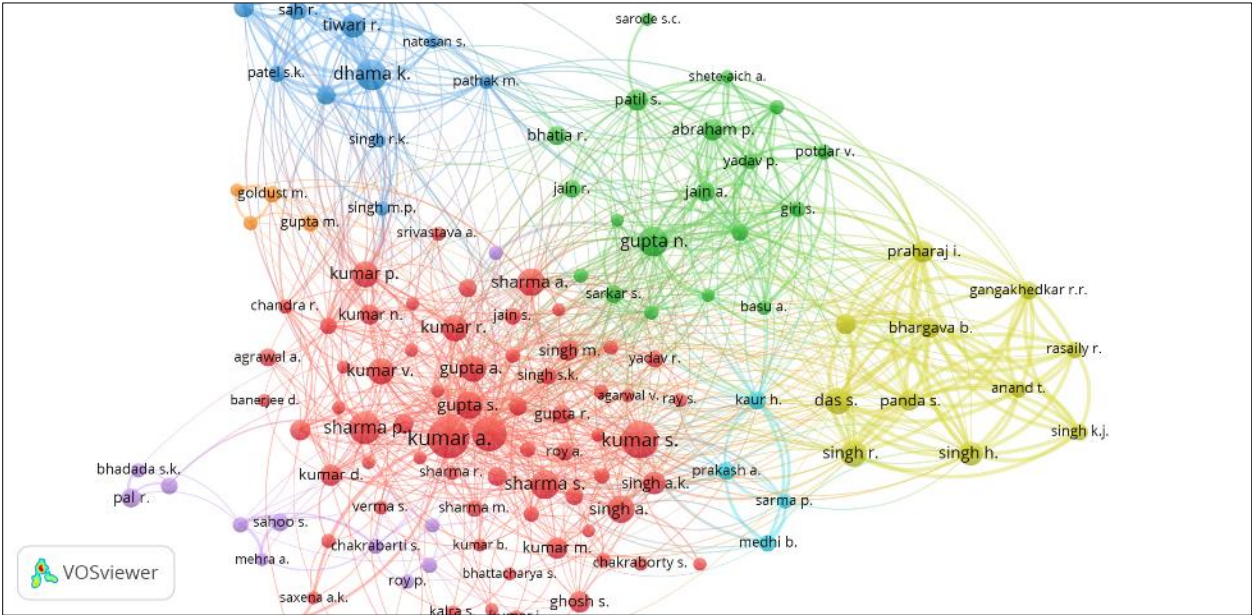


Fig. 1 Co-authorship network and publications in India

The important clusters in the co-authorship network of authors shown in the following colors: red corresponds to authors "kumar a", "kumar s", "sharma p"; green color to author "gupta n"; yellow to author "das s" and finally blue to "dhama k". As indicated by the size of the bubble, those are leading authors who produced highest number of papers in collaboration with others.

Co-citation network of authors

Similarly, we investigated the co-citation network of Indian authors with at least 5 citations. Note that co-citations indicate formats that contain ideas, experiments, or methods that have received peer recognition, as evidenced by their co-occurrence of citations [37].

This network analysis resulted in 6 clusters, where 124 out of the 12,417 authors had at least 5 citations, as shown in Fig. 2. Each author is represented by a node whose size is proportional to the number of citations. The important clusters of citations appear in the following colors: red corresponds to author “dharma k”; green to author "chakrabarthi s"; yellow to author "gupta n" and finally color to "sharma s". As indicated by the size of the bubble, those are leading authors with the highest number of citations.

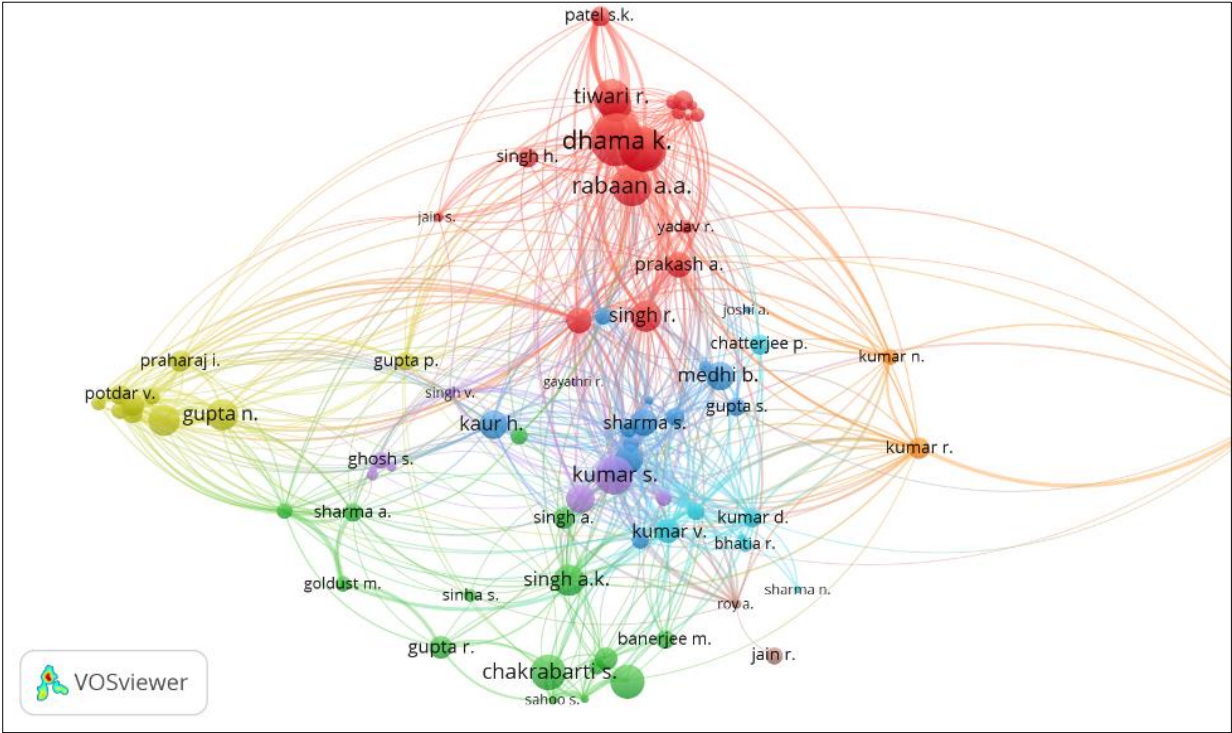


Fig. 2 Co-authorship network and citations in India

Co-occurrence network of keywords

When searching for scientific publications, a key word search is usually the easiest way to access relevant information. Therefore, appropriate key words that provide a reasonable description of the work allows the study to reach a wider audience. To carry out a keyword-based analysis, keywords described by at least 5 publications were chosen and a co-occurrence network constructed. The unit of analysis has also been set to all keywords (this includes both author and index keywords) and the method of counting was set to full counting.

These results are shown in Fig. 3, where it can be seen that works published by Indian authors have employed a wide range of key words, ranging from those related to virology and epidemiology to those associated with mental health, air pollution, and lock-down. This indicates that the work generated in India spans multiple disciplines and covers a diverse gamut of topics related to the pandemic.

With respect to each of the three epidemics, distinct clusters of keywords were identifiable but there were commonalities among them. All three epidemics had a cluster with terms such as pandemic, infection control, viral, epidemic, virus transmission associated with general public health and disease outbreak. Another cluster had terms that are generally associated with virology studies like virus protein, virus entry, chemistry, amino acid sequence, virus genome, protein binding, etc.

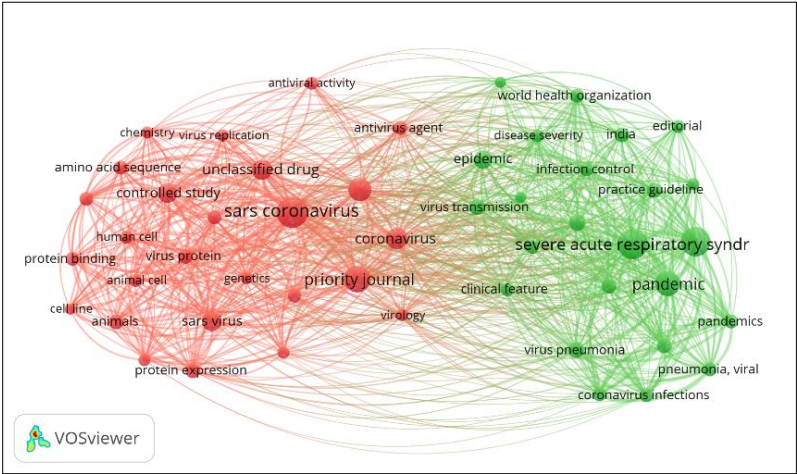


Fig. 3 keyword co-occurrences associated with the SARS studies

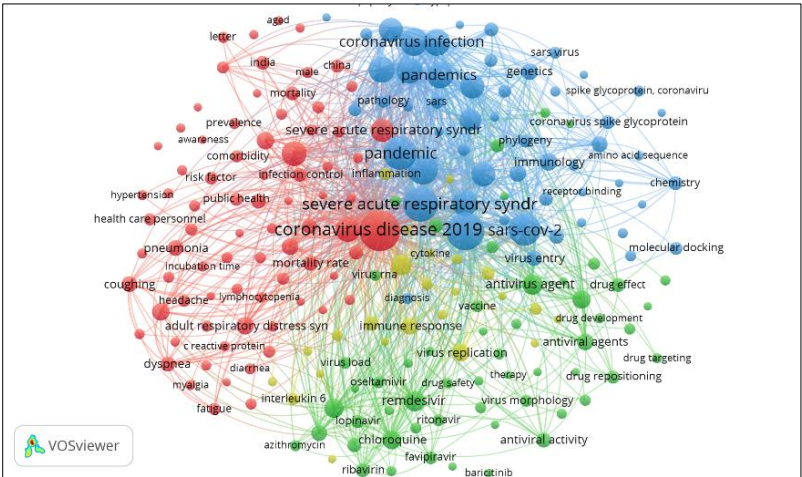


Fig. 3 keyword co-occurrences associated with the MERS studies

Fig. 3 (bottom) shows that the Covid-19 studies resulted in four clusters which are described below:

-

Bibliographic couplings among countries

Fig. 4 presents the bibliographic coupling among countries, where any country with a minimum of 5 publications with an Indian collaboration was considered. When the three maps of co-authorships are compared, a pattern of author engagement emerges

from the area where each virus outbreak began. In all three epidemics, studies produced by scholars linked with Indian institutions are well represented. However, the figure also illustrates frequent coupling among other countries such as England, Germany and Netherlands for Covid-19 studies with United States, United Kingdom, Saudi Arabia, Japan, Italy, Columbia, and South Korea as top collaborators.

Overall, the number of collaborating countries has increased from 28 for SARS to 81 for MERS and, reached a total of 154 for Covid-19.

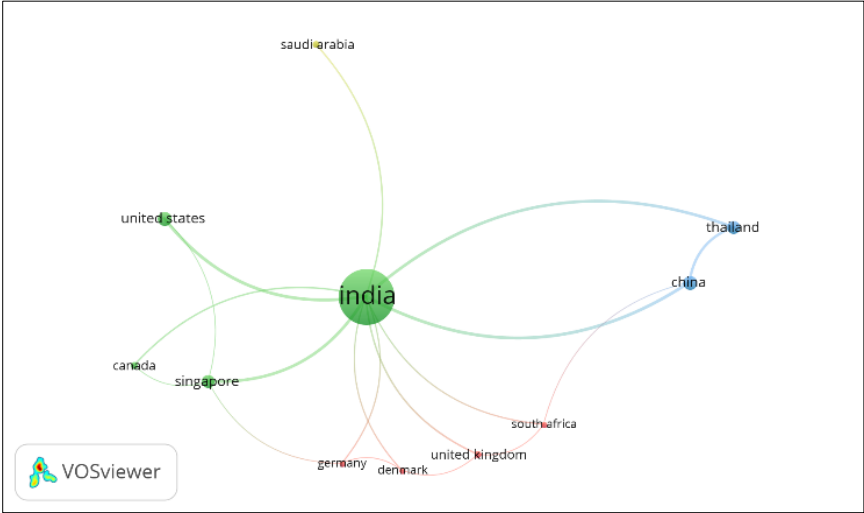


Fig. 4 Bibliographic coupling of countries associated with SARS studies

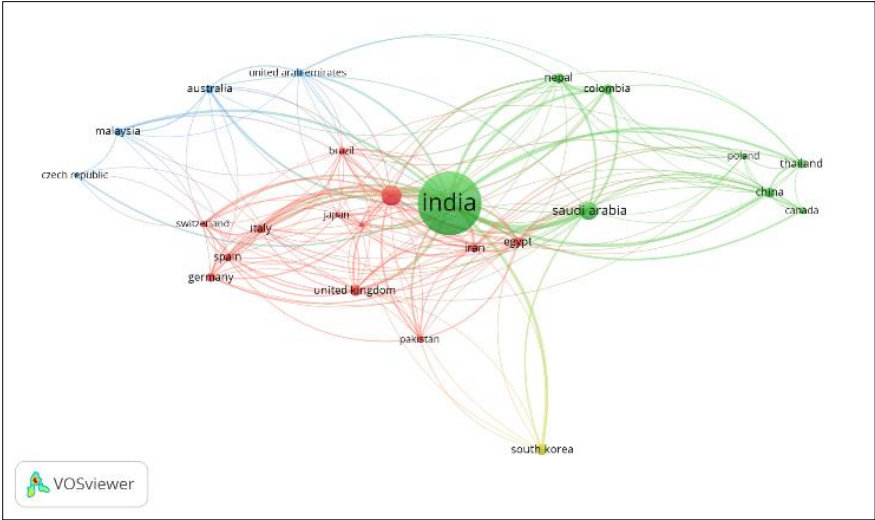


Fig. 4 Bibliographic coupling of countries associated with MERS studies

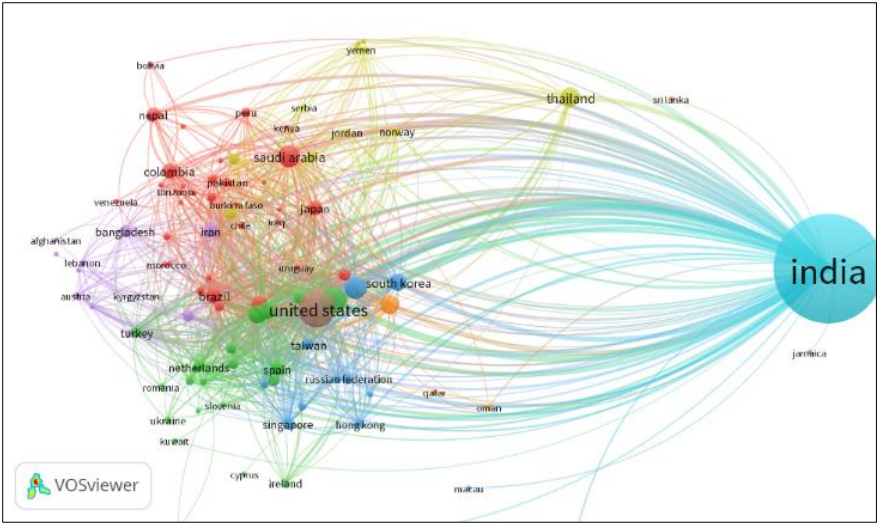


Fig. 4 Bibliographic coupling of countries associated with Covid-19 studies

Bibliographic couplings of journal sources

Similarly, we studied the bibliographic couplings of journal sources for all three pandemics. We observe that the journal sources have increased dramatically from 124 journals for SARS to 310 journals for MERS, up to a large 1,370 journals for Covid-19. Journal of Biomolecular structure and Indian Journal of Medical Research is found common for all three pandemics, as seen in Fig. 5. We also notice that MERS studies were published in specialty journals like Journal of Virology, Human Vaccines & Immunotherapy and Frontiers in Microbiology.

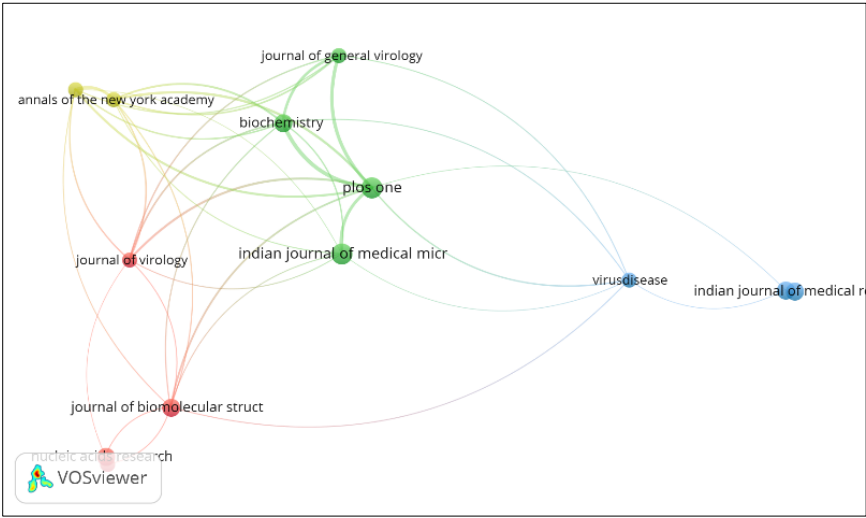


Fig. 5 Bibliographic coupling of journals associated with SARS studies

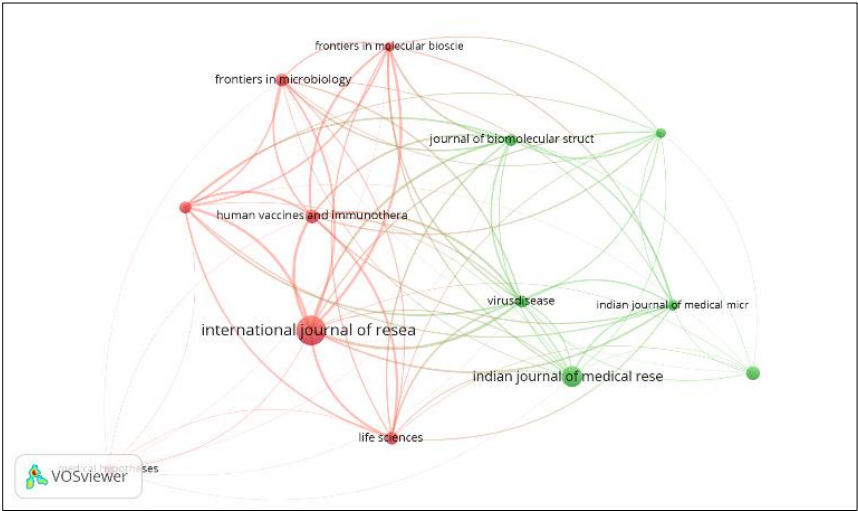


Fig. 5 Bibliographic coupling of journals associated with MERS studies

When it comes to Covid-19 studies, we evaluated the journals with a minimum of ten publications from total of 1,370 journal sources that Indian authors had published. This resulted in 97 items divided into 7 clusters , as shown in Figure 5 (bottom). As expected, most of the highly cited papers appeared in high-impact factor journals indicating their higher research quality. Most publishers followed an accelerated review process, online-first policy and provided open access to such publications.

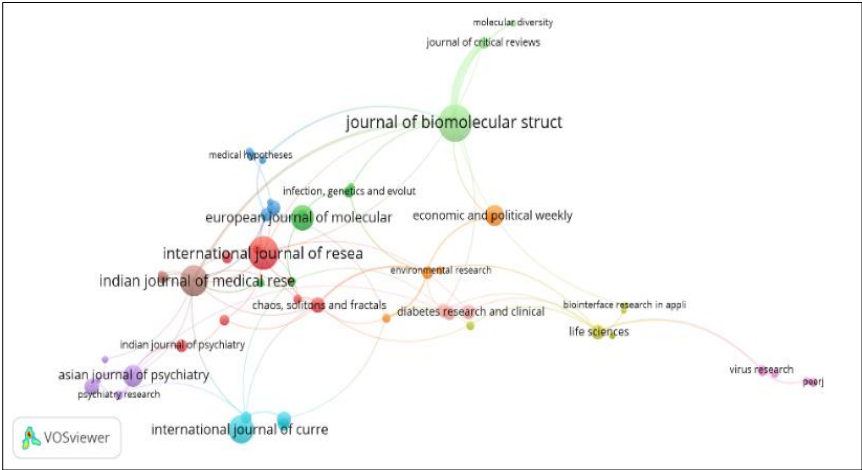


Fig. 5 Bibliographic coupling of journals associated with Covid-19 studies

Covid-19 studies connected to sustainable development

We also evaluated the connections between Covid-19 studies and sustainable development. In this regard we used 17 United Nations Sustainable Development Goals (SDG), adopted in 2015, as proxy for sustainable development. It is clear that the Covid-19 pandemic has had an important impact across all the SDGs, for instance through reduced CO₂ emissions because of the lockdowns [39], with clear implications on SDG 13 (on climate action). However, a number of studies [40, 41] suggest that the situation

may progressively return to the pre-pandemic levels, in the context for instance of aviation and its impact on the environment. Several studies suggest that the symptoms associated to Covid-19 may be exacerbated due to increase pollution levels [42], a fact that closely connects SDGs 3 (on health) and 11 (on sustainable cities). Another important aspect regarding the management of the Covid-19 has to do with the digital-contact-tracing apps, which aimed at achieving a better control of the pandemic, with positive impact on SDG 3, but could potentially exhibit challenges [43][44][45] in the context of SDGs 10 (on reduced inequalities) and 16 (on strong institutions). The connections reported above have a clear relation with the results presented in Table 9, where the number of Indian Covid-19 articles and their citations related to each of the 17 SDGs are reported. There are clearly very strong connections with SDGs 3 and 11, as well as 13 (with the clear implications on pollution levels) and 16. When it comes to the latter, we would like to highlight the strong polarization in our societies, exacerbated by the algorithms used by news outlets and social media [46]; the problems associated to this polarization have become particularly dire due to the Covid-19 pandemic, creating a data crisis [47]. It is also important to note the significant number of studies documenting connections between Covid-19 and SDGs 8 (on economic growth) and 4 (on quality education), which reflect the negative impact of the Covid-19 restrictions on two very important areas of our societies. Perhaps two areas that have not received sufficient attention according to Table 9 are the negative effects on SDGs 1 (on no poverty) and 5 (on gender equality), which have undoubtedly experienced quite negative effects from Covid-19.

Table 9: Number of publications and citations corresponding to Covid-19 studies from India with impact on each of the 17 SDGs.

SDG	Publications	Citations
3 Good Health and Well Being	2230	14066
8 Decent Work and Economic Growth	163	256
11 Sustainable Cities and Communities	151	1354
4 Quality Education	148	553
16 Peace, Justice and Strong Institutions	108	247
13 Climate Action	71	118
7 Affordable and Clean Energy	66	103
2 Zero Hunger	54	160
10 Reduced Inequalities	38	97
6 Clean Water and Sanitation	34	222
12 Responsible Consumption and Production	29	248
1 No Poverty	11	49
15 Life on Land	6	15
5 Gender Equality	3	8
9 Industry, Innovation, and Infrastructure	2	0

14 Life Below Water	2	1
17 Partnerships for the Goals	2	1

6. Conclusions

In the present study the authors performed a bibliometric analysis on Covid-19 publications in India and at multiple places compared with world wide data. United States is the country with the highest number of Covid-19 publications in the year 2020. This might reflect the fact that journal databases and referencing system usually refer to US standards. Many journals, with a wide range of impact factors, exhibit publications by Indian authors. The publications are the result of collaboration both within India and in the international scene. As also reported [48], who studied bibliometric features on the Covid-19 worldwide, our results indicate that the studies on Covid-19 are published by institutions worldwide. There are many publications in India, with a rapid increasing rate of publication after disease emerged in the country, in a pattern similar to that reported by [49]. This study also shows that there are many publications from both governmental and non-governmental institutes. A worldwide collaboration network can be clearly identified, and this agrees with the report by [50]. Collaboration in excellent way to increase visibility of the work and generalization of the knowledge. During the early stage of disease emergence, studies in the form of short report or viewpoints were common and become publications with high numbers of citations [51]. Such collaboration, and an active data-sharing policy, are essential aspects to fight this pandemic and other future crises[52][53][54]. The high number of studies on Covid-19 indicates that it will be necessary to conduct active research with the emergence of new variant of the diseases[55][56][57][58][60].

We also identified important connections between Covid-19 studies at the 17 SDGs of the UN. In particular, there are clear implications on SDGs 3 (on health), 11 (on sustainable cities) and 13 (on climate action), the two latter due to the reduced emissions following the Covid-19 restrictions. Digital contact tracing must be conducted in a decentralized way in order to avoid negative effects on SDGs 10 (on reduced inequalities) and 16 (on strong institutions). Despite the obvious negative effects of Covid-19 on SDGs 8 (on economic growth) and 4 (on quality education), we would like to highlight the very important consequences on SDGs 1 (on no poverty) and 5 (on gender equality), which are not as prominently represented in the literature.

A detailed assessment of the scientific work published in reaction to the three most notable coronavirus outbreaks, namely SARS, MERS, and Covid-19, reveals striking parallelisms. Public-health and emergency-management studies are the first to appear, followed by virology studies. The volume and rate of scholarly study on Covid-19, on the other hand, remains an outlier, potentially unparalleled in the history of scientific literature.

Although India had reasonably large number of reported Covid-19 cases, the number of publications at the time of the study still follow countries where the

disease occurred earlier. But in the recent weeks, the situation has abruptly changed for the worse with India reporting very high number of daily cases mainly attributed to the double-mutant strain. Many states have again implemented lockdowns resulting in closure of campuses. It remains to be seen how the academic community will adapt to this new situation.

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