

## **PREDICTIVE AI FOR IDENTIFYING VULNERABILITIES BEFORE RANSOMWARE ATTACKS IN HOSPITALS**

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***Abstract:** This study examines how predictive AI can be used to detect cybersecurity vulnerability of a hospital IT system before the occurrence of a ransomware attack. The literature discusses the ways in which predictive AI can improve the cybersecurity of a hospital by detecting vulnerabilities in favorable early periods and mitigating the threats of ransomware attacks. It applies an explanatory research design and secondary data analysis to review how predictive AI can transform healthcare cyber security to become more proactive than reactive. The results indicate that predictive AI can promote a high threat detection understanding, reduce system outages, and improve defense against patient data. The study also emphasises AI integration, employee education, and a strong infrastructure that can create secure hospital systems.*

***Keywords:** Predictive AI, Ransomware Prevention, Healthcare Cybersecurity, Vulnerability Detection, Machine Learning, Hospital IT Security*

### **I. INTRODUCTION**

#### *A. Background of the Study*

The use of digital systems and sensitive patient data increases the number of ransomware attacks that affect hospitals. These attacks are capable of causing serious disruptions in medical activity also violations of patient safety as well as financial and reputational losses [1]. The traditional cyber security mechanisms are reactive towards the action of an attack. Predictive Artificial Intelligence is providing a pro-active way to study patterns with anticipate threats. The machine learning and data analytics can be utilised to enhance the existing cybersecurity system in the hospitals [2]. The study discusses the feasibility of deploying predictive AI as a part of hospital IT systems also exposes the vulnerability of real-time threats of ransomware attack.

#### *B. Overview*

This study investigates the role of predictive Artificial Intelligence in enhancing hospital cybersecurity prior to an attack of ransomware. Healthcare starts to digitalise in the patient information and combine with other more connected technology as they become more vulnerable to cyber-attack. Predictive AI is an opportunity to explore significant amounts of data with identify unusual reactions and forecast possible attacks [3]. The aim of the study is to evaluate the success of applying AI-based tools which contributes to the anticipation of the possible early signs of

ransomware attacks and give appropriate proactive solutions. It is valuable as it discusses an area of high importance as hospital security breaches can be life-threatening also highlight the significance of improved AI as a measure of safety and service deliverability.

### *C. Problem Statement*

The hospitals are increasingly at risk of ransomware attack that could damage critical systems alongside endangering the lives of patients. Although there are established cybersecurity measures, several healthcare facilities are still at risk with expired infrastructure, insufficient resources, and passive approaches to security [4]. In many cases, the existing systems either cannot identify the threat, or would not be able to predict the damage prior to its occurrence, causing expensive disruptions and data leaks. It is urgently necessary to seek more proactive solutions that enable indicating weaknesses before they are exploited. This gap may be overcome with predictive AI, which uses vulnerability and suspicious activity prediction to enable detection beforehand. This research paper addresses the potential of predictive AI as one of the most viable ways of minimising the chances of the risk of ransomware attacks in hospitals.

### *D. Objectives*

The objectives are: 1. To analyse how predictive AI can be used to identify weak points in hospital IT systems in order to identify them before ransomware attacks. 2. To determine the efficacy of AI-based threat detection systems in enhancing hospital cybersecurity. 3. To explore the most important issues and needs as implementing predictive AI into healthcare cybersecurity systems.

### *E. Scope and Significance*

This study is dedicated to the use of predictive Artificial Intelligence (AI) in the detection of vulnerabilities in hospital systems to cybersecurity attacks even before ransomware attacks. The scope also involves examining AI tools that analyse network behavior, anomaly detection and risk pattern assessment in real-time. It also discusses how these technologies can be implemented in the existing infrastructure of IT fundamentals of hospitals and enhance early detection of attacks [5]. The significance of the study is that it can change the situation and make hospital cybersecurity reactive to proactive. Predictive AI can mitigate outages also protect highly sensitive patient data and ensure seamless medical practitioner care in identifying threats. The study can be part of a larger endeavor of protecting healthcare operations in the face of the increasingly dangerous cyberattacks.

## II. LITERATURE REVIEW

### *A. Predictive AI to Detect Hospital IT Vulnerabilities Before Ransomware Attacks*

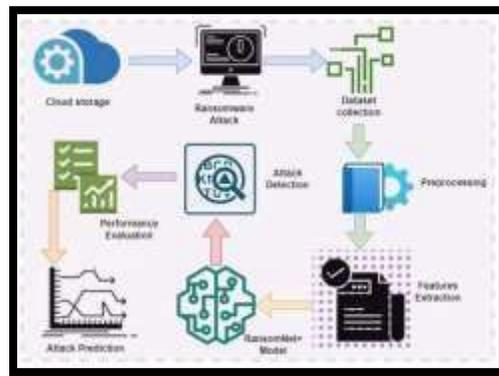
Predictive AI can be utilised to support in protection of IT systems within hospitals by predicting related vulnerabilities before they are exploited by ransomware malware. This can be utilised to track network traffic, system and user behavior by way of machine learning and data analytics to identify a trend that indicates damage [6]. It can also detect abnormal access, outdated programs, or improperly configured systems are some of the common ways through which cybercriminals

use to enter to steal data [7]. Predictive AI allows IT teams to react to threats and mitigate them proactively by processing large amounts of data on historical and real-time data.

Predictive AI ensures a significant gain in hospital care, where patient safety and data privacy are crucial as the shift from reactive to proactive changes the logic of operation. For example, AI-based solutions can replicate an attack in order to evaluate defence and create system as prioritisation by risk level [8]. Such active fault detection does not only minimise the downtime and loss of valuable data, which is of great importance but improves overall resilience in the hospital against future cyber-attacks.

### *B. The Effectiveness of AI-Based Threat Detection in Hospital Cybersecurity*

The use of AI in detecting threats to cybersystems has become an efficient method in increasing the security of hospitals. The machine learning algorithms incorporated in these systems help detect abnormalities, detect access to an area by an unauthorised user, and help predict breaches with significant success rates. AI can detect threats in time to prevent the development of ransomware attacks by analysing traffic and user behaviors, and system vulnerabilities in real-time [9]. As opposed to traditional security systems based on the predetermined rules, AI learns something new each time receiving new data and adjusting to new threats, providing quicker and more reliable detection. AI in hospitals not only minimises the response to cyber-attacks but also reduces number of human errors and workloads through answering queries [10]. This results to better security of patient sensitive data and continuity of essential healthcare services. Hospitals that use AI-based threat detection have a major decrease in cyberattacks and this makes AI an effective mechanism of creating a more resilient digital health infrastructure [referred to *Figure 1*].



**Figure 1: AI-Based Threat Detection of Ransomware Attacks**

[10]

### *C. Key Challenges and Requirements for Implementing Predictive AI in Healthcare Cybersecurity*

There are a number of important issues related to the implementation of predictive AI in healthcare cybersecurity. Privacy of the data is one of the key concerns with AI systems, since they will need immense amounts of sensitive data about patients and operational data just to operate properly. To prevent legal and ethical violations, it is necessary to ensure that there is compliance with

regulations (such as HIPAA or GDPR) [11]. The other challenge is to incorporate the AI in the existing infrastructures of IT infrastructure, which are not only out-dated but fragmented in most of the hospitals.

Healthcare institutions that want to implement predictive AI successfully are required to invest in a safe data infrastructure, employee training, and cross-departmental cooperation between IT and clinical departments [12]. It is also important to create explainable AI models which provide interpretable results, and can assist in gaining the user and decision-maker trust. Meeting those requirements helps to not only make AI tools more effective but also secure their sustainable utilisation in supporting hospital systems against cyberattacks.

### III. METHODOLOGY

#### *A. Research Design*

This research uses an explanatory research design to explore how predictive AI will help detect threats in the hospital systems before ransomware attacks. Explanatory design is suitable because it aims at determining cause-and-effect relationships as how predictive AI tools can affect the results of cybersecurity [13]. The research demonstrates the dynamics of AI could proactively identify threats through the use of real-world case studies and system performance data as well as the insights provided by experts. The design also allows to explore the processes, effectiveness, and limitations of predictive technologies in a healthcare environment, valuable information that extends beyond description and leads to more evidence-based advances in the approaches to hospital cybersecurity.

#### *B. Data Collection*

The research employs qualitative and quantitative secondary data to provide an in-depth explanation of AI as a predictive tool in protecting ransomware attacks in hospitals. Quantitative information is collected from industry statistics, graphs and AI performance indicators [14]. Case studies, academic journals, and reports of healthcare cybersecurity agencies are some types of qualitative data that facilitate contextual understanding of applications and problems in the realworld. It is appropriate to use secondary data because of the sensitivity and confidentiality of the hospital cybersecurity systems, which restrict accessibility to the primary data. The method supported by credible and existing research also maintains ethical standards.

#### *C. Case Studies Examples*

##### ***Case Study 1: A survey of ransomware attacks for healthcare systems***

The case study examines the current rise of ransomware threats in the health care sector and how the industry is susceptible to such threats because of its transformation towards digital healthcare delivery services. The study aims to establish good prevention strategies as cybercriminals exploit poor security systems. It discusses modern technologies like Blockchain, Software Defined Networking (SDN), and Machine Learning that may be used to detect and prevent ransomware threats. The case study also provides useful information to information security workers, health

facilities and cybersecurity companies, and role in boosting system resilience and shielding sensitive patient information against the changing ransomware risks.

***Case Study 2: Cyberattacks and the cybercrime threat of ransomware to hospitals and healthcare services during the COVID-19 pandemic***

This case study examines the increased vulnerability of cybersecurity in the healthcare sector due to COVID-19, where it became an ideal target of cybercriminals. Ransomware attacks also grew in instances as quickly as the virus itself, taking the advantage of the abrupt transition to working remote and overwhelmed health systems [15]. The literature points out the international dimensions of such occurrences and their dire impact on the delivery of health services. It also offers various countermeasures like predictive AI and machine learning to ensure that cybersecurity frameworks are enhanced in a way that they can protect the healthcare industry more appropriately in the future against cyber threats.

*D. Metrics of Evaluation*

<b>Metric</b>	<b>Description</b>	<b>Purpose in Evaluation</b>
<b>Threat Detection Accuracy</b>	Measures the percentage of correctly identified threats by the AI system [5].	Evaluates how reliably the AI detects actual vulnerabilities or cyber threats.
<b>False Positive/Negative Rate</b>	Indicates the rate at which AI incorrectly flags or misses potential threats.	Helps assess the system's precision and minimise unnecessary disruptions or overlooked risks [8].
<b>Response Time to Threats</b>	Time taken by the system to detect and alert about a potential threat.	Determines how quickly the AI system can identify and report vulnerabilities in realtime.
<b>Integration Efficiency</b>	Assesses how smoothly the AI integrates with existing hospital IT infrastructure [9].	Measures the ease and costeffectiveness of deploying predictive AI within hospital systems.
<b>System Downtime Reduction</b>	Tracks the decrease in service interruptions due to preemptive threat detection.	Demonstrates the practical impact of predictive AI on hospital operations and service continuity [12].

**Table 1: Evaluation Metrics**

(Source: Self-developed)

The table summarises the important metrics for assessing predictive AI performance in hospital cybersecurity through detection quality, response time, rate of false alerts, integration efficiency, and reduction in system downtime to measure overall performance [referred to Table 1].

#### IV. RESULTS

##### A. Data Presentation

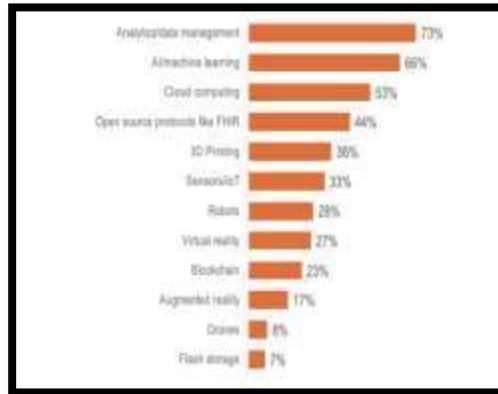
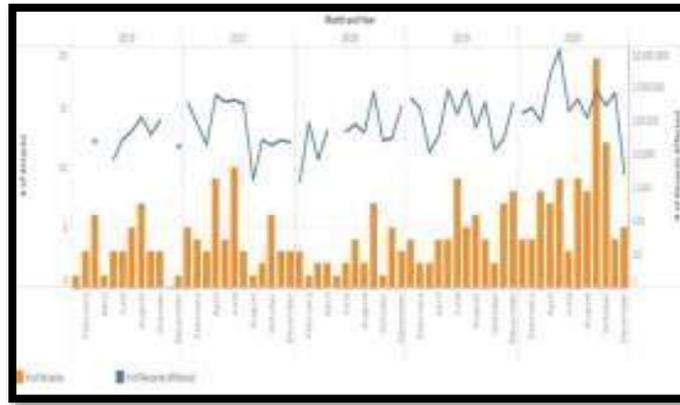


Figure 2: Technologies in Healthcare

[17]

The graph identifies some crucial technologies that are expected to shape innovation in healthcare. Analytics/data management are at the 73 percent followed by AI/machine learning 66 percent and cloud computing 53 percent with a high dependence on data-driven and intelligent systems [17]. Other open-source protocols such as FHIR (44%), 3D printing (36%), and IoT sensors (33%), all contribute to this trend with a focus on interoperability, personalisation, and real-time monitoring [17]. The technologies such as robots, VR, blockchain and AR, have a medium effect, and drones and flash storage have relatively minor roles. This also highlighted the importance of AI and data analytics in proactive cybersecurity for Identifying Vulnerabilities Before Ransomware Attacks in Hospitals [referred to Figure 2].



**Figure 3: The Number of Healthcare Ransomware Attacks**

[18]

The graph represents the ransomware attacks at U.S. healthcare organisations and the amount of patient records impacted in years 2016-2020. However, the changing number of attacks was not consistent throughout the year, but 2020 indicated a sharp rise, particularly in August and September [18]. Patient records were also exposed in large quantities during the months, with millions of records exposed. There were significantly high data breaches in months where the number of attacks were lower, showing vulnerability and different levels of attacks [18]. The growing pattern indicates the increasing threat of cybersecurity on healthcare systems. The tendency underlines the significance of predictive AI to detect vulnerabilities integrated prior to ransomware attacks in hospitals *[referred to Figure 3]*.

### *B. Findings*

The results indicate that intelligent or data-focused technology is becoming the main force behind healthcare innovation. The predictive AI and analytics are the fore-front and center in optimising cybersecurity. These technologies help the hospital to anticipate vulnerabilities in systems to prevent ransomware attacks also these support in enhancement of preparedness and responses [17]. The tendencies in the ransomware attacks show irregular trends as even those periodical phases with low attack rates demonstrate a high level of data leaks [18]. These findings highlight the importance of intelligent, foreseeable systems that could detection to prevent threats and enhance efficacy of healthcare settings.

### *C. Case Study Outcomes*

#### ***Case Study 1: A survey of ransomware attacks for healthcare systems***

- Poor Security and High-Paced Digitalisation of the Healthcare Industry as a Cause of Ransomware Exposure [15].
- Predictive AI, Blockchain, SDN, and Machine Learning can be effective methods of avoiding ransomware risks as well.

**Case Study 2: Cyberattacks and the cybercrime threat of ransomware to hospitals and healthcare services during the COVID-19 pandemic**

- The COVID-19 crisis has created a greater risk of cyberattacks on healthcare institutions due to both remote working and traditional systems.
- The predictive artificial intelligence and machine learning are powerful components that can reinforce cybersecurity systems and safeguard patient information to future attacks of ransom viruses [16].

*D. Comparative Analysis of Literature Review*

<b>Author</b>	<b>Focus</b>	<b>Key Findings</b>	<b>Literature Gap</b>
[6]	Ransomware attribution via preattack behavior	Highlights early detection using preattack activities.	Lacks integration with hospital-specific AI frameworks.
[7]	Ransomware detection in clinical environments	Demonstrates intelligent, dynamic mitigation strategies [7].	Limited scalability and real-world application in large hospitals.
[8]	Research status and recommendations on hospital cyberattacks	Offers best practices and current research trends.	No detailed exploration of AIbased predictive solutions [8].
[9]	Ransomware as a future threat to healthcare	Predicts increasing risks and evolving attack methods.	Insufficient focus on proactive technology integration.
[10]	Ransomware risk in healthcare industry	Emphasises healthcare’s weak cybersecurity posture [10].	Lacks specific preventive AI-driven solutions.
[11]	Ransomware threats to critical infrastructure	Discusses structural vulnerabilities and response challenges.	Missing actionable, predictive AI implementation models.
[12]	Ransomware recovery and imaging operations	Shares post-attack recovery strategies and planning tips.	Focuses on post-incident rather than prevention through predictive AI tools [12].

**Table 2: Comparative Analysis of Literature**

(Source: Self-developed)

This table is a summary of important literature on ransomware in healthcare, and it demonstrated that these efforts are primarily positioned towards detection and recovery, leaving a conspicuous absence of proactive, AI-based efforts at preventing the condition specifically in the context of hospitals [*referred to Table 2*].

## V. DISCUSSION

### *A. Interpretation of Results*

The findings have shown that there has been an evident evolution in healthcare innovation related to data-driven and smart technologies, and the leading trend is oriented towards analytics, AI, and cloud computing [17]. The advances do not only facilitate individual and real-time care but also imperative to reinforcing cybersecurity. The trends shown in the ransomware attack are the unpredictability but extreme attacks, especially those caused by the COVID-19 pandemic, when the health system was the most susceptible. In months of fewer attacks, there was mass data exposure that showed a variable but hazardous threat level [18]. This emphasises how predictive AI systems needed to foresee and protect the exploitation of the flaws and breach of healthcare services and patient data by ransomware.

### *B. Practical Implications*

The practical implications of the present study also reveal the dire necessity of the integration of predictive AI into hospital cybersecurity systems. Healthcare institutions can adjust their focus on proactive rather than reactive defense against ransomware and prevent the leakage of patent information as use of AI-powered threat detection [15]. The use of such technologies can also promote greater real-time monitoring and systematic resilience and the sustenance of care services. Also, predictive AI could assist IT teams to rank the vulnerabilities and to simplify the incident response. The study has healthcare policy implications and could direct the investment needed to support cybersecurity infrastructure.

### *C. Challenges and Limitations*

This research has a number of limitations and challenges, mainly connected with the usage of secondary data, which is not always relevant to provide the latest and contextual cybersecurity events in hospitals. There is also the problem of having little access to real-time sensitive hospital data that limits the scope of analysis [14]. The fast-changing nature of cyber threat and artificial intelligence also poses a challenge of keeping findings relevant into the future.

### *D. Recommendations*

Predictive AI that can detect vulnerabilities prior to a ransomware attack should be a top priority to increase cybersecurity in healthcare, even in health facilities. Safe data infrastructure and constant employee training are crucial and thus key in making the AI systems successful in their adoption and execution [8]. Working with policy makers and cybersecurity professionals will allow the standardisation of the protocols [12]. Moreover, an effort to build a culture of cybersecurity awareness within healthcare employees can significantly decrease the risk of human error and enhance response measures.

## VI. CONCLUSION AND FUTURE WORK

This paper has revealed that healthcare systems are becoming more vulnerable to ransomware attacks with the increased pace of digital transformation. Predictive AI appears as a critical tool that provides hospitals with an opportunity to discover cybersecurity vulnerabilities proactively to prevent them before they occur. The results highlight the need to have solid cybersecurity strategies and employee readiness as well as the use of smart technology to protect the healthcare facility.

As future research, a more detailed study based on primary data collected at healthcare organisations would give more detailed insights into predictive AI systems performance and implementation issues. Future research might also investigate hybrid systems that incorporate both AI and other advanced technology, such as blockchain or edge computing, and test policy frameworks that enable securely scaling AI adoption in healthcare cybersecurity.

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