

Abstract

An examination is presented of scientific research publication trends during the global coronavirus (COVID-19) pandemic in 2020. After reviewing the timing of the emergence of the pandemic in 2020 and the growth of governmental responses, available secondary and sources are used to highlight impacts of COVID-19 on scientific research. A bibliometric analysis is then undertaken to analyze developments in COVID-19 related scientific publications through to October of 2020 by broad trends, fields, countries, and organizations. Two publication data sources are used: PubMed and the Web of Science.

While there has been a massive absolute increase in PubMed and Web of Science papers directly focused on COVID-19 topics, especially in medical, biological science, and public health fields, this is still a relatively small proportion of publication outputs across all fields of science. Using Web of Science publication data, the paper examines the extent to which researchers across all fields of science have pivoted their research outputs to focus on topics related to COVID-19. A COVID-19 research pivot is defined as the extent to which the proportion of output in a particular research field has shifted to a focus on COVID-19 topics in 2020 (to date) compared with 2019. Significant variations are found by specific fields (identified by Web of Science Subject Categories). In a top quintile of fields, not only in medical specialties, biomedical sciences, and public health but also in subjects in social sciences and arts and humanities, there are relatively high to medium research pivots. In lower quintiles, including other subjects in science, social science, and arts and humanities, low to zero COVID-19 research pivoting is identified.

Version Note

This working paper is Version 1, completed on December 6, 2020. As further data becomes available, it may be updated.

Introduction

This working paper takes an initial look at scientific research publication trends during the global coronavirus (COVID-19) pandemic.

To provide context, the paper first discusses the timing of the emergence of the pandemic in 2020 and the growth of governmental responses. Scientific research, as with other societal and economic activities across the globe, has been greatly impacted by COVID-19.

As one approach (of many possible approaches) to assessing COVID-19's effects on science, the paper analyzes developments in COVID-19 and all scientific publications in 2020 by broad trends, fields, countries, and organizations. Comparisons are made with the pre-COVID year of 2019. The paper also examines the extent to which researchers across all fields of science have pivoted their research outputs to focus on topics related to COVID-19.

Two publication data sources are used for the analyses presented in the paper: PUBMED and the Web of Science. A bibliometric search approach is applied to publication datasets from these two sources to identify COVID-19 relevant publications. The publication datasets and bibliometric search approach are described in a subsequent section of the paper.

Emergence of the pandemic and timing of government responses

In January 2020, the COVID-19 outbreak was declared a public health emergency of international concern by the World Health Organization (WHO).¹ In March 2020, WHO designated COVID-19 as a pandemic.² While early cases of COVID-19 were reported in January 2020, the worldwide rate of growth of reported cases began to accelerate from February 2020 (Figure 1). Reported COVID-19 cases continued to increase globally throughout 2020, reaching 45.7 million by the end of October 2020, and growing to over 61 million by the end of November 2020.³ The number of countries reporting COVID-19 cases rose to 22 by the end of January 2020, rising to 58 by the end of February 2020. Just a month later, by the end of March 2020, COVID-19 cases were reported in 192 countries, rising to 212 by October 2020.⁴

Governments around the world have responded to the COVID-19 pandemic with a range of policy responses including workplace and school closings, requests and orders to stay at home,

¹ WHO Director-General's statement on IHR Emergency Committee on Novel Coronavirus (2019-nCoV). 30 January 2020. World Health Organization. https://www.who.int/dg/speeches/detail/who-director-general-s-statement-on-ihr-emergency-committee-on-novel-coronavirus-(2019-ncov).

² WHO Director-General's opening remarks at the media briefing on COVID-19 - 11 March 2020. World Health Organization. https://www.who.int/dg/speeches/detail/who-director-general-s-opening-remarks-at-the-media-briefing-on-covid-19---11-march-2020.

³ Our World in Data, COVID-19 dataset, Oxford Martin Programme on Global Development, University of Oxford, and the Global Change Data Lab. https://github.com/owid/covid-19-data/tree/master/public/data (downloaded November 28, 2020).

⁴ Calculated from Our World in Data, COVID-19 dataset, ibid. Reference to countries also includes territories and dependencies separately reporting COVID-19 cases.

controls on domestic and international travel, financial and economic support, and multiple healthcare and public health measures.⁵ The Oxford COVID-19 Government Response Tracker (OxCGRT) indicates that some governments were undertaking policy responses in January 2020. However, the greatest surge worldwide in COVID-19 government responses occurred in March and April of 2020, continuing – with some fluctuations – throughout 2020, as measured by OxCGRT's global mean index values for COVID-19 government response for over 180 countries (Figure 1).⁶

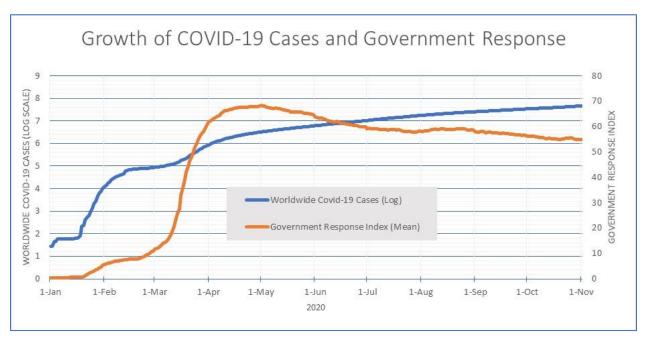


Figure 1. Calculated from Our World in Data, COVID-19 dataset (see footnote 4); and OxCGRT's global mean index values for COVID-19 government response (see footnote 6).

Implications of the COVID-19 pandemic on scientific research

Published reports and articles indicate that the COVID-19 pandemic has had multiple consequences for scientific research.

For scientists working directly on COVID-19 research, including in epidemiology, virology, testing and diagnosis, therapies and treatments, medical equipment, vaccine development, and public health responses, it has been a period of urgent focus with expectations of rapid results. Worldwide, scientists have been activated to respond to COVID-19, using both existing resources and a massive injection of

⁵ Hale, T., Boby, T., Angrist, N., Cameron-Blake, E., Hallas, L., Kira, B., Majumdar, S., Petherick, A., Phillips, T., Tatlow, H, and Webster, S. Variation in Government Responses to COVID19. Version 9.0. Blavatnik School of Government Working Paper. 24 November 2020. https://www.bsg.ox.ac.uk/sites/default/files/2020-11/BSG-WP-2020-032-v9.pdf (accessed November 28, 2020).

⁶ Our World in Data, OxCGRT COVID-19 Government Response dataset, https://github.com/owid/covid-19-data/tree/master/public/data/bsg (accessed November 28, 2020).

new R&D funds by research sponsors. 7,8 Research sponsors have shortened proposal review times and accelerated award processes for new COVID-19 R&D funding.9 More than 175 new COVID-19 R&D programs and projects have been identified by OECD in in multiple locations (including in Europe, the US, Canada, Australia, China, Brazil, Russia and India). 10 Another estimate suggests that, since January 2020, more than \$9 billion in government, philanthropic, and industry funding has been committed globally for COVID-19 R&D. 11 Much of this funding has gone to COVID-19 R&D by private companies, although universities and other public research organizations have also been supported, with the US being by far the largest sponsor, followed by Canada, Germany and the UK.¹²

The urgency of the pandemic and the extraordinary new R&D focus on COVID-19 has resulted in a massive increase in COVID-19 research publications. There has been a sharp growth in papers addressing COVID-19 topics, with US, Chinese, UK, and other European researchers anchoring the largest research networks.¹³ There has been growth not only in peer-reviewed journal articles but also in preprints (non-peer reviewed, publicly available papers) that address COVID-19 topics, with new tools and databases emerging to track and sort these papers. 14 Cautions have been raised about the quality of COVID-19 "speed science," especially among non-reviewed preprints. 15 However, one early (April 2020) study found that more than three-quarters of the 11,686 COVID-19 papers identified at that point were journal papers (compared with preprint papers in repositories, many of which were pre-publication versions of papers in processes of journal submission). 16 The study noted that the three largest openaccess repositories for COVID-19 papers were PMC and PubMed, medRxiv and BioRxiv.

⁷ OECD, Draft summary of the STIO-GSF Virtual workshop on "Mobilising science in response to COVID-19," 21 October 2020. Directorate for Science, Technology and Innovation, Committee for Scientific and Technological Policy, DSTI/STP/GSF/M(2020)2/ANN, Organisation for Economic Co-operation and Development, Paris. https://community.oecd.org/docs/DOC-184320 (accessed November 28, 2020).

⁸ Lem, P. Grant 'repurposing' towards Covid-19 widespread. Research Professional News, August 10, 2020. https://www.researchprofessionalnews.com/rr-news-europe-universities-2020-8-grant-repurposing-towardscovid-19-widespread/

⁹ Kaiser, J. NIH grapples with rush to claim billions in pandemic research funds. Science, June 3, 2020. http://doi.org/10.1126/science.abd1508.

¹⁰ OECD, COVID19 Research funding worldwide (to 21 September 2020). Organisation for Economic Co-operation and Development, Paris. https://community.oecd.org/docs/DOC-171875 (accessed November 28, 2020).

¹¹ COVID-19 R&D Tracker. Policy Cures Research. https://www.policycuresresearch.org/covid-19-r-d-tracker (accessed November 28, 2020). This estimate is obtained from public funding announcements and press releases. Policy Cures Research notes that this is an incomplete estimate which does not include vaccine R&D and other R&D associated with the €7.4 billion (\$8.8 billion) European Union Coronavirus Global Response and the more than \$11.4 billion committed by the US Government to a range of agencies including BARDA (Biomedical Advanced Research and Development Authority). Chinese governmental COVID-19 R&D is not included, although the COVID-19 R&D Tracker does capture funding by some Chinese philanthropic and industrial organizations. ¹² COVID-19 R&D Tracker, ibid.

¹³ Fry, C.V., Cai, X., Zhang, Y., and Wagner, C.S. Consolidation in a crisis: Patterns of international collaboration in early COVID-19 research. PLoS ONE, 2020, 15(7): e0236307. https://doi.org/10.1371/journal.pone.0236307.

¹⁴ Brainard, J. New tools to tame pandemic paper tsunami, Science, May 29, 2020, 368 (6494), 924-924.

¹⁵ Sharma, M., Scar, S., and Kelland, K. Coronavirus and the risks of 'speed Science. 24 March 2020. World Economic Forum. https://www.weforum.org/agenda/2020/03/speed-sciencecoronavirus-covid19-research-academic (accessed October 23, 2020).

¹⁶ Torres-Salinas, D., Robinson-Garcia, N., Castillo-Valdivieso, P.A. Open Access and Altmetrics in the pandemic age: Forescast analysis on COVID-19 literature. bioRxiv, posted April 26, 2020. https://doi.org/10.1101/2020.04.23.057307.

Meanwhile, particularly since March 2020 as governments expanded responses to curtail the spread of the pandemic, scientists in non-COVID-19 research domains have endured multiple disruptions to regular research work. ^{17,18,19} Research facilities, laboratories, and labs have been closed for long periods in many countries. Across all fields, large numbers of researchers have spent months working from home, using remote access where possible. The recruitment of doctoral and early career researchers (especially internationally) has slowed, where it was not suspended. ²⁰ Research-related fieldwork and other travel has halted, while online video conferencing for team meetings, workshops and conferences has boomed. With school closures and social distancing, scientists with family and other caring responsibilities have faced added pressures, with effects on research productivity especially experienced by women. ^{21,22}

The closure of research facilities in 2020 resulted in benchwork, experiments and trials being stopped and the blocking of access to labs, instruments, and equipment. For example, more than 90% of labs at MIT were shut by March 20.²³ The only exemptions were for labs working with coronavirus research, expensive materials, and certain animal experiments. As elsewhere, researchers shifted to a virtual environment, including using (and publishing with) already available data, or reorienting projects to involve more simulation work. In some instances, new lab automation was introduced. However, remote working for many months has presented challenges. For non-COVID 19 cancer research, access to labs and samples, the pausing of patient enrolment on clinical trials, and face-to-face interactions with colleagues have been major concerns.²⁴ In contrast, for some other non-lab bound scientists, the worldwide slowdown or ceasing of human activities caused by the pandemic presented unique observational opportunities. New opportunities emerged to study impacts of reduced traffic, ocean

¹⁷ Council on Governmental Relations. Research Impact under COVID-19. August 25, 2020. Washington, DC. https://www.cogr.edu/sites/default/files/Research COVID August2020 COGR FINAL.pdf (accessed September 3, 2020).

¹⁸ Vitae. Covid-19 impact on researchers. Study commissioned by the Department for Business, Energy and Industrial Strategy, UK. October 12, 2020. Results reported at https://www.vitae.ac.uk/news/vitae-news-2020/impact-of-lockdown-on-researchers-in-uk (accessed November 29, 2020).

¹⁹ Larkins, F., et al., Impact of the pandemic on Australia's research workforce. May 8, 2020. Research Brief. Australian Government, Chief Scientist. https://www.science.org.au/sites/default/files/rrif-covid19-research-workforce.pdf (accessed November 29, 2020).

²⁰ European Commission, Impact of Covid-19 on International Students in EE and OECD Member States. Inform #2. https://ec.europa.eu/home-affairs/sites/homeaffairs/files/00_eu_inform2_students_final_en.pdf (accessed November 29, 2020).

²¹ Andersen, J.P., Nielsen, M.W., Simone, N.L., Lewiss, R.E., and Jagsi, R. Meta-Research: COVID-19 medical papers have fewer women first authors than expected. June 15, 2020. eLife 2020;9:e58807. https://doi.org/10.7554/eLife.58807.

²² Myers, K.R., Tham, W.Y., Yin, Y., Cohodes, N., Thursby, J.G., Thursby, M.C., Schiffer, P., Walsh, J.T., Lakhani, K.R., and Wang, D. Unequal effects of the COVID-19 pandemic on scientists. Nature Human Behaviour, 4, 880–883 (2020). https://doi.org/10.1038/s41562-020-0921-y.

²³ Blanding, M. Research in the Time of COVID. Technology Review. October 20, 2020. https://www.technologyreview.com/2020/10/20/1009361/research-in-the-time-of-covid/ (accessed October 24, 2020).

²⁴ Institute for Cancer Research. Pandemic to delay cancer advances by nearly 18 months, researchers fear. November 30, 2020, London, https://www.icr.ac.uk/news-archive/pandemic-to-delay-cancer-advances-by-nearly-18-months-researchers-fear (accessed November 30, 2020).

shipping, pollution, noise, and other human activities on the environment, cities, and the natural world.^{25,26}

Towards the middle and latter months of 2020, research labs began to re-open in a growing number of countries. In this phase of ramp-up, labs typically re-opened with capacity reductions or controlled shift work due to social distancing and other preventative measures.^{27,2829} At the UK's Institute for Cancer Research, the proportion of time researchers spent in labs dropped from 53% pre-pandemic to 5% in lockdown, returning only to 34% many months later during phased access.³⁰

The reopening of research labs for non-COVID-19 research has proceeded cautiously, even in locations, such as China, where the spread of COVID-19 has been controlled following the initial outbreak. In other countries, including in the UK and other parts of Europe, there have been phases of ramping-up of some research activities, followed by subsequent lockdowns in the Autumn of 2020.

The outlook for the large-scale rollout of safe and effective vaccines now appears optimistic for 2021. However, there remain uncertainties in many countries as to when labs can fully open, without social distancing, and when international travel will fully resume. Some work practices established in the pandemic may persist (including continued extensive use of virtual team working and virtual conferencing), while there are likely to be enduring impacts for many researchers in terms of lost experiments, reoriented topics, and career development.

Identifying COVID-19 publications: A bibliometric search approach

To provide an update to bibliometric studies undertaken earlier in the pandemic, the paper probes trends in COVID-19 publications and non-COVID-19 publications as far as is possible in 2020.

Complete publication data for the full year of 2020 is not available at the time of this analysis. Access is available for publication datasets through to September to November of 2020, allowing about 9 to nearly 11 months of publication data to be analyzed (depending on the database). Two publication databases are used. The first is the PubMed database, maintained by the National Center for Biotechnology Information at the US National Library of Medicine (NLM). This allows searches of more than 31 million journal records and abstracts in biomedical, health and related fields, including more than 8 million full-text records.³¹ The second database is the Web of Science (WoS), maintained by

²⁵ Ball, P. Why lockdown silence was golden for science. The Guardian, 20 June 2020. https://www.theguardian.com/science/2020/jun/20/why-lockdown-silence-was-golden-for-science (accessed June 21, 2020).

²⁶ Stokstad, E. Pandemic lockdown stirs up ecological research, Science, 28 August 2020, 369 (6506), 893.

²⁷ Grim, D. As labs move to reopen, safety worries abound. Science, 15 May 2020. 368 (6492), 690-691.

²⁸ JASON. Managing the Risk from COVID-19 During a Return to On-Site University Research. JSR-20-NS1. August 25, 2020. MITRE Corporation, VA.

²⁹ Working safely during coronavirus (COVID-19). Labs and research facilities. Department for Business, Energy & Industrial Strategy and Department for Digital, Culture, Media & Sport, UK. Updated 27 November 2020. https://www.gov.uk/guidance/working-safely-during-coronavirus-covid-19/labs-and-research-facilities (accessed November 29, 2020).

³⁰ Institute for Cancer Research, op. cit. (footnote 24).

³¹ As of November 29, 2020, PubMed reports a total of 31,813,673 publication records (https://pubmed.ncbi.nlm.nih.gov/?term=%221800%3A2100%5Bdp%5D%22). Of these, 8,371,581 are free full text

Clarivate Analytics, which contains 78 million publication records from about 21,000 peer-reviewed journals in more than 250 fields of science, social science, and arts and humanities.³² Both PubMed and WoS have worldwide coverage, although they predominantly contain English-language records.³³

To identify COVID-19 records in PubMed, the following COVID-19 bibliometric search approach developed by Search Technology and Georgia Tech was used:³⁴

PubMed: "COVID-19"[All Fields] OR ("coronavirus"[MeSH Terms] OR "coronavirus"[All Fields])
 OR "Corona virus"[All Fields] OR "2019-nCoV"[All Fields] OR "SARS-CoV"[All Fields] OR "MERS-CoV"[All Fields] OR "Severe Acute Respiratory Syndrome"[All Fields] OR "Middle East Respiratory Syndrome"[All Fields]

This search approach was applied to PubMed to obtain summary totals for COVID-19 records for all years. Additionally, for detailed analysis based on aggregations of individual records, the paper uses a publicly available database of COVID-19 PubMed records made available by Search Technology based on the above search approach. This database contained 56,463 COVID-19 records from PubMed published in 2020 through to September 22, 2020 (All documents).³⁵

To identify COVID-19 records in WoS, the same bibliometric search approach was adapted for the WoS Advanced Search facility:

• **WoS**: TS=("COVID-19" OR Coronavirus OR "Corona virus" OR "2019-nCoV" OR "SARS-CoV" OR "MERS-CoV" OR "Severe Acute Respiratory Syndrome" OR "Middle East Respiratory Syndrome")

This search approach was applied to the WoS (Indexes=SCI-EXPANDED, SSCI, A&HCI, CPCI-S, CPCI-SSH, ESCI) refined by document types (article, early access, review, or proceedings paper). After capturing records and cleaning, this resulted in 44,022 COVID-19 WoS records, published 1969 through to October 24, 2020. Aggregated analysis was also undertaken for all WoS publication records (with same Indexes and document types, for 2020) downloading the summary results (but not individual records).

VantagePoint desktop text mining software was used for further processing and analysis of the two datasets containing the WoS and PubMed records.³⁶

The next parts of the paper present analyses using the WoS and PubMed publication data. In interpreting these analyses, keep in mind the differences between the two databases. As noted, the WoS covers all fields of science, social science, and arts and humanities. The analysis that follows includes articles, early access, review, or proceedings papers from reviewed sources. Articles and

⁽https://pubmed.ncbi.nlm.nih.gov/?term=%221800%3A2100%5Bdp%5D%22&filter=simsearch2.ffrft) from NLMs PubMed Central (full-text database of articles) and other sources.

https://clarivate.com/webofsciencegroup/solutions/web-of-science-core-collection/. A search of the Web of Science (November 29, 2020) returns 78,153,527 publication records (Indexes=SCI-EXPANDED, SSCI, A&HCI, CPCI-S, CPCI-SSH, BKCI-S, BKCI-SSH, ESCI, CCR-EXPANDED)

³³ Publications in languages other than English comprised 14.9% and 7.5% respectively of the total number of PubMed and WoS reported in footnotes 31 and 32.

³⁴ http://www.techminingforglobalgood.org/open-covid-19-research-for-analysis/.

³⁵ http://www.techminingforglobalgood.org/open-covid-19-research-for-analysis/ (accessed October 24, 2020).

³⁶ See: https://www.thevantagepoint.com/.

reviews comprise about 95% of the COVID-19 WoS dataset. Preprints and chapters in edited volumes are not included, and there is some lag (most relevant for 2020 data) in review and publication processes. PubMed is focused on biomedical, health and related fields, but there is a wider sweep in the records reported including Medline (containing publication records from evaluated journals), papers from other journals, chapters and preprints (the latter with less time lag in posting).

Growth of COVID-19 publications in 2020

Research related to various forms of coronavirus has been undertaken for several decades, with publication at a relatively low level, e.g. at around 150-200 annual publications in the late 1990s and early 2000s.³⁷ There was a spike in research publications with about 700 WoS and 4,000 PubMed publications over the 3-year 2003-2005 period, with the global emergence of severe acute respiratory syndrome (SARS), a distinct coronavirus (SARS-CoV). Subsequently, coronavirus-related publications continued at annual levels of around 650 and 760 in the WoS and PubMed in the 2006 to 2019 period.

The publication profile, of course, changed dramatically in 2020, with the rapid worldwide spread of COVID-19. The urgent focus of scientific attention generated by the pandemic, as noted earlier in this paper, has been associated with a massive increase in publication outputs on COVID-19 topics. From January to November 2020, more than 38,000 WoS and 78,000 PubMed publications were recorded. Reflecting the upward step in the volume of COVID-19 publications is a noticeable shift in 2020 in the proportion of all scientific publication efforts devoted to pandemic-related research. When compared with 2019, the share of COVID-19 publications in 2020 in all publications rose from 0.03% to 1.8% in the WoS and from 0.07% to 5.3% in PubMed (Figure 2).

On a month-by-month basis in 2020, COVID-19 research publications in PubMed began to accelerate in February and March 2020 (when the global extent of the pandemic was fully realized, and government responses heightened). There was a further increase in rate of PubMed COVID-19 outputs from April through to the Summer of 2020. (Figure 3.) This analysis is based on PUBMED records published in 2020 as of September 22, 2020. Publication tallies for more recent months are not completely captured. In other words, the apparent downward PubMed profile from August 2020 is based on incomplete record capture. More publications will be added in the more recent months when 2020 is more fully indexed (by the first part of 2021). WoS COVID-19 publications show comparable trends, except with a lower rate of take-off (than for PubMed publications) in Spring 2020. Again, the WoS dataset (containing COVID-19 publication records as of October 24, 2020) is not complete for more recent months.

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³⁷ In 2000, there were 141 WoS and 151 PubMed publication recorded on coronavirus-related topics.

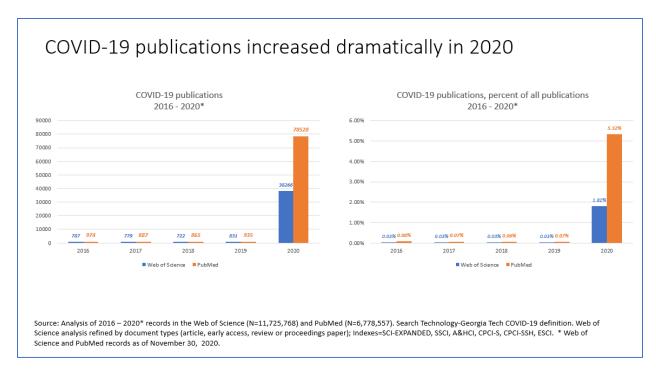


Figure 2

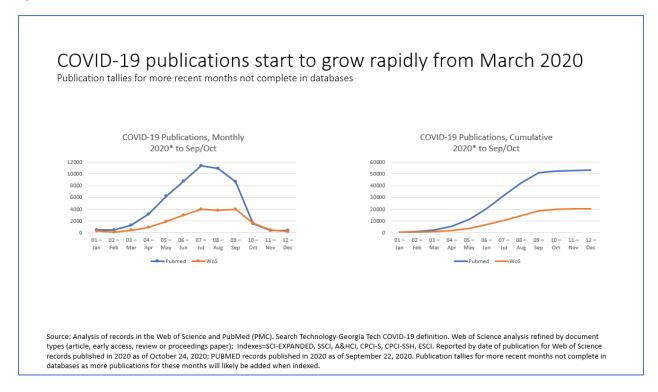


Figure 3

COVID-19 publications in 2020 by countries and organizations

By country, based on author affiliation location, for both WoS and PubMed COVID-19 research publications in 2020, the leading producer is the US, followed by China, the UK, and Italy (Figure 4). The

mid-size developed (OECD)³⁸ countries of France, Canada, Spain, Germany, and Australia comprise all but one among other locations in the top ten. India is positioned fifth by number of 2020 COVID-19 papers, with two other non-OECD countries – Brazil and Iran – placed eleventh and twelfth.

Based on WoS publications, the positioning of the US and China is reversed when publications across all fields is considered. The US contributed 29.1% of 2020 publications in the COVID-19 WoS dataset, compared with 22.3% of all WoS publications over the period January 2020 through to November 2020, a ratio of Covid-19 to all papers of 1.30.³⁹ The comparable numbers for China are 15.6% of COVID-19 WoS papers and 23.6% of all WoS papers, with a ratio of Covid-19 to all papers of 0.66. Understanding the reasons for this difference needs further investigation, but it probably reflects the strong and relatively larger base of biomedical research in the US and the influence of rapidly available added COVID-19 research funding. Additionally, it is important to note that China has published and made available a large volume of WoS (as well as PubMed) papers on COVID-19.

Among other countries, the UK, Italy, India and Canada published in 2020 (to date) a relatively larger share of COVID-19 WoS papers when compared with all WoS papers (ratios of 1.46, 2.43, 1.15, and 1.15 respectively). France and Germany are among countries publishing COVID-19 papers in 2020 at comparable or relatively lower rates when compared with all WoS papers (1.03 and 0.83 respectively). Authors affiliated with institutions in Russia published COVID-19 WoS papers at relatively lower rates when compared with all Russian WoS papers (ratio of 0.42).

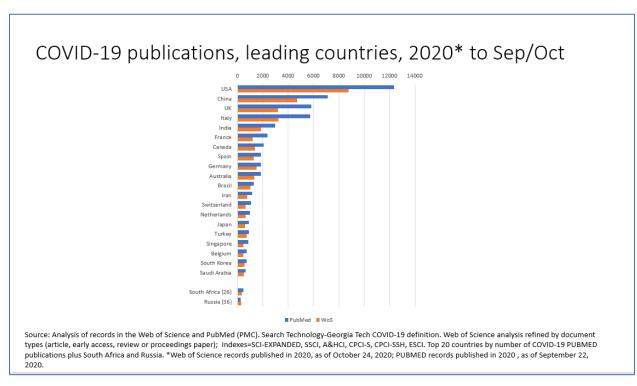


Figure 4

³⁸ Organisation for Economic Cooperation and Development.

³⁹ Comparison of COVID-19 WoS study dataset with aggregate WoS publications analyzed by countries (same indexes and document types) for January 1, 2020 - November 30, 2020 (N=2,199,639).

Researchers from a wide range of organizations (based on author affiliations) in multiple countries have been contributing to the rapid expansion of COVID-19 research papers in 2020. Of the top 20 organizations by PubMed COVID-19 publications in 2020 (to September 22), nine are based in the US, four in China, two in the UK, and one each in Singapore, Italy, India, Canada, and Iran (Figure 5). Mostly, the leading organizations are research universities and specialized medical research institutions, although there is notable representation from identifiable hospitals and clinics.⁴⁰ For WoS COVID-19 publications in 2020 (to October 24), organizations from fewer countries are represented in the top 20, but the top part of that list is comparable, led by eight organizations based in the US, six in China, and three in the UK (Figure 6).



Figure 5

Huazhong University of Science and Technology (in Wuhan, Hubei province, China) is the leading publisher of both PubMed and WoS COVID-19 papers, by volume of papers. Wuhan University is tenth organization by PubMed COVID-19 papers and third by WoS COVID-19 papers, again by volume of output. ⁴¹ The University of Hong Kong is also a leading producer of PubMed COVID-19 outputs. Johns Hopkins University, the Harvard Medical School, the University of Toronto, and the University of

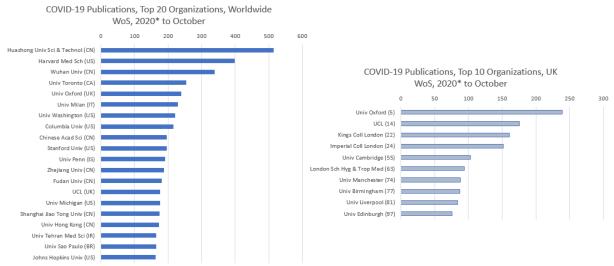
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⁴⁰ In the top 100 COVID-19 publishing organizations by author affiliations in the PubMed dataset, 54 are indicated as universities, 25 as medical schools, 18 are hospitals or clinics, and 3 are national or public research organizations. However, organizations and affiliations can be intertwined. Hospitals and clinics are often associated with universities. In some cases, researchers will publish with a university or medical school or hospital affiliation (or a combination of two or more affiliations).

⁴¹ Wuhan is the city where the first large scale outbreak of COVID-19 was identified. See: Novel Coronavirus – China, 12 January 2020, World Health Organization, https://www.who.int/csr/don/12-january-2020-novel-coronavirus-china/en/; C. Huang et al., Clinical features of patients infected with 2019 novel coronavirus in Wuhan, China, The Lancet, January 24, 2020, https://doi.org/10.1016/S0140-6736(20)30183-5.

Pennsylvania in North America, and University College London and Oxford University in the UK, are leading producers of PubMed COVID-19 publications. These are all large research institutions with significant medical and public health research capabilities. By output of WoS COVID-19 papers, research institutions in China, North America, and Europe (the UK and Italy) comprise the top ten.⁴²

Organizations by number of 2020 COVID-19 publications (WoS)



Source: Analysis of records in the Web of Science. Search Technology-Georgia Tech COVID-19 definition. Web of Science analysis refined by document types (article, early access, review or proceedings paper); Indexes=SCI-EXPANDED, SSCI, A&HCI, CPCI-S, CPCI-SSH, ESCI. Organizations ranked by number of COVID-19 WoS publications. *Web of Science records published in 2020, as of October 24, 2020. Organizational names as presented in WoS (e.g. not all are consolidated by universities and university hospitals). For UK organizations, global ranking by number of COVID-19 WoS publications in parentheses.

Fiaure 6

COVID-19 Publications by Subject Categories

The journals included in the WoS publication database are classified by over 250 "subject categories." ⁴³ These subject categories (SCs) are broadly equivalent to disciplines, but this is not a perfect match. ⁴⁴ Journals can and do cover multiple fields of science. In the WoS scheme, journals (and the papers they publish) may be classified in up to 6 SCs, although about 60% of journals in WoS are classified in only one SC, with another 30% classified in two SCs. ⁴⁵ Some journals are explicitly interdisciplinary. Reflecting this there are nine WoS SCs that are designated as multidisciplinary, including "Multidisciplinary Sciences" (which includes such journals as *Nature* and *Science* that publish across all fields of science).

⁴² While there are broad similarities in outputs of COVID-19 PubMed and WoS papers by organizational affiliations, some differences are also observable. Underlying reasons for these differences may include variations in organizational structure (e.g. university relationships with medical schools and affiliated hospitals) and disciplinary composition within each institution, topical foci, and distribution of publication outlets including by journal, peer reviewed and preprint placements.

⁴³ Web of Science Core Collection: Web of Science Categories. Clarivate.

https://support.clarivate.com/ScientificandAcademicResearch/s/article/Web-of-Science-Core-Collection-Web-of-Science-Categories?language=en_US (accessed December 3, 2020).

⁴⁴ See: Milojević, S. Practical method to reclassify Web of Science articles into unique subject categories and broad disciplines. Quantitative Science Studies 2020 1:1, 183-206. https://doi.org/10.1162/qss a 00014.

⁴⁵ Wang, Q., and Waltman, L. Large-scale analysis of the accuracy of the journal classification systems of Web of Science and Scopus. Journal of Infometrics, 2020, 10, 347-364. https://doi.org/10.1016/j.joi.2016.02.003.

The journal SC (or combination of SCs) is allocated to every paper in the journal, although individual papers within a particular journal may be varied in their subject matter. Additionally, as scientific fields evolve and novel fields form, new journals typically emerge. This presents classification challenges and lags, although SCs and constituent journals are periodically updated to reflect changes in fields, new fields, and repositioning of journals. While it is convenient and common to use WoS SCs to overview the distribution of published outputs by various scientific fields, these caveats about the classification scheme should be kept in mind.

To provide a basis over time for comparison, WoS COVID-19 publications are analyzed for two time periods: 2017-2019⁴⁶ and 2020 (through to October 24). (Figure 7.) In the earlier period, "Virology" was the leading SC category, with 562 coronavirus WoS publications, or 24.4%) of this SC's total from 2017 to 2019 (three complete years). In this earlier period, the second and third SCs by 562 coronavirus WoS publications were "Infectious Diseases" (354 publications) and "Microbiology" (285 publications). Together, more than half (52.1%)⁴⁷ of earlier period coronavirus outputs were classified in these three SCs, reflecting a research focus on the properties and microbiology of the virus itself.

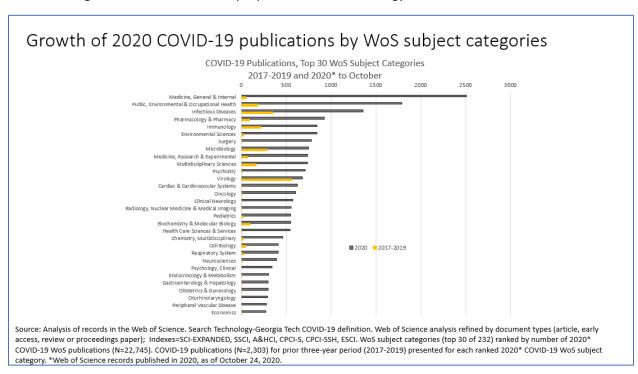


Figure 7

In 2020, the profile of COVID-19 research publications dramatically changed — with an upsurge in the volume of publications and engagement of scientists from a wider array of research fields. There was a massive increase in "Medicine, General & Internal" (over 2,500 WoS COVID-19 publications in 2020 to date, compared with just over 50 WoS coronavirus publications in the prior three-year period). Along with large increases of 2020 COVID-19 WoS publications in the SCs of "Public, Environmental &

 46 The 2017-2019 period was chosen to provide a recent comparison and to gather a reasonably sized dataset (N=2,303) across WoS SCs.

 $^{^{47}}$ Percentage totals by SCs add up to more than 100% reflecting articles in journals that are assigned two or more SCs.

Occupational Health," "Pharmacology & Pharmacy," "Environmental Sciences," "Surgery," and "Medicine, Research and Experimental," this represents an understandable and rapid broadening of COVID-19 research activities into the domains of treatment, therapy, contagion, and public health. Multiple other medical fields with little prior coronavirus research activity saw significant increases in 2020 COVID-19 WoS publications, including "Psychiatry," "Cardiac &, Cardiovascular Systems," "Oncology," "Clinical Neurology," "Radiology," "Nuclear Medicine & Medical Imaging," and "Pediatrics" (see Figure 7). The SCs of "Infectious Diseases," "Microbiology," and "Virology," as with "Immunology", "Biochemistry & Molecular Biology," and "Cell Biology", all saw surges in 2020 COVID-19 WoS publications as researchers further analyzed the nature and pathology of the virus and explored human impacts and responses. Research on vaccines is categorized across several SCs: the leading categories for COVID-19 WoS publications related to vaccines are "immunology," "Virology", "Medicine, Research and Experimental," "Microbiology," and Biotechnology & Applied Microbiology."

COVID-19 Pivots in 2020 by Research Fields

With the urgency and global spread of the pandemic in 2020, scientists around the world have substantially expanded their COVID-19 research efforts. One outcome of this, as we have seen, is a massive increase in the volume of PubMed and WoS publications on COVID-19 topics. It is evident, from the analysis in the previous section of WoS subject categories, that researchers in medicine, biological sciences, and public health domains have greatly expanded COVID-19 publication outputs in 2020. The entry of "Economics" (at 30th place) in the top 30 SCs by number of WoS COVID-19 publications in 2020 (Figure 7) highlights COVID-19 research activity in the social sciences. This is comprehensible: while the global pandemic has caused tragic public health consequences and massive impacts on health care systems, it has resulted in huge effects worldwide across all aspects of life and human activity, economy, society, community, and government.

Given the scale and scope of the pandemic, scientists across a wide range of research fields will surely be interested in, and concerned about, the impacts and consequences of COVID-19 in its many and varied forms. Those interests and concerns may take different forms including policy and community engagement as well as reoriented or new research projects related to COVID-19 topics. Publication opportunities from these activities and projects likely varies across fields. As discussed earlier in this paper, large numbers of scientists not working directly on urgent COVID-19 medical, biological science, or public health topics have spent much of 2020 working from home or at reduced levels of access to their labs, field sites, or research subjects. This surely influences research paper productivity. In certain circumstances, output may increase, for example for scientists working directly on urgent COVID-19 topics or who have access to data that can be written up. We have clearly seen a massive increase in PubMed and WoS publications related to COVID-19. To an extent, this wave of new COVID-19 publications may have substituted for what would have been other outputs; or the urgency of the pandemic and the massive efforts of researchers (and perhaps a strong desire by some to be first to publish) may have generated increased publication productivity. In many other cases, there may be adverse effects on publication productivity, where research has slowed or paused or where researchers have been preoccupied with family or caring responsibilities, online teaching (where researchers also teach), crisis management, or suffered personal or family health impacts.

It is important for many reasons (including research management, researcher career development, and policy learning) to assess how research productivity, as measured by publication outputs, has been

affected during the pandemic, with comparison to pre-pandemic norms (and, of course, the postpandemic era, when we reach that point). Such an analysis should account for field and institutional effects as well as potential differential effects by researcher gender, seniority, and roles. Any immediate (2020) analysis should also account for the significant variations in time lags to publication by journals in different fields⁴⁸ and the impact of the pandemic on journal peer review processes.⁴⁹

However, 2020 is not yet complete (at the time of analysis and writing). Indeed, a complete record of publications for the full year of 2020 will only be available only in 2021, as some time needs to elapse before all prior period publications are recorded in indexes such as PubMed or WoS. Hence, it is not yet possible to undertake disaggregated and controlled measures of research publication output by quantity for the full year of 2020 compared with 2019 (or, indeed, for earlier years).

These caveats noted, it is nonetheless possible to assess COVID-19 research pivots not only for medical, biological science, or public health fields, but across all domains of science, social science, and the humanities. A COVID-19 research pivot is defined as the extent to which the proportion of output in a particular research field has shifted to a focus on COVID-19 topics in 2020 (to date) compared with 2019. COVID-19 research pivoting is calculated by measuring publication outputs on COVID-19 topics in a field as a percentage of all publication outputs in that field for 2019 and 2020, then subtracting the 2019 percentage from the 2020 percentage. This results in a COVID-19 "pivot point" index. This is a simple method, but it is effective in normalizing outputs for the yet not quite complete year of 2020. There are some fields (for example, "Virology") with a proportion of publication outputs captured by the COVID-19 bibliometric search term in 2019; the pivot point measure highlights the added extent to which the proportion of 2020 COVID-19 publication outputs increased over the prior year. Most research fields, however, had zero 2019 COVID-19 publication outputs; in this case, the pivot point measures the new extent to which research outputs in that field shifted to a COVID-19 focus in 2020, if at all.

The method is operationalized by applying the COVID-19 bibliometric search term to the full WoS online database as of October 24, 2020 (Indexes=SCI-EXPANDED, SSCI, A&HCI, CPCI-S, CPCI-SSH, ESCI) refined by document types (article, early access, review, or proceedings paper). For 2019, the total number of WoS records is 2,567,047, of which 828 are identified as COVID-19 publications. For 2020 (through to October 24), the total number of WoS records is 1,952,201, of which 30,143 are identified as COVID-19 publications. WoS subject categories (SCs) are used as a proxy for research fields. All 254 WoS SCs (as of October 2, 2020) are included in the analysis. (See Appendix for data table.)

Recall that not all 2020 publications are recorded yet (whether for papers with COVID-19 or non-COVID-19 topics). Whether a WoS publication count of about 1.9 million papers by the third week of October 2020 (or 2.1 million by the end of November 2020⁵⁰) is significantly different from the comparable numbers at the same time in 2019 cannot be determined as that data is not available to the researcher

papers are increasingly publicly available and citable prior to official publication, see, for example: Haustein, S., Bowman, R., and Costas, R. When is an article actually published? An analysis of online availability, publication,

and indexation dates. arXiv: 1505.00796, 2015. https://arxiv.org/abs/1505.00796.

⁴⁸ Björk, B-C., and Solonon, D. The publishing delay in scholarly peer-reviewed journals. Journal of Infometrics, 2020, 7, 914-923, http://dx.doi.org/10.1016/j.joi.2013.09.001. Note: with the growth of preprints and early access,

⁴⁹ Journal peer review processes in 2020 have also been affected by the pandemic. Journals dealing with COVID-19 topics have seen huge increases in submissions, with peer reviewers under pressure to review quickly, while in other journal fields, editorial and review delays are reported. Elsevier, Review delays during coronavirus crisis, ⁵⁰ As reported in Figure 2.

(although that information would be available internally to the producer of the database). However, it can be observed that there has been an overall increase in the share of COVID-19 outputs in all WoS publications, increasing from 0.03% in 2019 to 1.5% in 2020 (to October 24). This represents an absolute and significant increase of about 29,300 COVID-19 papers in 2020 (to October 24). Most published papers recorded in the WoS in 2020 are *not* COVID-19 related (i.e. the whole of science has not pivoted to COVID-19 research). Nonetheless, by specific SCs, there are substantial variations, with some fields (as defined by WoS subject categories) making noticeable COVID-19 research pivots, while in most fields there is a small or non-detectable COVID-19 research pivot.

To analyze the extent of the relative shift into COVID-19 research topics by individual scientific fields in 2020 (to October 24), the COVID-19 research pivot (*RP*) measure is calculated for each WoS SC. For the 254 SCs, key *RP* values are: maximum = 15.8; mean = 1.5; median = 0.6; and minimum = 0.0. An asymmetrical and skewed distribution is indicated, with a long right tail of low to zero *RP* values. To visualize the distribution, the ranked *RP* measures by SC are presented by quintiles. The top quintile is named as comprising "high to medium" pivots, the second and third quintiles as "medium to low" pivots, and the fourth and fifth quintiles as "low to zero" pivots. Percentages of SC COVID-19 related outputs are denoted as *cPC19* and *cPC20* for 2019 and 2020 (to October 24) respectively.

In the first quintile, the SC with the highest COVID-19 research pivot is "Virology" (*RP*=15.8; *cPC19*=3.0%; *cPC20*=18.8%). (Figure 8.) The second highest is "Medical Ethics" (*RP*=15.0, *cPC19*=0.0%; *cPC20*=15.0%). Rounding out the top ten SCs with highest relative COVID-19 research pivots are "Infectious Diseases" (*RP*=9.5), "Medicine General Internal" (*RP*=7.0), "Otorhinolaryngology" (*RP*=6.4), "Public Administration" (*RP*=6.3), "Critical Care Medicine" (*RP*=5.6), "Public Environmental & Occupational Health" (*RP*=5.5), "Emergency Medicine" (*RP*=5.3), and "Health Care Sciences Services" (*RP*=5.2). For only three of these ten SCs is *cPC19* > 0.0, indicating that most of these fields have made a new and rapid research pivot into COVID-19 in 2020. Additionally, while six of the top ten SCs with the highest *RP* rankings are in medical specialties (including emergency and critical care) and biological sciences, the other four are in fields of medical ethics, public administration, public health, and health care delivery, highlighting the wide-ranging implications of the pandemic taken up by researchers.

This pattern is replicated in the balance of the first quintile of high to medium *RPs*, with multiple medical specialties, biological sciences, and public health fields represented, alongside "Ethics," "Social issues," "Health Policy Sciences," "Social Sciences, Biomedical," and "Social Work." Other entries in the medium *RP* sections of the first quintile also include "Folklore", "Law", and "Women's Studies."⁵³

⁵¹ The aggregated WoS publication numbers reported in this analysis are slightly lower than reported in Figure 2. The reason is that the subject category analysis in this section was undertaken with data as of October 24, 2020 (when WoS reported 1.95 million records), while Figure 2 is based on data from November 30, 2020 (when WoS reported 2.105 million records) 2020 (Indexes=SCI-EXPANDED, SSCI, A&HCI, CPCI-S, CPCI-SSH, ESCI) refined by document types (article, early access, review, or proceedings paper).

⁵² The 2020 COVID-19 share of all WoS publications is lower than reported for PubMed (see earlier discussion and Figure 2). PubMed focus on medical, bioscience, and public health domains and includes preprints, while WoS primarily covers journals across all fields of science, social science, and the arts and humanities.

⁵³ These fields vary in size, with total SC publishing (in 2020) ranging from many thousands to a few hundred. While "Folklore" is the smallest field in the top quintile (*RP*=3.8, *cPC19*=0.0%; *cPC20*=3.8%), researchers in this field have published in 2020 on such subjects as myths and urban legends about coronavirus, and how the pandemic has affected museums and traditional folk crafts.

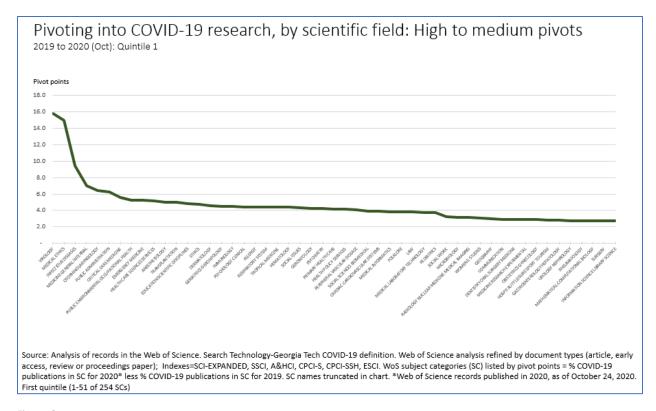


Figure 8

Of the 51 SCs in the first quintile, 35 (69%) are indexed in the WOS SCI, 15 (29%) in SSCI, and 1 (2%) in A&HCI.⁵⁴ In the first quintile, 2.7 < RP < 15.8 with a mean (\bar{x}) of 4.6.

The second and third quintiles ("medium to low" COVID-19 research pivots) also contain a mix of science, social science, and arts and humanities SCs. (Figure 9.) "Parasitology" (*RP*=2.7, *cPC19*=0.2%; *cPC20*=2.7%) and "Clinical Neurology" (*RP*=2.6, *cPC19*=0.0%; *cPC20*=2.6%) lead this intermediate set of quintiles, ranked 52 and 53 (of 254) respectively. The entries from SSCI and A&HCI in this set are led by "Area Studies" (*RP*=2.6, *cPC19*=0.0%; *cPC20*=2.6%) and "Cultural Studies" (*RP*=2.0, *cPC19*=0.0%; *cPC20*=2.0%). Although "Economics" is represented in 30th position by absolute number of COVID-19 publications (Figure 7), it is more moderately ranked (89 of 254) in terms of its relative COVID-19 research pivot (*RP*=1.4, *cPC19*=0.0%; *cPC20*=1.4%). Economics is one of the largest producers of SSCI WoS publications; however, even though 350 COVID-19 related papers were identified in 2020 (to October 24), this was a relatively small proportion of its total SC output (25,325) to the search date.

Of the 101 SCs in the second and third quintiles, 55 (54%) are indexed in SCI, 34 (34%) in SSCI, and 12 (12%) in A&HCI. In this medium to low set, 0.3 < RP < 2.7 ($\bar{x} = 1.2$). In the last set, the fourth and fifth quartiles, there are 102 SCs, of which 76 (75%) are indexed in SCI, 7 (7%) in SSCI, and 19 (19%) in A&CHI. In this "low-to zero" set, $0.0 \le RP < 0.3$ ($\bar{x} = 0.1$). In 37 SCs in the lowest quintile, no COVID-19 related papers were identified out of more than 216,000 WoS publications for 2020 (to October 24). (Figure 10.) Again, note that publication data for 2020 is incomplete; researchers in these SCs may have preprints, papers or forthcoming and other COVID-19 research contributions not captured by this analysis.

⁵⁴ SCI=Science Citation Index; SSCI = Social Science Citation Index; A&HCI = Arts and Humanities Citation Index.

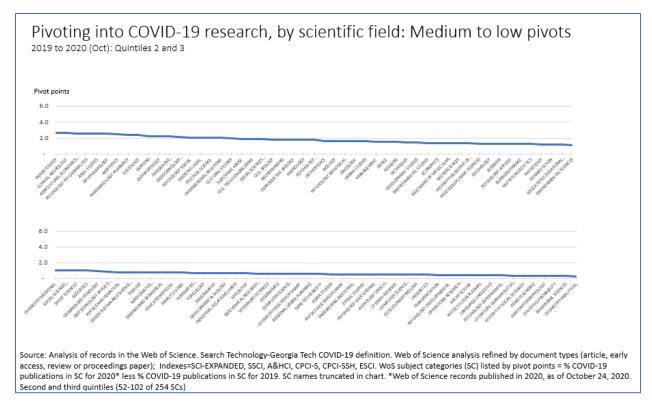


Figure 9

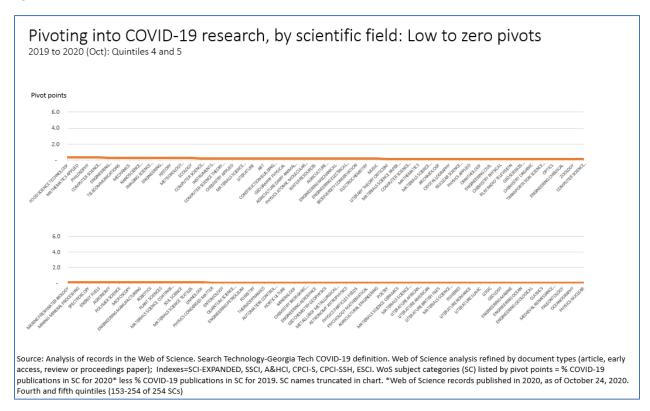


Figure 10

Concluding Comments

The analyses presented in this paper should be regarded as preliminary. In 2020, scientific research around the world has been massively impacted by the global COVID-19 pandemic; these impacts are still in progress and will likely continue well into 2021. The full consequences and implications of COVID-19 and the pandemic on science, researchers and research institutions will take some further time, possibly years, to be wholly comprehended.

The paper has used available secondary and bibliometric data to analyze one aspect of the pandemic's impacts on research, focusing on publication outputs (through to the September to November of 2020, depending on the databases used). Large-scale publication data is available in the PubMed and WoS database, although complete publication records for 2020 will not be available until the early parts of 2021. This caveat should be kept in mind, along with other limitations in using publication outputs to assess research performance, differences in content between PubMed and the WoS, and variations by fields and countries in approaches to publishing in sources that are recorded in these two publication databases.

The analysis finds a massive absolute increase in PubMed and Web of Science papers directly focused on COVID-19 topics, especially in medical, biological science, and public health fields, although this is still a relatively small proportion of publication outputs across all fields of science. Using Web of Science publication data, the paper examined the extent to which researchers across all fields of science have pivoted their research outputs in 2020 to focus on topics related to COVID-19. Significant variations are found by specific fields (identified by Web of Science Subject Categories). In a top quintile of fields – not only in medical specialties, biomedical sciences, and public health but also in subjects in social sciences and arts and humanities – there are relatively high to medium research pivots. In lower quintiles, including other subjects in science, social science, and arts and humanities, low to zero COVID-19 research pivoting is identified. It was noted that researchers may have preprints, papers or forthcoming and other COVID-19 research contributions not captured by the WoS analysis.

Appendix

Data table of WOS publications used to calculate 2020 (to October 24) COVID-19 research pivots. See next pages. Explanation of headings and data sources is at the end of the table.

Data Table for COVID-19 Research Pivot Calculations	Wos	Publicat 2019	ions	Wo	S Publicati 2020*	Research pivot	Quintile	
SUBJECT CATEGORY (SC)	Total	С	cPC	Total	С	cPC	RP	
VIROLOGY	6601	201	3.0%	5703	1073	18.8%	15.8	1
MEDICAL ETHICS	936	0	0.0%	888	133	15.0%	15.0	1
INFECTIOUS DISEASES	18110	132	0.7%	15310	1559	10.2%	9.5	1
MEDICINE GENERAL INTERNAL	49975	17	0.0%	40534	2842	7.0%	7.0	1
OTORHINOLARYNGOLOGY	7592	0	0.0%	7036	453	6.4%	6.4	1
PUBLIC ADMINISTRATION	3891	1	0.0%	3819	240	6.3%	6.3	1
CRITICAL CARE MEDICINE	5819	2	0.0%	4878	274	5.6%	5.6	1
PUBLIC ENVIRONMENTAL OCCUPATIONAL HEALTH	44853	80	0.2%	39714	2171	5.5%	5.3	1
EMERGENCY MEDICINE	4839	2	0.0%	4165	221	5.3%	5.3	1
HEALTH CARE SCIENCES SERVICES	17454	2	0.0%	15560	803	5.2%	5.1	1
ANESTHESIOLOGY	6213	0	0.0%	5339	269	5.0%	5.0	1
TRANSPLANTATION	4986	3	0.1%	4465	225	5.0%	5.0	1
EDUCATION SCIENTIFIC DISCIPLINES	10114	0	0.0%	6407	312	4.9%	4.9	1
ETHICS	3431	0	0.0%	2974	141	4.7%	4.7	1
DERMATOLOGY	9908	0	0.0%	10322	473	4.6%	4.6	1
GERIATRICS GERONTOLOGY	8633	0	0.0%	8051	362	4.5%	4.5	1
IMMUNOLOGY	27613	77	0.3%	23464	1112	4.7%	4.5	1
PSYCHOLOGY CLINICAL	11327	0	0.0%	10685	476	4.5%	4.5	1
ALLERGY	3230	2	0.1%	2859	129	4.5%	4.5	1
RESPIRATORY SYSTEM	11517	13	0.1%	10112	458	4.5%	4.4	1
TROPICAL MEDICINE	4475	7	0.2%	3434	157	4.6%	4.4	1
HEMATOLOGY	11848	5	0.0%	11254	501	4.5%	4.4	1
SOCIAL ISSUES	3174	0	0.0%	2700	116	4.3%	4.3	1
GERONTOLOGY	4848	0	0.0%	4354	186	4.3%	4.3	1
PSYCHIATRY	25184	1	0.0%	23241	984	4.2%	4.2	1
PRIMARY HEALTH CARE	1885	0	0.0%	1577	66	4.2%	4.2	1
HEALTH POLICY SERVICES	9055	4	0.0%	8491	357	4.2%	4.2	1
PERIPHERAL VASCULAR DISEASE	10671	0	0.0%	9530	387	4.1%	4.1	1
SOCIAL SCIENCES BIOMEDICAL	4284	0	0.0%	4070	160	3.9%	3.9	1
CARDIAC CARDIOVASCULAR SYSTEMS	24285	1	0.0%	22664	888	3.9%	3.9	1
MEDICAL INFORMATICS	7624	1	0.0%	5395	208	3.9%	3.8	1
FOLKLORE	277	0	0.0%	183	7	3.8%	3.8	1
LAW	11662	0	0.0%	7288	277	3.8%	3.8	1
MEDICAL LABORATORY TECHNOLOGY	3774	3	0.1%	3116	119	3.8%	3.7	1
PEDIATRICS	21278	11	0.1%	20081	761	3.8%	3.7	1
SOCIAL WORK	4894	0	0.0%	4646	150	3.2%	3.2	1
MICROBIOLOGY	26636	95	0.4%	22645	805	3.6%	3.2	1
RADIOLOGY NUCLEAR MEDICINE MEDICAL IMAGING	28828	1	0.0%	23277	729	3.1%	3.1	1
WOMEN'S STUDIES	3015	0	0.0%	2532	78	3.1%	3.1	1
GEOGRAPHY	8710	0	0.0%	7040	210	3.0%	3.0	1

Data Table for COVID-19 Research Pivot Calculations	WoS	Publicat 2019	ions	Wo	S Publicatio 2020*	ns	Research pivot	Quintile
SUBJECT CATEGORY (SC)	Total	С	cPC	Total	С	cPC	RP	
COMMUNICATION	9045	3	0.0%	7089	210	3.0%	2.9	1
DENTISTRY ORAL SURGERY MEDICINE	13330	0	0.0%	11308	327	2.9%	2.9	1
MEDICINE RESEARCH EXPERIMENTAL	36295	24	0.1%	31110	917	2.9%	2.9	1
OBSTETRICS GYNECOLOGY	16098	0	0.0%	14578	420	2.9%	2.9	1
HOSPITALITY LEISURE SPORT TOURISM	7611	0	0.0%	7073	202	2.9%	2.9	1
GASTROENTEROLOGY HEPATOLOGY	14830	1	0.0%	13666	384	2.8%	2.8	1
UROLOGY NEPHROLOGY	13074	0	0.0%	11810	328	2.8%	2.8	1
RHEUMATOLOGY	5906	1	0.0%	5231	146	2.8%	2.8	1
MATHEMATICAL COMPUTATIONAL BIOLOGY	10710	11	0.1%	7301	210	2.9%	2.8	1
SURGERY	46029	1	0.0%	42330	1167	2.8%	2.8	1
INFORMATION SCIENCE LIBRARY SCIENCE	8138	0	0.0%	5856	161	2.7%	2.7	1
PARASITOLOGY	6139	10	0.2%	5364	151	2.8%	2.7	2
CLINICAL NEUROLOGY	35934	0	0.0%	31697	836	2.6%	2.6	2
AGRICULTURAL ECONOMICS POLICY	2087	0	0.0%	1385	36	2.6%	2.6	2
PSYCHOLOGY PSYCHOANALYSIS	828	0	0.0%	618	16	2.6%	2.6	2
AREA STUDIES	5275	0	0.0%	4208	108	2.6%	2.6	2
OPHTHALMOLOGY	11695	1	0.0%	10565	270	2.6%	2.5	2
BIOPHYSICS	13335	11	0.1%	11694	302	2.6%	2.5	2
PHARMACOLOGY PHARMACY	54358	20	0.0%	46974	1150	2.4%	2.4	2
SOCIOLOGY	9674	0	0.0%	8186	194	2.4%	2.4	2
NURSING	13545	1	0.0%	11814	267	2.3%	2.3	2
ANTHROPOLOGY	5059	0	0.0%	3836	86	2.2%	2.2	2
INTEGRATIVE COMPLEMENTARY MEDICINE	4680	0	0.0%	4021	89	2.2%	2.2	2
ENDOCRINOLOGY METABOLISM	21829	0	0.0%	19452	427	2.2%	2.2	2
PSYCHOLOGY SOCIAL	5182	1	0.0%	4553	96	2.1%	2.1	2
MEDICINE LEGAL	2610	0	0.0%	2074	43	2.1%	2.1	2
POLITICAL SCIENCE	12328	1	0.0%	10550	216	2.0%	2.0	2
INTERNATIONAL RELATIONS	6677	0	0.0%	5211	106	2.0%	2.0	2
CULTURAL STUDIES	2412	0	0.0%	1927	38	2.0%	2.0	2
SUBSTANCE ABUSE	5302	0	0.0%	4566	88	1.9%	1.9	2
CELL TISSUE ENGINEERING	3459	0	0.0%	2759	53	1.9%	1.9	2
SOCIAL SCIENCES INTERDISCIPLINARY	15437	1	0.0%	11171	212	1.9%	1.9	2
CELL BIOLOGY	35833	19	0.1%	30911	580	1.9%	1.8	2
NEUROIMAGING	4020	0	0.0%	2808	51	1.8%	1.8	2
REPRODUCTIVE BIOLOGY	4672	0	0.0%	3842	69	1.8%	1.8	2
ANDROLOGY	818	0	0.0%	1007	18	1.8%	1.8	2
PSYCHOLOGY MULTIDISCIPLINARY	14271	0	0.0%	12331	218	1.8%	1.8	2
ORTHOPEDICS	16752	0	0.0%	15059	253	1.7%	1.7	2
BIOLOGY	18050	15	0.1%	13688	241	1.8%	1.7	2
PSYCHOLOGY BIOLOGICAL	1981	0	0.0%	1637	27	1.6%	1.6	2

Data Table for COVID-19 Research Pivot Calculations	WoS	Publicat 2019	tions	Wos	S Publicatio 2020*	ns	Research pivot	Quintile
SUBJECT CATEGORY (SC)	Total	С	cPC	Total	С	cPC	RP	
ONCOLOGY	53955	5	0.0%	48131	779	1.6%	1.6	2
URBAN STUDIES	5788	0	0.0%	4246	68	1.6%	1.6	2
MANAGEMENT	25339	1	0.0%	18229	291	1.6%	1.6	2
DANCE	345	0	0.0%	190	3	1.6%	1.6	2
RELIGION	8768	0	0.0%	5454	83	1.5%	1.5	2
PATHOLOGY	9145	5	0.1%	8159	124	1.5%	1.5	2
DEVELOPMENT STUDIES	4451	0	0.0%	3030	44	1.5%	1.5	2
ENVIRONMENTAL STUDIES	20934	0	0.0%	17470	246	1.4%	1.4	2
ECONOMICS	35537	1	0.0%	25325	350	1.4%	1.4	2
BIOCHEMISTRY MOLECULAR BIOLOGY	69885	53	0.1%	60269	876	1.5%	1.4	2
NEUROSCIENCES	44989	1	0.0%	37582	507	1.3%	1.3	2
HISTORY PHILOSOPHY OF SCIENCE	3407	0	0.0%	3197	43	1.3%	1.3	2
MULTIDISCIPLINARY SCIENCES	75344	48	0.1%	57678	795	1.4%	1.3	2
PSYCHOLOGY	8471	0	0.0%	6786	88	1.3%	1.3	2
BUSINESS	18197	0	0.0%	13820	179	1.3%	1.3	2
PSYCHOLOGY APPLIED	5951	0	0.0%	5520	71	1.3%	1.3	2
BUSINESS FINANCE	10446	0	0.0%	8385	106	1.3%	1.3	2
NUTRITION DIETETICS	17404	2	0.0%	14634	186	1.3%	1.3	2
PHYSIOLOGY	13911	2	0.0%	9969	126	1.3%	1.2	2
REHABILITATION	12005	0	0.0%	10231	125	1.2%	1.2	2
EDUCATION EDUCATIONAL RESEARCH	44277	1	0.0%	29614	361	1.2%	1.2	2
ENVIRONMENTAL SCIENCES	89252	14	0.0%	80916	946	1.2%	1.2	2
CHEMISTRY MEDICINAL	19162	17	0.1%	14005	167	1.2%	1.1	3
SOCIAL SCIENCES MATHEMATICAL METHODS	3262	1	0.0%	2856	31	1.1%	1.1	3
SPORT SCIENCES	13238	1	0.0%	10636	112	1.1%	1.0	3
ACOUSTICS	8572	0	0.0%	5239	54	1.0%	1.0	3
CRIMINOLOGY PENOLOGY	5031	0	0.0%	4875	47	1.0%	1.0	3
BIOTECHNOLOGY APPLIED MICROBIOLOGY	31936	33	0.1%	26572	259	1.0%	0.9	3
PHYSICS MATHEMATICAL	11151	0	0.0%	9372	78	0.8%	0.8	3
GREEN SUSTAINABLE SCIENCE TECHNOLOGY	28992	0	0.0%	22815	189	0.8%	0.8	3
THEATER	1167	0	0.0%	607	5	0.8%	0.8	3
MATHEMATICS INTERDISCIPLINARY APPLICATIONS	14524	2	0.0%	13276	105	0.8%	0.8	3
ENGINEERING BIOMEDICAL	22982	1	0.0%	13867	108	0.8%	0.8	3
EDUCATION SPECIAL	2278	0	0.0%	2230	17	0.8%	0.8	3
FAMILY STUDIES	4580	0	0.0%	4862	37	0.8%	0.8	3
HUMANITIES MULTIDISCIPLINARY	11664	0	0.0%	6647	50	0.8%	0.8	3
TOXICOLOGY	13244	0	0.0%	10786	81	0.8%	0.8	3
DEMOGRAPHY	1991	0	0.0%	1631	12	0.7%	0.7	3
DEVELOPMENTAL BIOLOGY	3944	2	0.1%	3636	28	0.8%	0.7	3
INDUSTRIAL RELATIONS LABOR	1928	0	0.0%	1594	11	0.7%	0.7	3

Data Table for COVID-19 Research Pivot Calculations	WoS	Publicat 2019	tions	WoS Publications 2020*			Research pivot	Quintile
SUBJECT CATEGORY (SC)	Total	С	сРС	Total	С	cPC	RP	
MYCOLOGY	2034	0	0.0%	1482	10	0.7%	0.7	3
BIOCHEMICAL RESEARCH METHODS	16266	16	0.1%	12180	93	0.8%	0.7	3
VETERINARY SCIENCES	18478	116	0.6%	14599	188	1.3%	0.7	3
ERGONOMICS	2664	0	0.0%	2038	13	0.6%	0.6	3
COMPUTER SCIENCE INTERDISCIPLINARY APPLICATIONS	36522	2	0.0%	19824	127	0.6%	0.6	3
CHEMISTRY MULTIDISCIPLINARY	90858	11	0.0%	76817	495	0.6%	0.6	3
REGIONAL URBAN PLANNING	5281	0	0.0%	3710	23	0.6%	0.6	3
GENETICS HEREDITY	25647	12	0.0%	20531	134	0.7%	0.6	3
ASIAN STUDIES	1844	0	0.0%	1201	7	0.6%	0.6	3
PHYSICS MULTIDISCIPLINARY	28878	0	0.0%	19976	112	0.6%	0.6	3
ENGINEERING INDUSTRIAL	13928	0	0.0%	7761	43	0.6%	0.6	3
ETHNIC STUDIES	1950	0	0.0%	1647	9	0.5%	0.5	3
PSYCHOLOGY EDUCATIONAL	5430	0	0.0%	3502	18	0.5%	0.5	3
AUDIOLOGY SPEECH LANGUAGE PATHOLOGY	3468	0	0.0%	2729	14	0.5%	0.5	3
LITERARY REVIEWS	1864	0	0.0%	780	4	0.5%	0.5	3
COMPUTER SCIENCE INFORMATION SYSTEMS	66556	1	0.0%	36069	185	0.5%	0.5	3
EVOLUTIONARY BIOLOGY	6936	1	0.0%	5523	29	0.5%	0.5	3
LINGUISTICS	10584	0	0.0%	7142	36	0.5%	0.5	3
TRANSPORTATION	5473	0	0.0%	4247	21	0.5%	0.5	3
PSYCHOLOGY DEVELOPMENTAL	7648	0	0.0%	7221	35	0.5%	0.5	3
OPERATIONS RESEARCH MANAGEMENT SCIENCE	15663	0	0.0%	11419	55	0.5%	0.5	3
ARCHITECTURE	5248	0	0.0%	1946	9	0.5%	0.5	3
PHYSICS FLUIDS PLASMAS	11306	0	0.0%	8132	37	0.5%	0.5	3
LANGUAGE LINGUISTICS	9699	0	0.0%	5645	25	0.4%	0.4	3
PSYCHOLOGY EXPERIMENTAL	8675	0	0.0%	7494	32	0.4%	0.4	3
LITERATURE GERMAN DUTCH SCANDINAVIAN	509	0	0.0%	260	1	0.4%	0.4	3
HISTORY OF SOCIAL SCIENCES	1442	0	0.0%	1303	5	0.4%	0.4	3
REMOTE SENSING	15039	0	0.0%	8046	29	0.4%	0.4	3
ANATOMY MORPHOLOGY	2923	1	0.0%	2588	10	0.4%	0.4	3
STATISTICS PROBABILITY	14043	2	0.0%	11952	41	0.3%	0.3	3
BEHAVIORAL SCIENCES	7859	0	0.0%	5851	19	0.3%	0.3	3
CHEMISTRY ANALYTICAL	31466	4	0.0%	27607	88	0.3%	0.3	3
FOOD SCIENCE TECHNOLOGY	32788	1	0.0%	27999	85	0.3%	0.3	4
MATHEMATICS APPLIED	35159	2	0.0%	27917	85	0.3%	0.3	4
PHILOSOPHY	9808	0	0.0%	7447	22	0.3%	0.3	4
COMPUTER SCIENCE CYBERNETICS	8143	0	0.0%	2742	8	0.3%	0.3	4
ENGINEERING ENVIRONMENTAL	24842	3	0.0%	23686	71	0.3%	0.3	4
TELECOMMUNICATIONS	63215	0	0.0%	33197	95	0.3%	0.3	4
MECHANICS	31296	0	0.0%	24185	68	0.3%	0.3	4
NANOSCIENCE NANOTECHNOLOGY	50244	7	0.0%	41176	114	0.3%	0.3	4

Data Table for COVID-19 Research Pivot Calculations	WoS	Publicat 2019	ions	WoS Publications 2020*			Research pivot	Quintile
SUBJECT CATEGORY (SC)	Total	С	cPC	Total	С	cPC	RP	
IMAGING SCIENCE PHOTOGRAPHIC TECHNOLOGY	12649	0	0.0%	5634	14	0.2%	0.2	4
ENGINEERING MULTIDISCIPLINARY	36437	1	0.0%	24927	61	0.2%	0.2	4
HISTORY	13600	0	0.0%	7902	19	0.2%	0.2	4
METEOROLOGY ATMOSPHERIC SCIENCES	16400	1	0.0%	13152	32	0.2%	0.2	4
ECOLOGY	23757	8	0.0%	18813	47	0.2%	0.2	4
COMPUTER SCIENCE ARTIFICIAL INTELLIGENCE	54052	2	0.0%	25793	56	0.2%	0.2	4
INSTRUMENTS INSTRUMENTATION	27165	0	0.0%	21826	43	0.2%	0.2	4
COMPUTER SCIENCE THEORY METHODS	67670	0	0.0%	17398	33	0.2%	0.2	4
CHEMISTRY APPLIED	21585	0	0.0%	19057	35	0.2%	0.2	4
MATERIALS SCIENCE BIOMATERIALS	10127	0	0.0%	8276	15	0.2%	0.2	4
LITERATURE	5158	0	0.0%	2769	5	0.2%	0.2	4
ART	4206	0	0.0%	1673	3	0.2%	0.2	4
CONSTRUCTION BUILDING TECHNOLOGY	17305	2	0.0%	13214	25	0.2%	0.2	4
GEOGRAPHY PHYSICAL	8189	0	0.0%	6802	12	0.2%	0.2	4
AGRICULTURE DAIRY ANIMAL SCIENCE	11033	8	0.1%	8541	21	0.2%	0.2	4
PHYSICS ATOMIC MOLECULAR CHEMICAL	17788	0	0.0%	14951	25	0.2%	0.2	4
WATER RESOURCES	20686	1	0.0%	16952	29	0.2%	0.2	4
AGRICULTURE MULTIDISCIPLINARY	10509	0	0.0%	7831	13	0.2%	0.2	4
ENGINEERING MECHANICAL	45063	0	0.0%	25409	41	0.2%	0.2	4
ENGINEERING ELECTRICAL ELECTRONIC	179052	1	0.0%	84907	137	0.2%	0.2	4
BIODIVERSITY CONSERVATION	7560	3	0.0%	6635	13	0.2%	0.2	4
ELECTROCHEMISTRY	17063	0	0.0%	12771	19	0.1%	0.1	4
MUSIC	2405	0	0.0%	1351	2	0.1%	0.1	4
LITERARY THEORY CRITICISM	1604	0	0.0%	711	1	0.1%	0.1	4
MATERIALS SCIENCE PAPER WOOD	2696	0	0.0%	2142	3	0.1%	0.1	4
COMPUTER SCIENCE HARDWARE ARCHITECTURE	17012	0	0.0%	5737	8	0.1%	0.1	4
MATHEMATICS	38372	3	0.0%	31754	46	0.1%	0.1	4
MATERIALS SCIENCE MULTIDISCIPLINARY	152759	4	0.0%	121138	166	0.1%	0.1	4
ARCHAEOLOGY	4858	0	0.0%	3061	4	0.1%	0.1	4
CRYSTALLOGRAPHY	7246	2	0.0%	5701	9	0.2%	0.1	4
NUCLEAR SCIENCE TECHNOLOGY	10893	0	0.0%	8798	11	0.1%	0.1	4
PHYSICS APPLIED	86080	4	0.0%	64216	82	0.1%	0.1	4
ORNITHOLOGY	1212	0	0.0%	818	1	0.1%	0.1	4
ENGINEERING CIVIL	32820	0	0.0%	24698	30	0.1%	0.1	4
CHEMISTRY PHYSICAL	77776	3	0.0%	66328	80	0.1%	0.1	4
FILM RADIO TELEVISION	1624	0	0.0%	894	1	0.1%	0.1	4
GEOSCIENCES MULTIDISCIPLINARY	33313	1	0.0%	26982	30	0.1%	0.1	4
CHEMISTRY ORGANIC	19781	4	0.0%	14842	18	0.1%	0.1	4
TRANSPORTATION SCIENCE TECHNOLOGY	10829	0	0.0%	6047	6	0.1%	0.1	4
OPTICS	50694	0	0.0%	28257	26	0.1%	0.1	4

Data Table for COVID-19 Research Pivot Calculations	WoS	Publicat 2019	ions	WoS Publications 2020*			Research pivot	Quintile
SUBJECT CATEGORY (SC)	Total	С	cPC	Total	С	cPC	RP	
ENGINEERING CHEMICAL	47957	1	0.0%	40535	36	0.1%	0.1	4
ZOOLOGY	13607	5	0.0%	10558	13	0.1%	0.1	4
COMPUTER SCIENCE SOFTWARE ENGINEERING	23554	0	0.0%	10967	9	0.1%	0.1	4
MARINE FRESHWATER BIOLOGY	13665	0	0.0%	10975	9	0.1%	0.1	5
MINING MINERAL PROCESSING	5779	0	0.0%	3682	3	0.1%	0.1	5
SPECTROSCOPY	7539	0	0.0%	6175	5	0.1%	0.1	5
ENERGY FUELS	64777	0	0.0%	44850	36	0.1%	0.1	5
AGRONOMY	14009	0	0.0%	11445	9	0.1%	0.1	5
POLYMER SCIENCE	26079	0	0.0%	23082	18	0.1%	0.1	5
MICROSCOPY	1632	0	0.0%	1288	1	0.1%	0.1	5
ENGINEERING MANUFACTURING	16256	0	0.0%	8539	6	0.1%	0.1	5
ROBOTICS	11835	0	0.0%	4466	3	0.1%	0.1	5
PLANT SCIENCES	29671	1	0.0%	25771	17	0.1%	0.1	5
MATERIALS SCIENCE COATINGS FILMS	10572	0	0.0%	8627	5	0.1%	0.1	5
SOIL SCIENCE	6056	0	0.0%	5315	3	0.1%	0.1	5
MATERIALS SCIENCE TEXTILES	4576	0	0.0%	3834	2	0.1%	0.1	5
LIMNOLOGY	2301	0	0.0%	1969	1	0.1%	0.1	5
PHYSICS CONDENSED MATTER	36827	2	0.0%	30867	15	0.0%	0.0	5
ENTOMOLOGY	8165	0	0.0%	7028	3	0.0%	0.0	5
QUANTUM SCIENCE TECHNOLOGY	3069	0	0.0%	2596	1	0.0%	0.0	5
ENGINEERING PETROLEUM	4171	0	0.0%	2599	1	0.0%	0.0	5
FORESTRY	8031	0	0.0%	5889	2	0.0%	0.0	5
THERMODYNAMICS	20910	0	0.0%	15189	5	0.0%	0.0	5
AUTOMATION CONTROL SYSTEMS	28069	0	0.0%	13134	4	0.0%	0.0	5
HORTICULTURE	4716	0	0.0%	3405	1	0.0%	0.0	5
MINERALOGY	4482	0	0.0%	3541	1	0.0%	0.0	5
CHEMISTRY INORGANIC NUCLEAR	13862	0	0.0%	11231	3	0.0%	0.0	5
ENGINEERING AEROSPACE	8615	0	0.0%	4464	1	0.0%	0.0	5
GEOCHEMISTRY GEOPHYSICS	12757	0	0.0%	9240	2	0.0%	0.0	5
METALLURGY METALLURGICAL ENGINEERING	23790	0	0.0%	19462	4	0.0%	0.0	5
ASTRONOMY ASTROPHYSICS	24349	0	0.0%	17333	2	0.0%	0.0	5
PHYSICS PARTICLES FIELDS	14700	0	0.0%	10827	1	0.0%	0.0	5
PSYCHOLOGY MATHEMATICAL	865	0	0.0%	795	0	0.0%	0.0	5
AGRICULTURAL ENGINEERING	4691	0	0.0%	3698	0	0.0%	0.0	5
POETRY	207	0	0.0%	83	0	0.0%	0.0	5
MATERIALS SCIENCE CERAMICS	7862	0	0.0%	6908	0	0.0%	0.0	5
MATERIALS SCIENCE CHARACTERIZATION TESTING	4993	0	0.0%	3920	0	0.0%	0.0	5
LITERATURE AFRICAN AUSTRALIAN CANADIAN	189	0	0.0%	67	0	0.0%	0.0	5
LITERATURE AMERICAN	437	0	0.0%	204	0	0.0%	0.0	5
LITERATURE BRITISH ISLES	395	0	0.0%	243	0	0.0%	0.0	5

Data Table for COVID-19 Research Pivot Calculations	WoS	WoS Publications 2019			S Publication 2020*	Research pivot	Quintile	
SUBJECT CATEGORY (SC)	Total	С	cPC	Total	с	cPC	RP	
MATERIALS SCIENCE COMPOSITES	8004	0	0.0%	5456	0	0.0%	0.0	5
FISHERIES	7923	0	0.0%	6644	0	0.0%	0.0	5
LITERATURE ROMANCE	2710	0	0.0%	1287	0	0.0%	0.0	5
LITERATURE SLAVIC	584	0	0.0%	257	0	0.0%	0.0	5
LOGIC	1233	0	0.0%	765	0	0.0%	0.0	5
GEOLOGY	4884	0	0.0%	2717	0	0.0%	0.0	5
ENGINEERING MARINE	3152	0	0.0%	1953	0	0.0%	0.0	5
ENGINEERING OCEAN	3268	0	0.0%	2189	0	0.0%	0.0	5
ENGINEERING GEOLOGICAL	8348	0	0.0%	7457	0	0.0%	0.0	5
CLASSICS	1202	0	0.0%	450	0	0.0%	0.0	5
MEDIEVAL RENAISSANCE STUDIES	1600	0	0.0%	684	0	0.0%	0.0	5
PALEONTOLOGY	3393	0	0.0%	2465	0	0.0%	0.0	5
OCEANOGRAPHY	9374	0	0.0%	6712	0	0.0%	0.0	5
PHYSICS NUCLEAR	7365	0	0.0%	4656	0	0.0%	0.0	5
TOTAL RECORDS	2567047	828		1952201	30143			

Source: Analysis of records in the Web of Science (WoS) Indexes=SCI-EXPANDED, SSCI, A&HCI, CPCI-S, CPCI-SSH, ESCI) refined by document types (article, early access, review or proceedings paper). Search Technology-Georgia Tech COVID-19 bibliometric definition (see text). *WoS records published in 2020, as of October 24, 2020.

Note: SC = WoS subject category (N=254); c = Coronavirus COVID-19 records; <math>cPC = c as percentage of SC total; RP = COVID-19 research pivot (points) = % COVID-19 publications in SC for 2020* less % COVID-19 publications in SC for 2019. Sums of SC publication records exceed totals as publication records in WoS journals can be allocated more than one SC classification.