

COVID-19 and Online Learning Tools

Priyanga Dilini Talagala, Thiyanga S. Talagala

December 2021

Working Paper 1

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Priyanga Dilini Talagala

Department of Computational Mathematics, University of Moratuwa, Sri Lanka

Email: priyangad@uom.lk

Corresponding author

Thiyanga S. Talagala

Department of Statistics, Faculty of Applied Sciences, University of Sri Jayewardenepura, Sri Lanka

Email: ttalagala@sjp.ac.lk

27 December 2021

JEL classification: C82,I20,I21

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Abstract

Distance education has a long history. However, COVID-19 has made a new era of distance education. Due to the increasing demand, various distance learning solutions have been introduced for different distance education purposes. In this study, we investigated the impact of COVID-19 on global attention towards different distance learning-teaching tools. We used Google Trend search queries as a proxy to quantify the popularity and public interest towards different distance education solutions. Both visual and analytical approaches were used to analyse global level web search queries during the COVID-19 pandemic. This can provide a fast first step guide to identifying the most popular online learning tools available for different educational purposes. The results allow the teachers to narrow down the search space and deepen their exploration on prominent distance education solutions to support their online teaching. The R code and data to reproduce the results of this work are available in the online supplementary materials.

Keywords: Online learning, Online teaching Distance education solutions, COVID-19 Pandemic, Google Trend search queries

1 Introduction

COVID-19 is still one of the most important priorities of governments and media in many countries all around the world. Due to the alarming levels of spread and severity of the virus, the World Health Organization (WHO) declared the outbreak a Public Health Emergency of International Concern (PHEIC) on January 30, 2020, and then a pandemic on March 11, 2020 (World Health Organization 2020). As of September 29, 2021, more than 232.7 million cases of COVID-19 have been reported in over 192 countries and territories, resulting in more than 4.7 million deaths (Dong, Du & Gardner 2020). In response to the pandemic, health authorities worldwide have taken many steps, including vaccination development and deployment to minimize the spread of the virus. In addition, authorities worldwide have also taken many non-pharmaceutical interventions and preventive measures such as travel restrictions, lock-downs,

workplace hazard controls, school/university closures, facility closures, and reduction of mass gatherings to reduce the spread of the virus (Chang et al. 2020).

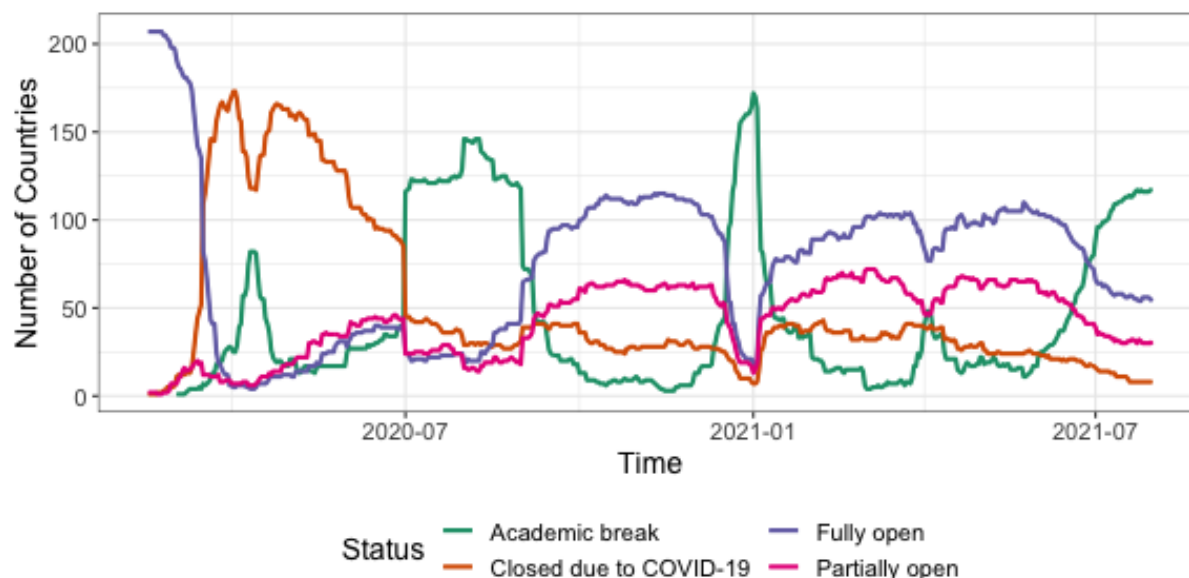


Figure 1: Global tracking of COVID-19 caused school closures and re-openings

Many sectors have been affected ever since the outbreak of COVID-19, worldwide. Among these many sectors, education is one of the most affected sectors with a near-total closure of schools, colleges, and universities all around the world (Daniel 2020). Figures 1 show the evolution of global school closures and reopenings since mid February 2020 (UNESCO 2020b). With the start of the pandemic, a near total closure of schools was observed all around the world. Over time, Africa and Oceania demonstrated better recovery in comparison to other regions with their increasing number of fully open schools in which the classes are held exclusively in person (Figures 2).

Even though distance education has a long history that goes back almost two centuries with significant modifications, alterations, and additions in the process of delivery and communication (Moore, Dickson-Deane & Galyen 2011; Spector et al. 2014), COVID-19 certainly created a new era of distance education while encouraging various stakeholders in education to take the concept of distance education seriously (Richmond et al. 2020). Sudden unexpected movement from classrooms to home schooling at large scale made students, teachers and parents vulnerable, leading to millions of education related internet searches being performed during the period of COVID-19 pandemic (Figures 3) (Carter Andrews, Richmond & Marciano 2021). Surprisingly, the search spikes of distance education related searches (Figure 3 (c)) coincide with increasing COVID-19 counts (Figure 3 (a)) and related internet searches (Figure 3 (b)), even though distance education has a long history in contrast to the COVID-19 pandemic.

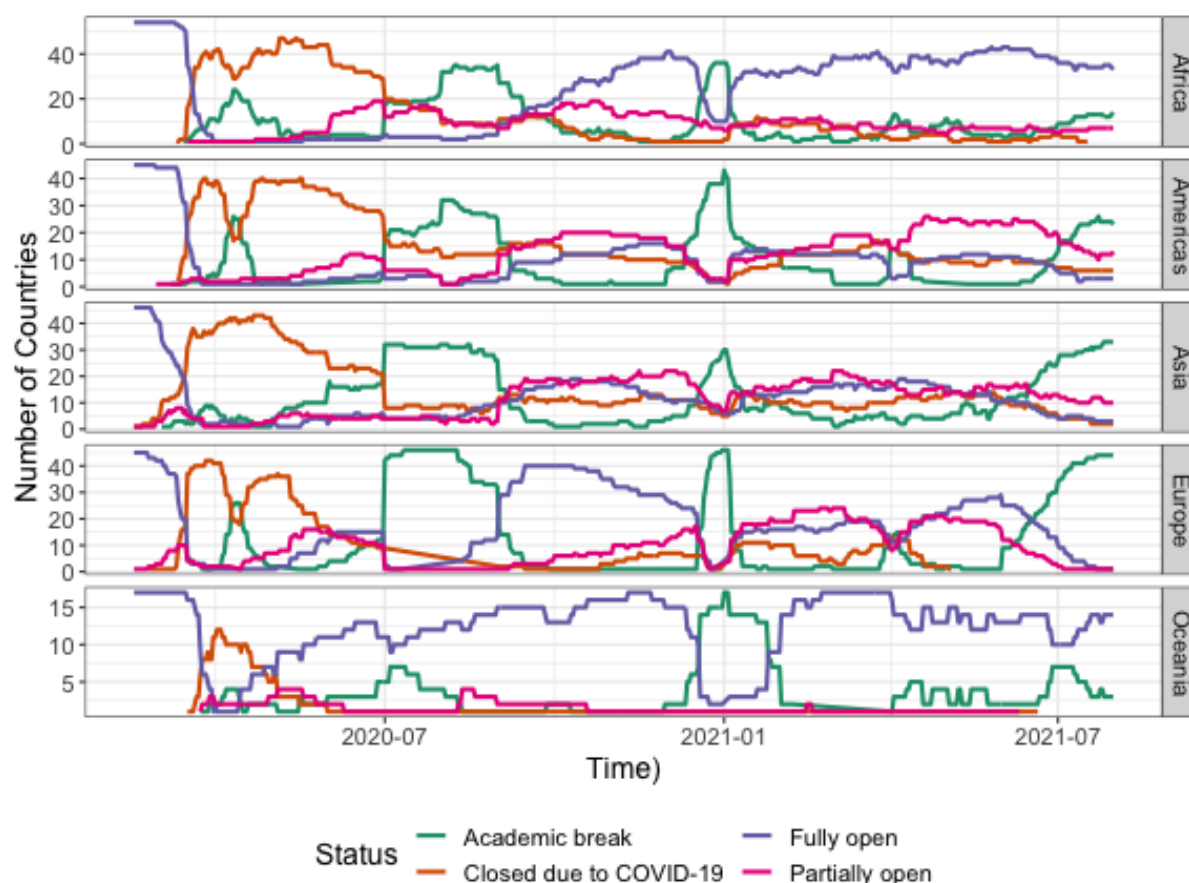


Figure 2: Region wise tracking of COVID-19 caused school closures and re-openings

The speed of the physical classroom closures and the rapid move to online delivery of education allowed little time for planning or reflection on potential risks that could happen to its various stakeholders, such as teachers, students, and parents. Teachers were not fully aware of their obligations and how to connect with students to support their learning. Lack of preparation, lack of tools and techniques for distance education, lack of awareness of the availability of the existing tools and techniques and their effectiveness, lack of interaction and communication with the students, and lack of awareness of students' ongoing problems were some of the major issues they encountered during the COVID-19 pandemic. Students on the other hand who tend to have fewer educational opportunities beyond schools and universities are severely affected by this sudden and unexpected movement. Further, the impact was not limited to students' learning but also to other aspects of their lives, such as student debt, digital exclusion, lack of technology, lack of access to internet-enabled devices or a stable internet connection, long-term educational disengagement, poor nutrition and food insecurity, increased psychological challenges, childcare problems, exploitation, school dropouts and lack of disability services (Drane, Vernon & O'Shea 2020; Daniel 2020; UNESCO 2020a; Richmond et al. 2020; Carter Andrews, Richmond & Marciano 2021). This also put an extra burden on parents, especially those

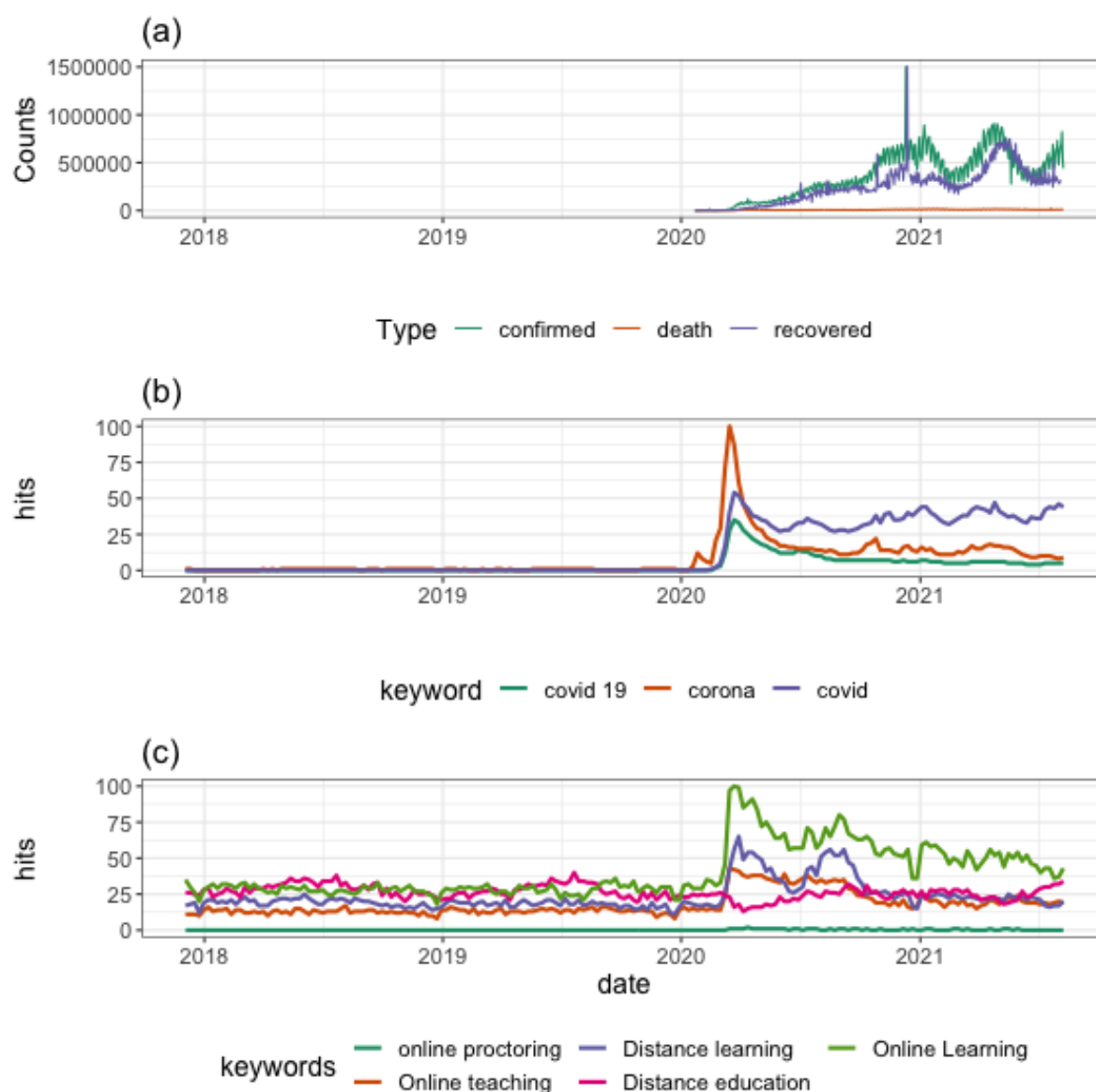


Figure 3: Visualization of data from Google search trends. (a) COVID-19 cases worldwide (b) Google search trends of COVID-19 related terms (c) Google search trends of distance education related terms.

with limited education and resources, as they were expected to facilitate the required learning environment at home. Working parents also find it difficult to work during a school closure due to childcare obligations that result from unexpected school closures. Furthermore, every single step, including planning, developing new tools and techniques, conducting awareness programmes about distance education, and shifting towards distance education, happened online, due to the unexpected massive global shutdown. This situation left the internet as the only medium to support all these educational processes.

According to Carter Andrews, Richmond & Marciano (2021), for educators to continue to teach inclusively, they need support to connect with the students through a variety of strategies so that students feel not only connected to their teachers, but to the subject matter being taught. In response to this gray situation and the urgent requirement for a massive transformation from a physical classroom to a virtual learning environment, UNESCO took immediate and timely action by publishing a long list of distance learning solutions that can be used to facilitate student learning during the period of school closure. There are many different distance learning solutions. Yet very little is known about the uptake of different solutions or about their effectiveness. Further, getting familiar with all these available distance learning solutions is also not feasible or practical due to limited time availability and the need for urgent responses.

Connectivity, flexibility, and the ability to promote varied interactions are some of the critical aspects educators consider when selecting suitable distance education solutions. According to Ahn (2006), the popularity of a product can also greatly influence consumer purchasing decisions as it can indicate the prominence of the product in the market, its usability, and its impact. Further, according to Willis & Tranos (2020), developers also tend to improve their products and services in response to increasing online search. Therefore, the internet represents a great opportunity to learn about the popularity and public attention of a product or service. It is also a way to narrow down the search space and thereby identify the most suitable products and services that meet customer needs.

Google Trends is an open source web analytics tool that allows users to get access to Internet search data that has the ability to provide deep insights into population behavior (Nutti et al. 2014). As there is still a struggle as to what technologies should be used to facilitate student learning, in this study, we test whether the Google Trends search queries can be used as a proxy of the popularity and public interest in different distance education solutions. In line with that, this paper makes three fundamental contributions to distance education by exploring three main questions: (1) What is the impact of the COVID-19 pandemic on education? (2) What solutions are in place to meet the needs of distance education during COVID-19 pandemic? (3) Which distance learning solutions have received wide attention and public interest during the COVID-19 pandemic?

We primarily analyzed quantitative digital footprint data on the internet from December 2019 to August 2021. The resulted Google Trend footprint provides a fast first step guide to identifying the most popular distance education tools available for different educational purposes. It also allows the teachers to narrow down the search space and deepen their exploration on prominent

distance education solutions to support their online teaching. Furthermore, identifying the most popular tools and techniques will allow everyone to focus on those methods and develop a sustainable learning environment by advancing the existing features.

Quality education is essential to sustainable development and it is a key United Nations (UN) sustainable development goal. Having the most appropriate tool is imperative to the successful completion of a task at hand. The findings of this study provide essential initial guidance to selecting the most appropriate tool for different distance education needs. Therefore, the findings of this study directly contribute to the UN's sustainable development goals of quality education.

The remainder of this paper is organized as follows: Section 2 presents the related work to lay the foundation for the Google trend footprint analysis of different distance learning solutions. Section 3 presents the methodology followed in the study. Section 4 includes results and discussion. Section 5 concludes the article and presents future research directions.

2 Background

The term distance education is known by a variety of names such as distance learning, e-Learning, online learning, home study, independent study, external study, correspondence education, off campus study, open learning and open education (Moore, Dickson-Deane & Galyen 2011). Few common features found in all these terms are, they all involve some form knowledge sharing between two parties; learners and educators, different times, different geographical locations and/or varying forms of instructional materials and tools (Moore, Dickson-Deane & Galyen 2011). Further, distance education has different types of interactions such as learner–content interactions, learner–instructor interactions, learner–learner interactions and learner–interface interaction that can facilitate learners to construct knowledge (Wallace 2003). Different tools are required to fulfill all these requirements in a distance learning environment.

Google Trends is a freely accessible website sponsored by Google that analyzes spatio and temporal patterns of search queries in Google Search, across various regions, subject domains and languages (Carneiro & Mylonakis 2009). Therefore, Google trends provide a quantifiable and valuable measure of emerging public concerns and trending topics together with their geographic distribution (Alicino et al. 2015; Cook et al. 2011). According to Jarynowski, Wojta-Kempa & Belik (2020) the public concerns on different matters can also take an epidemic nature starting with the phase of growing interest which is known as “early adoption”, to the phase of

general interest which is known as “majority” to eventually lose popularity which is known as “lagers stage”. Figure 3 (b) and (c) also confirm this life cycle explanation of Google Trend search patterns.

The use of Google Trend search queries has become a popular data source in monitoring and modeling the dynamics of different application domains such as disaster management (Kam, Stowers & Kim 2019), transportation (Willis & Tranos 2020), business (Chumnumpan & Shi 2019) and health care (Nutti et al. 2014; Alicino et al. 2015; Arora, McKee & Stuckler 2019; Carneiro & Mylonakis 2009; Cook et al. 2011) as it has the ability to provide data about social phenomena in a more timely manner than traditional data collection processes (Vaughan & Romero-Frias 2014). According to the study conducted by Willis & Tranos (2020) on taxi preferences found that online queries can provide a proxy of quality of taxi services and thereby provide a means to investigate service quality and public concerns on the service provided. In November, 2008, Google launched an internet-based surveillance tool, Google Flu Trends (GFT), that uses aggregated Google search data to provide a near real-time support in predicting influenza outbreaks (Cook et al. 2011). Several recent studies have also been conducted to investigate the relation between Google search trend patterns and the COVID-19 related concerns (Husnayain, Fuad & Su 2020; Effenberger et al. 2020). The study conducted by Husnayain, Fuad & Su (2020) focuses on search terms related to the coronavirus, handwashing, and face masks to monitor public restlessness toward COVID-19. However, there are only a limited number of research attempts related to education sector using Google Trend search query data (Vaughan & Romero-Frias 2014). The study conducted by Vaughan & Romero-Frias (2014) have used Google Trend search queries to predict academic fame by testing the correlation between search volume data and university ranking data. Kansal et al. (2021) have used a text mining approach to identify emerging patterns of words and phrases during COVID-19 pandemic, keeping education prospects as the focus. However, their study was limited to a small number of learning platforms. According to Moore, Dickson-Deane & Galyen (2011), the design of different types of learning environments can depend on the learning outcomes, target audience, access (physical, virtual and/or both), and/or type of content. Therefore, this study provides a detailed investigation on distance education solutions focusing on different distance learning needs. In contrast to the work in Kansal et al. (2021), the work in our paper has a very specific focus and provides a thorough investigation on different distance learning solutions available for various education purposes.

Eventhough Google Trend search quiries provide massive amount of data, more care should be given when utilizing it as a research tool as it may contain inaccuracies (Carneiro & Mylonakis

2009). According to Nuti et al. (2014), the data retrieval process should be transparent. This will increase the trustworthiness of both the results and the generalizability of the findings. Furthermore, Nuti et al. (2014) believe that researchers should clearly document the rationale and data retrieval process to ensure the reproducibility of results.

3 Methodology

To identify the impact of COVID-19 on education, data on the evolution of school closures and re-openings was obtained from a repository maintained by UNESCO (UNESCO 2020b). Data related to COVID-19 cases was retrieved from the R software (R Core Team 2021) package *coronavirus* (Krispin & Byrnes 2021). The package pulls data from the Johns Hopkins University Center for Systems Science and Engineering (JHU CCSE) data repository (Dong, Du & Gardner 2020).

In this work we also used Google Trend search queries as a measurement proxy to investigate emerging evidence about distance learning and the popularity and the public interest in various distance education solutions. We used weekly Google Trend search queries of various distance learning solutions during COVID-19 pandemic. We limited all of our searches to the period from 1 December 2019 to 15 August 2021 to match the period of COVID-19 pandemic. Through this we wanted to capture the volume of interest in the public realm about distance education solutions and how this changes over time.

Google Trends determines categories based on search patterns. According to Vaughan & Romero-Frias (2014) more relevant accurate data can be obtained by limiting the search in Google Trends to a specific category as it helps to reduce noise in the data. In this work our focus was given to education category. Google Trends does not provide the absolute search volume of a given search term. Instead it provides a relative search volume of a particular term adjusted according to the total searches of the geography and time range it represents. The resulted series scale from 0 to 100, where each data point in the series represents the search interest relative to the highest point on the series for the selected region and time. (Alicino et al. 2015; Vaughan & Romero-Frias 2014). As such, a value of 100 represents the peak popularity of the term.

It is important to decide what term to search for in Google Trends as different terms have different search volumes. In the past literature several strategies have been used to select suitable search terms for a given study. Some studies have selected search terms based on intuition and some through brainstorming processes (Vaughan & Romero-Frias 2014). In this

study our choice of search term took into account the list of distance learning solutions published by UNESCO (UNESCO 2020c). Eventhough, the solutions they had recommended do not carry their explicit endorsement, they tend to have a wide reach, a strong user-base and evidence of impact (UNESCO 2020c). For each keyword, the worldwide search queries were performed with a keyword being used as the “search term”. That allowed us to search the exact string of text typed by the user. However, according to Vaughan & Romero-Frias (2014), short forms or acronyms had higher search volumes than the corresponding complete names, in general. However, we did not use the acronym in this study, as our focus is on specific tools and techniques available in the market to fulfill distance education needs and acronyms could be confused with another entity.

We did our analysis under 11 sub segmentation namely, digital learning management systems, systems built for use on basic mobile phones, systems with strong offline functionality, Massive Open Online Course (MOOC) Platforms, self-directed learning content, mobile reading applications, collaboration platforms that support live-video communication, tools for teachers to create of digital learning content, external repositories of distance learning solutions, tools for online proctoring and Resources to provide psychosocial support. The segmentation was mainly motivated by the list of distance learning solutions published by UNESCO in response to COVID-19 pandemic.

In google trends, it is possible to search for only up to five queries at a time (Vaughan & Romero-Frias 2014). Therefore, under each segmentation we entered up to five distance learning tools at a time and recorded their relative ranking scores. An iterative pairwise comparison was first used to identify the series that has highest search volume during the study period. Through this iterative process of relative comparison, we were able to identify the tool with the highest relative ranking score. Then the relative ranking scores for all the other tools in the given segmentation was obtained relative to the previously detected series with the highest ranking scores (Vaughan & Romero-Frias 2014).

Both visual and analytical approaches were used to analyse the changes in web search queries at the global level to identify the emerging evidence about the impact of COVID-19 pandemic on distance education. We also evaluated the relationship between weekly web searches and the number of weekly global cases of COVID-19. Cross correlation analysis and the dynamic time warping algorithm (Giorgino 2009) were performed to investigate the relationship and similarities between the signatures of COVID-19 related search volume data and distance education related search volume data.

4 Results and Discussion

The visual representation of Google Trend search queries of COVID-19 related terms worldwide shows that the highest peak coincided with the start of the pandemic (Figures 3 (b)). Surprisingly, the search volume index graph for distanced education related terms also shows a similar spike at the start of the pandemic (Figures 3 (c)). This highlights the impact of COVID-19 pandemic on distance education.

According to Moore, Dickson-Deane & Galyen (2011), “distance education” is the most renowned descriptor used when referencing distance learning. However, both Benson et al. (2002) and Conrad (2002) introduced “online learning” as the most “recent version”, “newer version” and “improved version” of distance learning. The Google Trend search patterns corresponds to the term “online learning” confirm the above claim as it is the most searched distance education related term throughout the COVID-19 pandemic (Figures 3 (c)). Despite quantitative differences in terms of relative search volume, the series generated by the two terms “Distance learning” and “online teaching” demonstrate a similar trend during the study period. COVID-19 related web searches declined in the months after the WHO announcement of the COVID-19 pandemic, despite the increase in COVID-19 cases. A similar decline can be observed in distance education related terms (Figures 3). This confirms the life cycle of Google Trend search patterns introduced in Jarynowski, Wojta-Kempa & Belik (2020). Further, a second peak was observed only in education related terms after the WHO announcement of the COVID-19 pandemic. This could be due to the near total closures of schools happened with the declaration of COVID-19 as a pandemic.

A pairwise comparison was performed using Dynamic Time Warping algorithm. Under this approach, two time series are stretched or compressed locally in order to make one resemble the other as much as possible. The distance between the two series is then computed by summing the distances of individual aligned elements (Giorgino 2009). Two pairwise comparisons, “corona” with “online learning” and “covid” with “online learning” were conducted to see the impact of COVID-19 on distance education. Both pairwise comparisons show a significant areas of overlap and a similar dynamic pattern (Figures 4 (a) and 5 (a)). The normalized distance between the two series in the two comparisons are 0.1326197 and 0.1828299, respectively. This also provides further confirmation for the similarity of the Google Trend search profiles. this highlight the sudden public attention towards both aspects, COVID-19 and distance education, eventhough distance education has a long history in contrast to COVID-19.

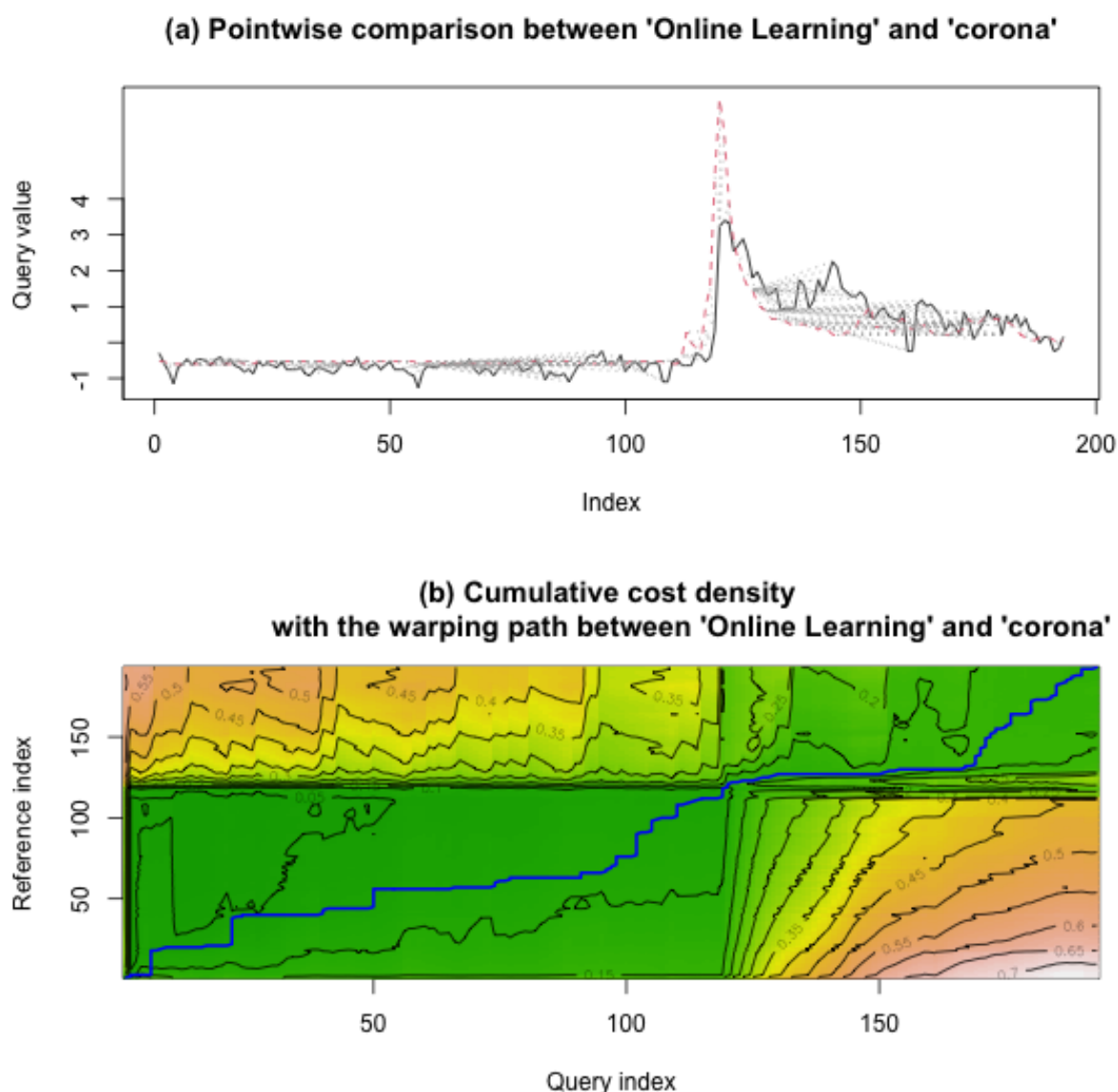


Figure 4: Visualization of Dynamic Time Warping Alignments between 'online learning' and 'corona'

The entirety of the blue warping path flows through green pastures further confirms the similarity between the search patterns related to COVID-19 and distance education (Figures 4 (b) and 5 (b)). The orange volcanic topography that highlights regions of nonalignment of series in question if mapped through this region demonstrate a significant difference in online search behaviours before and after the COVID-19 pandemic (Figures 4 (b) and 5 (b)).

The degree of digression of blue line from the ideal 45-degree straight line indicates a dissimilarity of the two time series (Figures 4 (b) and 5 (b)). In late 2019 the infection was recognized as a virus which is genetically related to the corona virus responsible for the Severe Acute Respiratory Syndrome (SARS) outbreak of 2003 which infected over 8,000 people from different countries that resulted more than 700 deaths worldwide (Ciotti et al. 2019). When the virus was

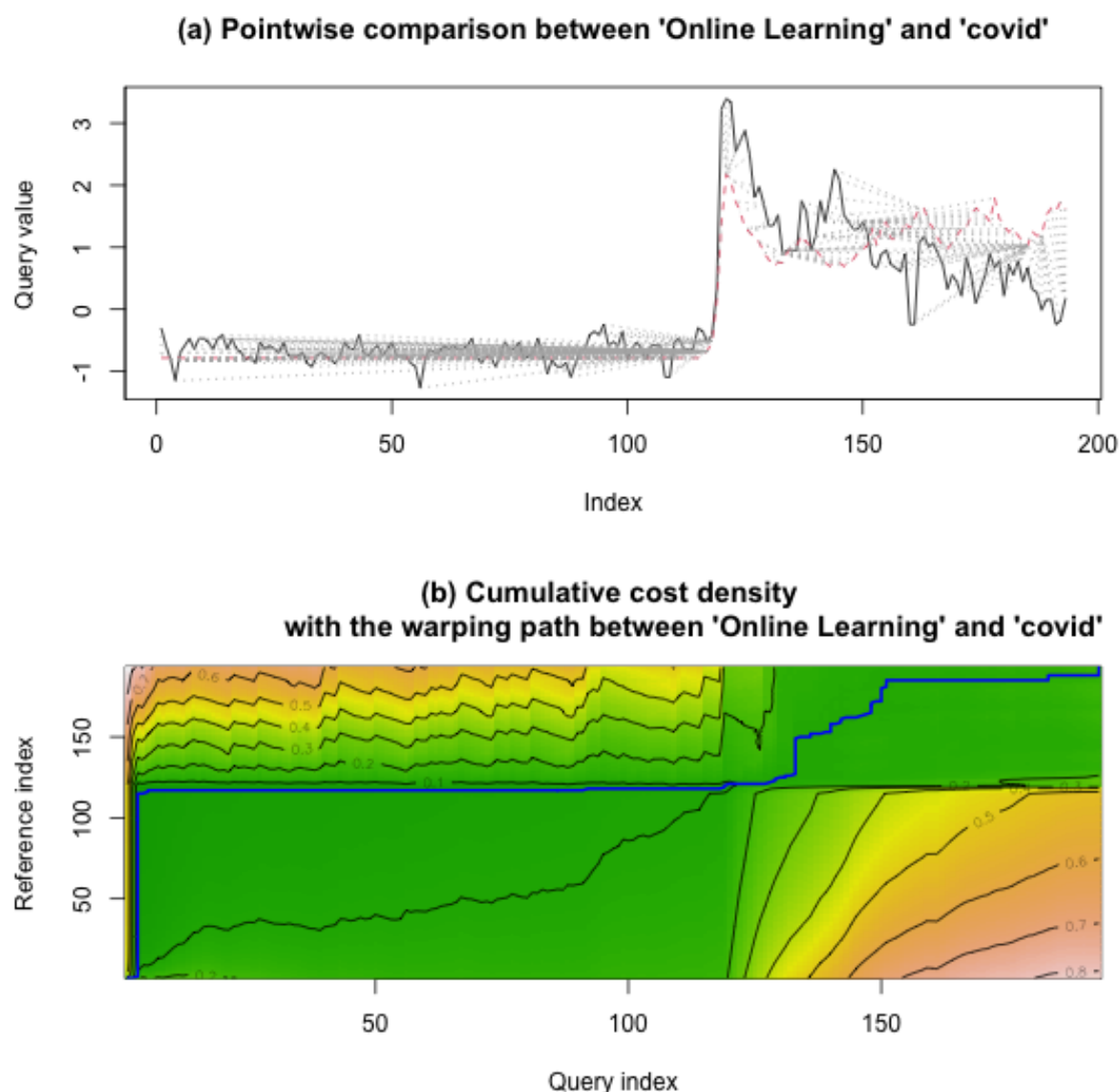


Figure 5: Visualization of Dynamic Time Warping Alignments 'online learning' and 'covid'

know as “corona” it was not a global concern and was mostly limited to China. During that time people did not pay much attention to online learning as conventional classroom learning approach was the most popular teaching learning strategy prior to COVID-19 pandemic. This is evident from the rough flat line from approximately 120 to 170 on the Query Index axis in Figure 4 (b).

Later, with the spread of the virus worldwide, WHO named it as COVID-19 (COrona VIRus Diagnosed in 2019) and then declared it as a pandemic on March 11, 2020. With that, a near total closure of schools were observed all around the world (Figures 1). With this sudden unexpected massive shutdown, online learning also became an equally important global concern, similar to COVID-19 pandemic. This similar behaviour in public attention towards both aspects is

confirmed by the blue line that falls on near 45-degree line from approximately 120 to 150 on the Query Index axis in Figure 5 (b). This also confirms the impact of COVID-19 on distance education and online learning.

Next, a cross correlation analysis was performed to estimate the lag time between COVID-19 related terms and the distance education related terms (Figures 6). A close relationship was evident between COVID-19 related search patterns and the search patterns of the terms “Online learning”, “Distance learning” and “Online teaching”. The significant cross-correlation coefficients at lag zero confirms contemporaneous relationship between the COVID-19 related search terms and distance learning related search terms. The significant cross correlation values at lag one or two also confirms the sudden impact of COVID-19 pandemic on distance education related public concerns (Figures 6 (a) - (c) and (f) - (h)). However, no significant synchronization was observed between the COVID-19 related search trends and the search patterns of “distance education” or “online proctoring” (Figures 6 (d), (i), (e), (j)).

The list of distance education solutions published by UNESCO provides many different distance education solutions for different education purposes. Figure 7 and Figure 8 provide a Google trend footprint that can be used as a proxy for measuring global attention towards different distance learning solutions. This provides a fast first step guide to identify the most popular tools available for different educational purposes. Under each and every panel, one or two tools have got a significantly higher level of attention in comparison to the remaining options available under the same category (Figure 7 (a) - (e) and Figure 8 (f) - (j)). However, the Google Trend series across multiple panels are not comparable as they represent “relative” search volume of given terms. They are comparable only within a given panel. The value 100 is also not comparable across multiple panels and indicates the maximum popularity for the term within each panel.

Under digital learning management systems “Google Classroom”, which helps teachers and students connect remotely, communicate and stay-organized, has got a wide attention and public interest during COVID-19 pandemic (Figure 7 (a)). This might be due to it’s easy and fast setup and usage (Sudarsana et al. 2019). Under systems built for use on basic mobile phones, both ‘kaiOS’ and ‘Ubongo’ have received a wide attention during the pandemic (Figure 7 (b)). ‘KaiOs’ has the ability to provide smartphone capabilities to inexpensive affordable devices and thereby helps open portals to learning opportunities. ‘Ubongo’ has also received a considerable attention, eventhough its target groups are school-age children and their parents in Africa. It facilitates localized, multi-platform Entertainment-Education to African families at

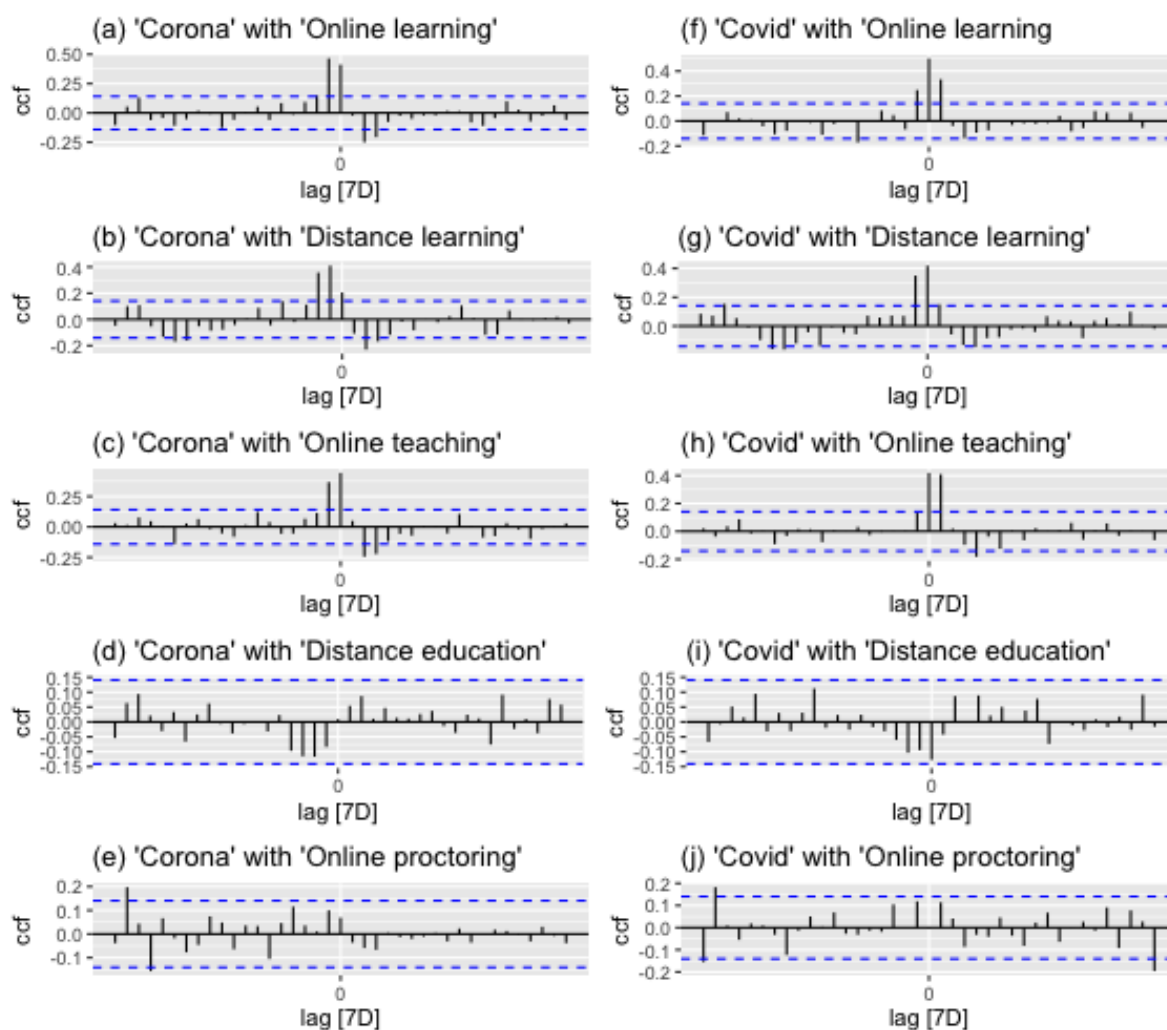


Figure 6: Cross-correlation analysis between distance learning related online search terms and COVID-19 related online search terms during COVID-19 pandemic

low cost and massive scale and is available in both Kiswahili and English. A significant peak in 'Ubongo' series can be observed during 2020 year end academic break in Africa (Figure 2). Under systems with strong offline functionality, 'Kolibri', which is available in more than 20 languages, supporting universal education, has got a considerable attention during COVID-19 pandemic (Figure 7 (c)) as the tool focuses on facilitating learners living in underserved contexts where the internet is costly, unreliable, or unreachable. These distance learning solutions can provide a huge relief for financially distressed families during COVID-19 pandemic. Under Massive Open Online Course (MOOC) platforms, 'Canvas', which provides free access for teachers to facilitate learning and professional development, has got a considerable attention in comparison to other options available (Figure 7 (d)). 'Udemy' has got the second highest attention. However, 'Canvas' has received far more attention than 'Udemy'. Under self-directed learning content 'Quizlet' has got a considerably high attention throughout the pandemic in comparison to the

other options available under the same category (Figure 7 (e)). It provides learning flashcards, AI based learning assistant and games to support student learning in multiple subjects and languages. The second highest option only provides support for language learning. Quizlet's ability to provide support for multiple subject might be the reason for it to outperform its competitor in the market. Under mobile reading applications, 'Reads', which provides digital stories with illustrations in multiple languages has consistently being the most popular option (Figure 8 (f)). Under collaboration platforms that support live-video communication, both 'WhatsApp' and 'Zoom' had got a considerable attention at the start of the pandemic in March 2020 (Figure 8 (g)). However, 'WhatsApp' has outperformed 'Zoom' with increasing public attention during the pandemic. In contrary, the global attention towards 'Zoom' has decreased over time. 'Teams' has also got considerable attention in comparison to the other remaining options available in the market. Under tools for teachers to create of digital learning content, 'Trello' which provides a visual collaboration platform for teachers for coursework planning, classroom organization and collaboration, has received a wide attention during the pandemic. 'Nearpod', that promotes active learning and student engagement through informative and interactive learning activities has also got a considerable attention during the pandemic (Figure 8 (h)). A significant peak can be observed in the 'Nearpod' series, during the first academic break. Under external repositories of distance learning solutions, both 'Brookings' and 'UNHCR' have got a significant global attention (Figure 8 (i)). 'Brookings' provides a large catalogue of learning innovations eventhough its focus is not limited to distance learning solutions. 'UNHCR' also provides an extensive list of distance learning solutions from the United Nations agency for refugees. Student assessment is vital in ensuring the quality of education. However, due unexpected sudden school closure, administering examinations at a distance became a major concern. Under tools for online proctoring, 'Pearson VUE' which provides computer based testing services in over 150 countries worldwide with more than 5,000 authorized test centers has got a considerably high public attention during the pandemic (Figure 8 (j)).

At the start of the pandemic in March 2020, a significant peak of public attention can be observed in both digital learning management systems (Figure 7 (a)) and collaboration platforms that support live-video communication (Figure 8 (g)). These peaks aligns with the near-total closures of schools due to COVID-19 pandemic (Figure 1). The major concerns that arise with the unexpected sudden movement from physical classroom to virtual learning environment, such as lack of experience to connect and share learning materials with students could be the reasons for this notable public attention towards these two aspects. Further, a significant peak can be observed in digital learning management systems (Figure 7 (a)), Massive Open Online Course

(MOOC) Platforms (Figure 7 (d)), Self-directed learning content (Figure 7 (e)), collaboration platforms that support live-video communication (Figure 8 (g)) and tools for teachers to create digital learning content (Figure 8 (h)), immediately after the academic break in August, 2020 (Figure 1). The inability to reopen school fully due to the increasing COVID-19 cases worldwide and the need of urgent responses to connect with students to somehow facilitate their learning could be the reasons for this considerable public attention around August, 2020.

Good psychosocial support is also vital to improve both students' and teachers' mental health and well-being during a pandemic. This is evident from the two sudden spikes in the search volume index graphs of the term 'Psychosocial support' (Figure 9) which correspond well with the academic breaks in August in both years, 2020 and 2021, under 'Education' category. This highlight the urgent need of attention and solutions towards these aspects. This type of an analysis based on secondary data is vital as these aspects can be easily overlooked due to the lack of connection and communication between students and educators during school closures.

5 Conclusions and Further work

In this study we investigated whether the Google Trend search queries can be used as a proxy of the popularity and the public interest in different distance education solutions. This study is the first detailed analysis of web search behaviour related to distance learning solutions, both in quantitative and qualitative terms during COVID-19 pandemic. A few previous published studies (Vaughan & Romero-Frias 2014; Kansal et al. 2021) have investigated Google trend search queries related to education, but only with a limited number of search terms or different focuses.

Our findings suggest that web search interest in distance education at the global level was strongly influenced by the COVID-19 pandemic. Google Trend search queries showed a strong cross correlation between COVID-19 related search terms and distance education related search terms. The high popularity and increasing public attention towards different distance learning solutions during COVID-19 pandemic was also investigated through a detailed Google Trend footprint analysis. The findings will help the educators to narrow down their search space and thereby select prominent options available in the market for different education purposes. According to Wallace (2003), the learning tools can have a significant impact on how students engage in online learning. The finding will also helpful for developers to identify their competitors in the market. High cost involved with different distance learning solutions, lack

of financial support/funding and lack of understanding about the existing distance learning solutions are some of the major issues the educational institutions face with the COVID-19 pandemic. Therefore, the findings of this study offer important insights to various stakeholders of education to make better decision with less time and effort.

Google Trends only captures the search behaviour of a sub population with Internet access, even though it is the most common worldwide search engine. Further, our study focused on global attention toward distance learning solutions during COVID-19 pandemic. Therefore, care should be given when generalizing these findings to different regions or different time periods, as different regions can have different market orientation and seasonal requirements. This can lead to variations in the search output and in turn the study findings for different regions and time frames. Further, Google Trends data were not available as absolute values and available only in the form of relative volume. Therefore the scores range from 0 to 100 do not allow the researchers to make meaningful comparisons across different education needs. Further investigation is needed at national and regional level to identify the specific measures that can be taken to ensure the quality of distance education at national and regional level.

Supplementary Materials

Data and scripts: Datasets and R code to reproduce all figures in this article (https://github.com/pridiltal/Covid19_Online_Teaching_paper).

Acknowledgment

This work was carried out with the aid of a grant from UNESCO and the International Development Research Centre, Ottawa, Canada. The views expressed herein do not necessarily represent those of UNESCO, IDRC or its Board of Governors.

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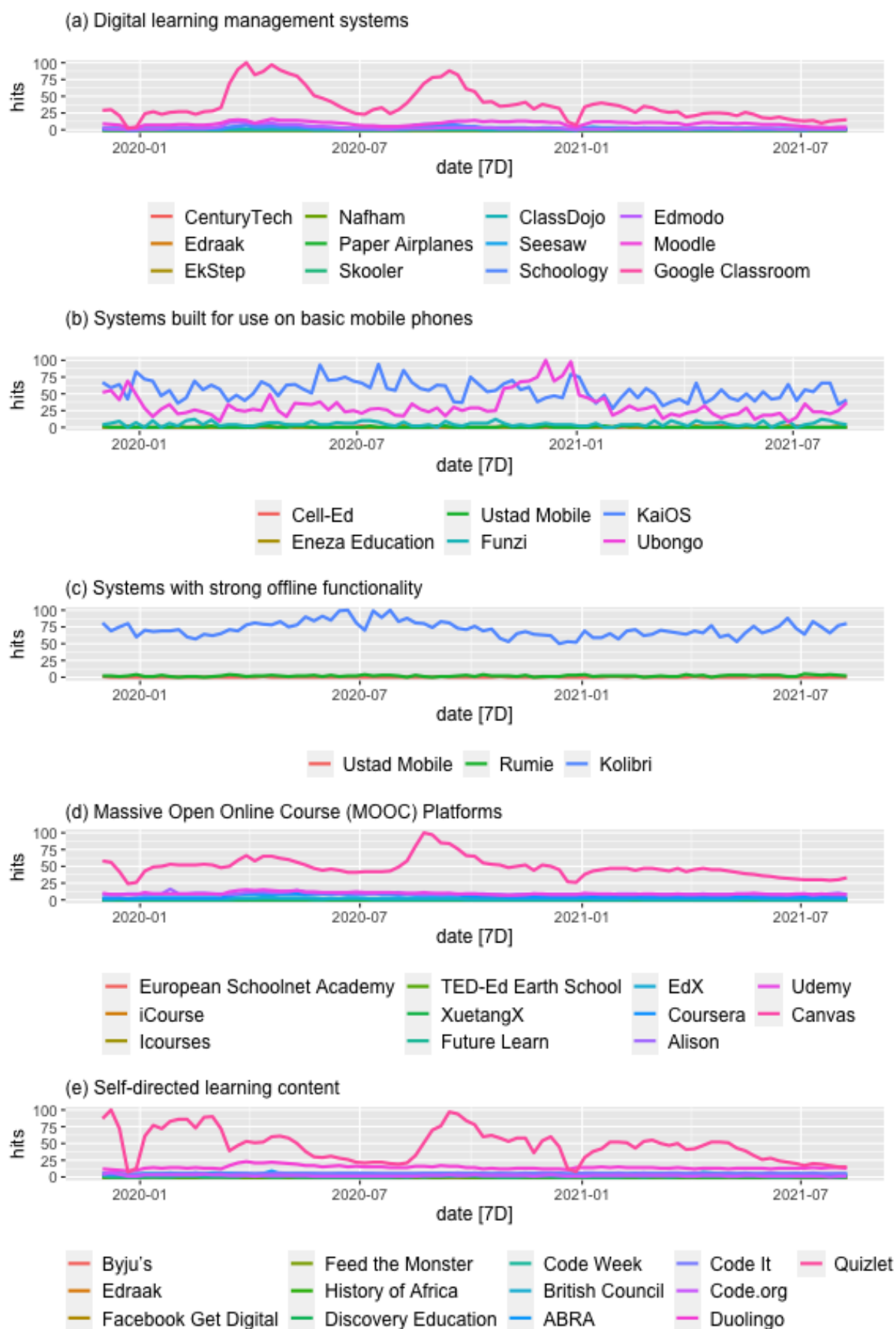


Figure 7: Google Trend footprint analysis of distance learning solutions during COVID-19 pandemic

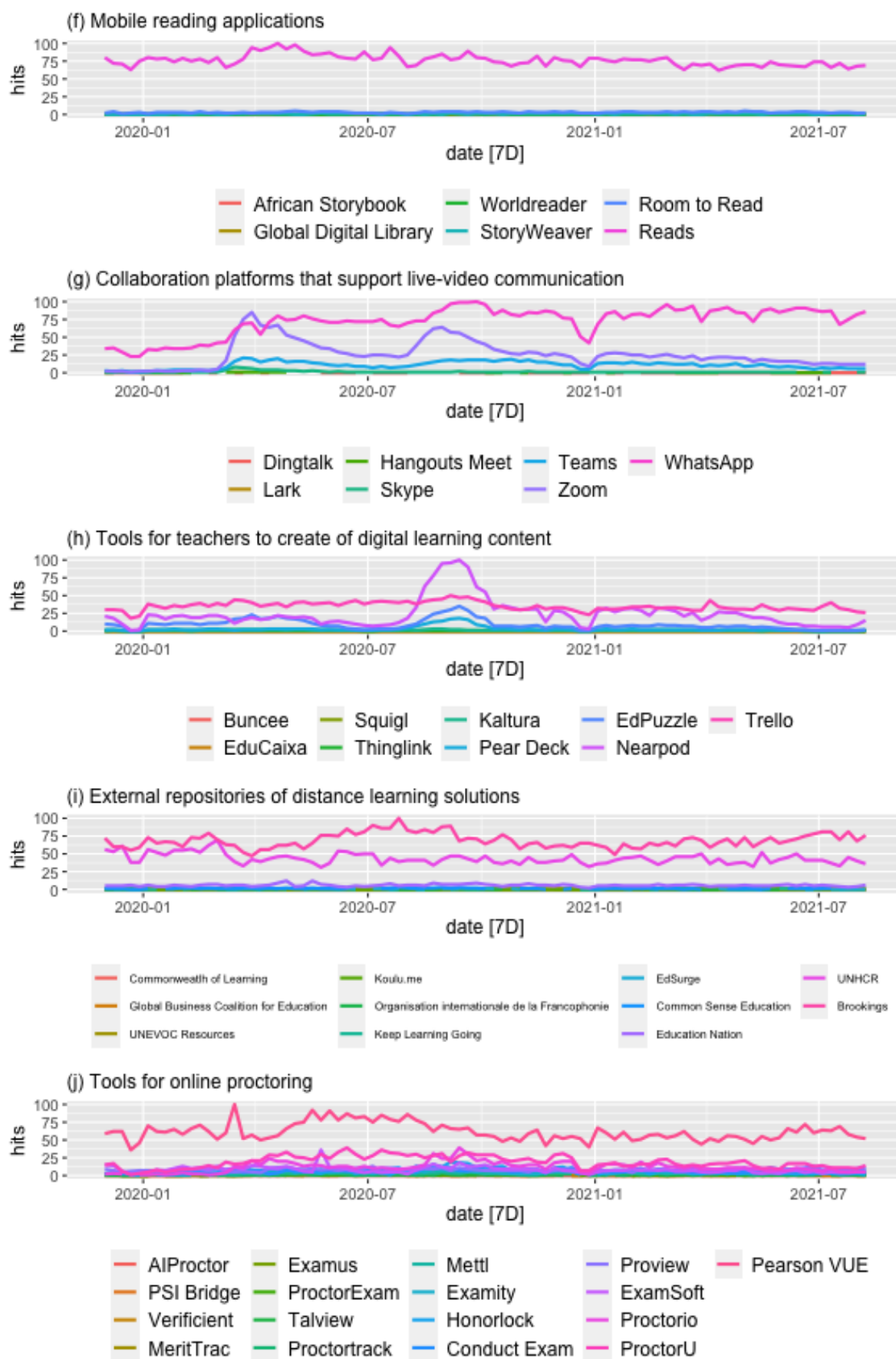


Figure 8: Google Trend footprint analysis of distance learning solutions during COVID-19 pandemic

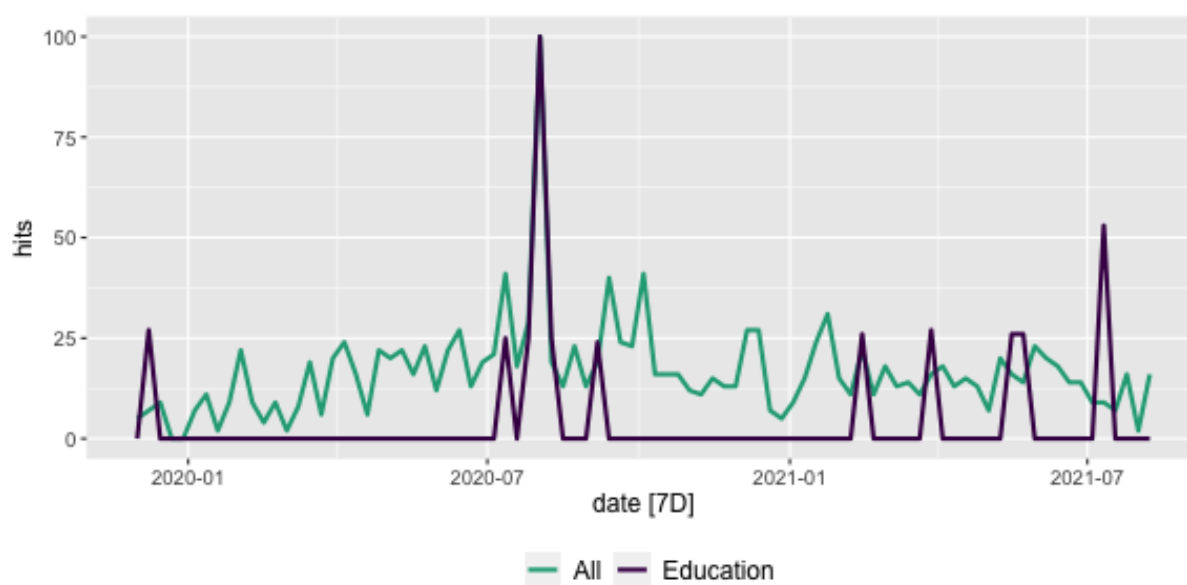


Figure 9: Google search trend of the term *psychosocial support* under *All* categories and *Education* category during COVID-19 pandemic