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## THE ROLE OF AI IN PRESERVING GLOBAL HEALTH: PREDICTIVE ANALYTICS FOR PANDEMIC PREVENTION AND RESPONSE

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### ABSTRACT

Artificial Intelligence (AI) can be regarded as an effective tool or weapon which can be used in achieving different strategies for global public health problems especially with regard to the control of pandemics. By utilizing such data science methods as data analytics, machine learning and predictive modelling of data, it would be theoretically possible to fundamentally change the operations concerning expectance, readiness and response to the effects of disease outbreaks. In this article, we will look at the application of artificial intelligence on the preservation of global health in three ways. First, it is important to note that AI can improve disease outbreak's preparedness by forecasting the disease's trends. Forecasting can be done by analyzing the available data which is derived from various sources such as electronic health records, social media and tracking systems. If such data is available, AI can promptly recognize patterns and indicate up and coming risks which can result in disease outbreaks. Secondly, AI can better perform resource management during pandemics by facilitating estimating the amount of medical resources and personnel or infrastructure that will be needed. Such a targeted approach could ensure that an effective network link is established leading to minimization of the outbreak of pandemics. Thirdly, AI can also help in accelerating the processes of the putting up of the drug in the market by analyzing genomic data in order to come up with the possible drug targets. Such assistance can result in the provision of new treatments and vaccines at a faster rate thus reducing any pandemic which is likely to be caused within that short time period. Overall, the utilization of AI will help in the prevention of the outbreak of various diseases and in tandem with global efforts there will be a permanent solution. AI can assist in contact tracing by evaluating social network and movement data to search for people who may have come into contact with the disease. This can be beneficial in mitigating further spread and controlling outbreaks effectively. While AI, in many ways, has a tremendous potential for enhancing health standards globally, few of the existing problems regarding the application of such technologies must be highlighted and solved. Data-related challenges include data quality and privacy, ethical and legal issues, and technical barriers to integration with other health care systems. Once these barriers are crossed, AI will have an important contribution

to the protection of health across the world and the creation of a stronger and more sustainable world for future generations.

**Keywords:** Artificial Intelligence, Global Health, Pandemic Prevention, Social Networks, Genomic Data

### **Introduction**

During the COVID-19 pandemic, it became apparent that new tools to predict, prevent and manage threats of a global nature are necessary. Almost everywhere on the world, the viral transmission had reached catastrophic proportion, and it became obvious how poor the systems available are and how much more could be done to avoid such situations. From this perspective, artificial intelligence (AI) can be regarded as a revolutionary force that provides innovative strategies for the surveillance, prediction and resolution of wide array health disasters. Such an efficiency of global health systems is achieved by the ability of AI to process huge amount of information at once, find trends and provide recommendations almost instantly (Naudé, 2020). This paper discusses how AI, in particular its predictive analytic component, could be used to improve our ability to prevent and respond to pandemics.

Artificial intelligence is very useful in active surveillance of diseases by integrating data from multiple clientele including news, social media, environmental sensors, and hospital records. AI systems that utilize machine learning techniques are capable of analyzing and understanding big data which is useful in determining the risks of serious disease outbreaks before they reach epidemic levels. Examples of such platforms are quite a few, including the BlueDot and HealthMap platforms that managed to detect early trends of COVID-19 outbreak in Wuhan based on geospatially relevant real-time artificial intelligence data (Ting et al., 2020). By employing the predictive patrimonial of AI, easily emerging hotspots by public health authorities will be able managers of resources and even potential epidemic areas much efficiently and more swiftly which will save life and reduce diseases spread.

In addition to prediction, AI also improves the response to pandemics by optimizing the deployment of resources, performing epidemiological predictions, and refining treatment regimens. Policymakers can leverage AI algorithms for outbreak prediction fine-tuned already on how the disease progressed over time, thus optimizing available resources and exploring different interventions beforehand. This has the ability to enhance the decision process, assisting governments more efficiently whenever a new health threat emerges (Vaishya et al., 2020). In addition, the technology may also help in drug and vaccine design by sifting through biological information to select the best candidates far quicker than routine pharmacological approaches. In the context of continually increasing global health issues there is no doubt that future AI in disease emergence and pandemic evolution prevention will be invaluable for maintaining high levels of readiness and prompt action for the protection of global health.

### **Predictive Analytics for Disease Outbreak Prediction**

Predictive analytics is a game changing tool that has come into the fold of epidemiology to predict disease outbreaks before they go out of control. Public health organizations get early insights about health crisis using artificial intelligence (AI) technologies like data surveillance, natural language processing (NLP) and machine

learning models. Today, these tools are critical since disease outbreaks can spread across borders rapidly, and the traditional detection tools lag. In this context, AI driven predictive analytics provides real time, data based insights enabling timely interventions which could dampen the impact of future pandemics (Wynants et al., 2020). In this section, the authors discuss how surveillance, NLP, and machine learning using AI can fundamentally change disease outbreak prediction.

### **Surveillance and Data Analysis**

The disease outbreak prediction is one of the most impressive examples of using AI to gauge the huge amount of data from various sources. AI can monitor, turn, and process data from electronic health records (EHRs), social media, environmental sensors, and global travel patterns among many more. Public health officials have this surveillance so they can detect anomalies in real time and start to detect early warning signs of potential outbreaks. For instance, when worldwide cases of the COVID-19 pandemic were early days, AI-based platforms such as Blue Dot and HealthMap used its ability to find unusual patterns in the health online conversation as well as international travel, for example flagging Wuhan as a problem spot before the outbreak spread worldwide (Nguyen et al., 2021). The way these systems work is by taking structured data, hospital records, for instance, and linking that to unstructured data say, social media posts and identifying correlations and patterns that human analysts might miss. AI's ability to ingest a never-ending flow of massive data sets to continuously process and analyze allows it to identify signals of outbreaks before they hit critical mass, allowing health authorities to be prepared.

Activation of AI capabilities within surveillance systems have the potential to drastically speed up the detection of disease outbreaks, allowing for faster response, distribution of resources. This is very appropriate amidst the era of globalization, where human mobility is on the peak and diseases faster than ever before. By tracking animal migratory patterns and travel data and climate changes in real time, AI can predict which parts of the world are at greater risk of an outbreak, and thus be able to take focused preventive measures (Rahimi et al., 2021). Combining data from diverse data sources for disease surveillance and predictive analytics allows for a full picture of the health landscape, how to early detect outbreaks.

### **Natural Language Processing (NLP)**

Natural language processing (NLP) is another very useful AI tool which has an important role in disease outbreak prediction. By analysing text based data such as text from news report, social media, online forum as well as search engine queries NLP algorithms can actually track the emerging health concern and geographic spread of disease. NLP allows the detection of the spikes in the health related discussions and flags it as a potential hotspot. During the Zika virus outbreak, this approach was successful in tracking the virus spread and the public perception of the disease (based on online conversations, news articles and social media posts) (Masri et al., 2021). During COVID-19, NLP tools contributed to real-time measurement of global discourse about treatment, reporting of cases, and symptoms which has proven invaluable for public health agencies.

What makes NLP perfect for early detection of outbreaks is that it can process language in various forms. However, in regions with insufficient traditional surveillance methods that people often use social media and online platform to upload their concerns about their health or report symptoms. NLP analyzes these data streams in real time and, by doing so, can spot trends or anomalies indicative that there is a potential outbreak, even before health authorities have paid any attention. NLP additionally translates information across varied languages and dialects; no place or community is missing in the surveillance process (Kishor et.al, 2022). This linguistic versatility makes NLP a useful global health surveillance tool in particular in developing countries with lots of diversity and lack of health infrastructure.

### **Machine Learning Models**

The machine learning models are such an important part of predicting what's going to happen next: you need to predict disease outbreaks. They can use historical data to spot patterns and warn when there is an outbreak imminent. Kumari et al. (2021) show that they can train algorithms on a past outbreak to generate predictive models that incorporate variables such as climate change, population density, migration patterns and human mobility to estimate where and when an outbreak is likely to occur. These models are dynamic, getting better and better as more data goes through these models and makes these models more and more accurate. Among these, we have used machine learning to predict outbreaks of vector borne diseases such as malaria and dengue which depend on the patterns of rainfall and temperature changes (Shang et al., 2021) that also impact mosquito breeding. Once these models are ready, governments and health agencies will be able to try and take preventive measures ahead of time: for instance, before the disease spreads to mosquito control or vaccine distribution.

In addition, machine learning models have an advantage in spotting complex relationships between variables that are not straight forward to see with traditional statistical approaches. These models can process large amounts of genetic information, environmental data and human behavior to identify trends and risk factors that together lead to the emergence and spread of infectious diseases in disease outbreak prediction context. That is to say, for example, we used machine learning models to predict influenza outbreaks based on seasonal weather data, population movement, and historical flu trends (Rekatsinas et al., 2020). They bring the model tools that allow authorities to get more targeted about where to put resources such as vaccines, medical staff, and other resources, to places most in need.

### **Integrating AI into Global Health Systems**

Predictive analytics when integrated with AI to global health systems has great promise in the prevention and response to disease outbreaks. Health organizations can shift from reactive to proactive strategies, their AI driven models and tools are able to predict potential outbreaks before they escalate. Surveillance data analysis together with NLP and Machine Learning models provide an ability to build a powerful monitoring framework for global health (Rahimi et al., 2021). Moreover, these tools are essentially customizable for use in diverse regions and diseases. While integrating AI

in global health systems is possible however, these issues concerning data privacy and accessibility of technology in developing countries among other things have to be addressed to make AI driven healthcare solution accessible to all by address the issue of equitable access to AI driven healthcare solutions.

### **Challenges and Future Directions**

AI driven predictive analytics promises much for disease outbreak prediction, but adoption is still stymied by challenges. The problem with limited or poor data and data infrastructure, in particular in low income countries, is a major issue. In addition, personal health information privacy concerns exist when using AI systems as public trust in the emerging applications is key. The development of clear guidelines and policies in order to prevent misuse and therefore right or discrimination of AI in global health is necessary to ensure the ethical use of AI in global health (Vayena et al., 2018). Future work requires additional collaboration between governments, health organizations, and AI researchers to refine these predictive models and, ultimately, bring them to life.

### **Optimizing Responses to Health Crises**

The COVID 19 global health crisis has shown us that responding to global crises requires effective strategies. Today it is incumbent on us to use artificial intelligence (AI) to optimize pandemic response in resource allocation, contact tracing, and drug discovery. Large scale data analytics can be used to help make decisions within the AI more efficiently and timely and greater decision making in time of emergency. AI has been proven to be useful in attacking the public health crisis; from pumping up vaccines, to making it easier to spread resources and checking up on disease growth (Chowdhury et al., 2021). In this section, I provide an overview of the molecules that AI can optimize responses to health crises to: This is in service of resource allocation, contact tracing and drug discovery and development.

### **Resource Allocation**

During a pandemic, there is a necessity for efficient allocation of medical resources like hospital beds, ventilation, medications, and people. In this, AI can play a useful role analyzing real time data about disease prevalence, healthcare capacity, and population demographics to identify the very worst areas that need urgent attention. During COVID-19 AI driven predictive models were employed to estimate future caseloads which allowed the distribution of medical supplies as a means to relieve pressure on overworked healthcare systems (Sharma et al., 2020). Using AI, we can analyzes such things as infection rates, healthcare infrastructure and vulnerable populations and ensure that resources are pushed where the need is greatest, where there will be the smallest shortages and therefore the biggest bang for the buck in healthcare response. Furthermore, AI enables better preparation and response to predicting gaps in healthcare demand and supply, before they become critical. An example that illustrates the potential of AI models is their ability to track disease patterns and forecast when and where hospitals will experience patient surges to proactively resource with ventilators or intensive care unit (ICU) beds, and governments or health systems (Zhou et al., 2021). It also minimizes waste and makes resources available where they are

needed most, limiting overburdening of systems to prevent healthcare systems from falling apart in high risk areas. In addition, AI can help take care of the logistics of vaccine distribution, analyzing factors such as population density, geography is impassable, and transportation networks to guarantee that the vaccines reach populations effectively (Wang et al., 2021). An AI enabled resource allocation is a necessary tool for resource allocation that optimizes responses to the pandemics, ensuring quick and effective deployment of resources in health emergencies.

### **Contact Tracing**

There to provide the necessary tools to manage the spread of infectious diseases, COVID-19 pandemics included, are AI powered contact tracing applications. By looking at data from smartphones and other devices, designed AI can see who has been exposed to an infected person. It allows health authorities to swiftly and enforceable impose contextual quarantine measures, control the spread and minimise large scale outbreaks. This was true, for instance, of AI contact tracing apps like Trace Together in South Korea and Corona 100m in Singapore, which were used to keep the spread of the virus under control by isolating potentially infected individuals (Ferretti et al., 2020). The algorithms used by these apps analyze Bluetooth or GPS data to keep contact tracing both accurate and efficient.

In addition, the real time flow of data that AI can perform is also added to the efficiency of AI in contact tracing. From health records to travel histories, social media, AI can pull out of complex datasets all the way to create a comprehensive network of possible transmission sources. As a result, public health officials can plan outbreak clusters and prevent the spread of a disease if it spreads widely (Ge et al., 2021). Above all, there are AI based contact tracing systems that can remove privacy worries by making data anonymous without compromising contact and review ability. A huge advantage of AI is the capacity to help drive up contact tracing efforts quickly and efficiently, without the need for a large number of manual tracers.

### **Drug Discovery and Development**

Drugs discovery and development during health crises are also accelerated by AI. Drug development using traditional processes can consume years, and be extremely costly, before an ultimately suitable drug candidate is identified and brought to market. This, however, is where AI comes in, as it could usefully streamline this process by analyzing huge quantities of genomic, chemical and clinical data to speed up the discovery of new drug targets and treatments. AI tools were also used during the COVID-19 pandemic where it was used to analyse the virus's genome to determine potential drug compounds that could interfere with its replication (Boehm et al., 2021). By contrast, these AI models can ruthlessly process enormous datasets to find good candidates for clinical trials, cutting the time required for drug discovery to decades.

In addition, AI can also help repurpose existing drugs by understanding how they affect new pathogens. Existing AI algorithms compare the structure and behavior of known diseases with emerging ones, and can predict which existing drugs might be effective in treating new infections. For example (Stokes et al., 2020) identified potential treatments for COVID-19 by using AI to examine data from previous study

of two coronaviruses (SARS, MERS) on COVID close relatives. Aside from drug discovery, AI can also help advance vaccine development by searching through genetic sequences to predict what immune responses will be most effective, and thus shorten vaccine testing and approval (Vora et al., 2021). For purposes of responding to global health emergencies, AI is an invaluable asset for the speed and precision it can bring to drug discovery.

### **Future of AI in Health Crisis Management**

The role of AI in optimising responses to health crises will expand as AI evolves. Not only during pandemics, but AI's ability to analyze large datasets, and have the capability to predict trends is frankly invaluable to the public health world in managing the routine challenges. The efficiency of resource allocation, streamlining contact tracing, and expediting the develop of drugs and vaccines are potential revolutions to how governments and health organizations respond to global health threats through using AI. As AI systems mature and are more integrated into healthcare infrastructure, they will be better able to generate real time insights, and provide support, during future pandemics and other health emergencies (Rajpurkar et al., 2022).

While there have been successes achieved with AI in health crisis management, it's an area that has faced hurdles with data privacy issues, ethical problems, and the infrastructure isn't robust enough. To ensure that the responsibly and equitably used AI technologies, cooperation of policymakers, health professionals and developers of such technologies will be needed. However, despite this, AI has significant potential to improve responses to health crises and improve public health outcome and prevent future pandemics.

### **Challenges and Considerations**

AI can change public health through the predictive analytics and optimized responses fundamentally, but it faces several challenges and considerations before it can be effectively and ethical applied. Data quality and privacy, ethical considerations and interoperability between healthcare systems, all form part of these challenges. If not paid attention to, the benefits of using AI in public health can be undermined, resulting in bias, accessibility to health care that is equally provided to all parts of the society and compromise to privacy. In this section, we talk about these key challenges, and explore what it takes to responsibly use AI in public health.

### **Data Quality and Privacy**

Dealing with data and ensuring it is accurate and of good quality is one of the greatest challenges for deploying AI in the health domain. Vast datasets are relied upon for predictive models and AI applications and include many different sources, like from electronic health records (EHRs), social media, genomic data, and real time disease tracking systems. The AI models might produce unreliable results if the data is incomplete, outdated and inaccurate, resulting in ineffective intervention and resource allocation. Data quality is an issue, and maintaining it often means regular updates, healthy validation processes, and incorporating as many data points as possible to cut back on error (Ross et al., 2021). They also have to cope with vast amounts of health data that are inevitably characterized by variability and inconsistency — which is, for

one thing, the result of having a hierarchy of coding systems and reporting standards across the regions.

Another major concern is data privacy, especially if it involves sensitive health information. Collecting, storing, and sharing personal data for AI applications (especially contact tracing or disease surveillance) often involves using personal data, which poses a number of questions regarding the process: How is data collected and stored?

How is data shared? It is a fine line between protecting person's privacy while having efficient AI driven health solutions. As much as there have been discussions on how anonymization techniques, encryption, and consent frameworks can help ensure misuse of personal data (Bietz et al. 2020). Assurance of how responsibly the data is being used by AI system is dependent on the public trust in it, and this can be built on with stringency in the privacy measures.

### **Ethical Considerations**

AI in public health is a big story, and a key point is whether or not you can use it hill in a fair and bias. AI systems are only as good as the data that is fed into it, and the data that we're feeding into a machine is simply what's already been biased." For instance, an AI system trained mostly on high income country data or the urban setting is likely to not perform as well in these low income regions, or rural settings, thereby leading to inequitable healthcare outcomes (Reddy et al., 2021). Construction of ethical AI development involves nuanced thinking about training data, algorithm design and impact of AI drawn decision on various societies.

A second such ethical challenge is the possibility that AI will take over human judgment in important healthcare decisions. AI can help healthcare professional by giving data driven insight but it should never replace the human expertise, in the case of complex medical conditions. But correct use of AI systems requires ensuring that they are used as tools to aid, not replace, human decision making in healthcare. Furthermore, there is fear that no one is accountable if an AI system gets a bad prediction or recommendation wrong (Floridi et al., 2018). These risks must be mitigated by clear guidelines regarding the ethical use of AI in public health as well as make sure that AI systems are designed, deployed and used responsibly.

### **Interoperability**

Another critical issue to the use of AI in public health is interoperability. If AI powered solutions will be deployed across different regions and the healthcare systems, integration between many platforms, database, etc. is required to be seamless. In global health crises, such as the one with COVID-19, where data from several countries and organizations must be shared and analysed in near real time, this is crucial. However, differences in standards used for data collection, storage, and reporting across healthcare systems around the world make it hard to build unified AI models able to carry out smooth processing and analysis of data (Kumar et al., 2021). Differences in legal and regulatory frameworks across countries increase the difficulties of compatibility challenges; therefore data sharing and cooperation becomes messy.



In order to resolve these problems, it is increasingly recognized that standardized data formats and protocols need to be developed and adopted so as to be viable at multiple systems. As efforts like those of the World Health Organization (WHO) and the International Organization for Standardization (ISO) are underway to reach global standards for health data interoperability that will make it easier to deploy wider use of AI in public health (Jiang et al 2021). To enable these potential uses of deploying AI to predict diseases outbreaks, and allocate and deliver healthcare resources, it is important to ensure that AI systems will seamlessly integrate with existing healthcare infrastructure and data sources. The true interoperability will depend largely on collaboration of governments, providers, and technology companies to design a comprehensive approach to data sharing and analysis.

### **Conclusion**

Artificial intelligence (AI) will revolutionize global health by enabling more accurate disease prediction, more efficient resource allocation and improved crisis response. The initial data for AI comes from large datasets across a variety of sources that AI uses to detect early warning signs of disease outbreaks and rapidly and precisely respond. In a health crisis - such as a pandemic - AI can help alleviate the overload by forecasting infection trends and directing critical resources to where they are most needed. In addition to better overall response, this capability has minimal effect on healthcare infrastructure. However, there are still hurdles to clear for AI to fully embrace its potential for global health. When building AI systems, quality and accuracy matter a lot — we want to make sure that the data that they rely on to predict and recommend is good. Finally, there are privacy concerns that also need to be carefully managed, because the use of sensitive health information requires strong protection of personal integrity consistent with public confidence. It is also important to deploy AI ethically to ensure biases and inequities are not imposed on vulnerable populations. Fairness and transparency of the AI systems must be borne in them so as to serve the overall good of society. Other key factor considered is interoperability between healthcare systems around the world. To have real impact, AI driven solutions need to be deeply integrated across many platforms and data sources. These case overcoming of these can greatly enhance global health resilience enabled by collaboration between governments, healthcare professionals and tech developers with AI. But with proper ethical frameworks and proper technological infrastructure, AI can be used to help build a more sustainable healthcare system that will be prepared, in advance, to anticipate, prevent, and respond to the next health crisis.

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