

# Application of AI and DLT in 6G Network Security: A Review of Related Literature

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## ABSTRACT

This paper reviews the network security in 6G applied in various emerging technologies. The content of the paper discusses the 6G which is expected to be merged with various sorts of slicing enabled by new technologies and paradigms to make the system more intelligent, flexible and safeguard the network infrastructure. This paper identifies the issues and challenges of the 6G network influenced by higher energy efficiency, connection flexibility, tactile challenges, spectrum allocation, and usage rule. Based on the problem presented, current research areas in network security, such as AI and DLT were found as solutions, which can be employed for security at many cybersecurity protection and defense stages. The value of these technologies is based on the benefits of autonomy, increased accuracy, and predictive capabilities for security analytics. Additionally, this study compares which approach is the most viable solution to address network security issues. The researcher wants to investigate 6G cloud computing further for future work, which is addressed by centralized data centers accessed via the leading network.

## KEYWORDS

6g communication, network security, artificial intelligence, distributed ledger technology

## 1 INTRODUCTION

In the past years, we have come across several emerging technologies that have shifted the course and trends of societies, specifically in the 1980s were the first-generation cellular networks (1G) were introduced [1], and the advancement of wireless communication technologies began. From 1G to 5G, researchers and engineers in mobile networks and communication have been dedicated to enhancing the quality of the user experience [2]. Mobile networks of

the 5G are progressively being deployed worldwide, accelerating the growth of the communication sector and associated industries. According to Navarro et al., 5G technology features a high data rate, reduced latency, less energy consumption, cheaper cost, higher system capacity, and large-scale equipment connection when compared to its predecessors [4]. Porambage et al. added that the cloudification of networks with microservice-based architecture [1] is the most notable aspect of 5G. Aside from delivering a revolution, 5G also makes many parts of social and economic life increasingly intelligent [5], such as optimizing service delivery, improving decision-making, and enhancing end-user experience. However, as people rely more on 5G, security concerns are becoming more prevalent. For example, increasing reliance on power and energy infrastructure will impact the entire society's operation. Although the 5G wireless networks are yet to be thoroughly investigated, the visionaries of the 6th generation (6G) echo systems have already come into the discussion lately.

In recent years, the rapidly evolving AI technology and fast-expanding network traffic, have required a new, faster, more reliable, and flexible network structure [8]. As part of the fast-paced development of 6G, network security increasingly evolves with the development of IT technology, and the exponential rise of extensive data makes data leakage more likely for various reasons [9]. As a result, 6G is predicted to raise the threshold established by 5G communications by providing improved network security, data availability, data throughput, and seamless pervasive connectivity [10]. Helin Yang and his team anticipated that 6G would accommodate prior unimagined Internet of Everything scenarios with a wide range of complex requirements [3]. However, issues and challenges with network security in the 6G era persist, including channel modeling in complicated

situations, radio system limitations, and decreased energy consumption [4].

As 6G networks become more varied and dynamic, achieving effective resource utilization, a consistent user experience, and orchestration becomes more challenging. Providing network security, data privacy enforcement, and achieving a cost-effective strategy to rapid network implementation and extension focusing on remote and stand-alone places are also challenging as stated by Alsharif et al. [10]. Additionally, Fitzek and Peeling stated that significant technology to achieve the 6G standards is still lacking [11] even if 6G claims to deliver on many promises, it is hindered by the lack of true technologies that might significantly progress 6G technology and the requirements grow dramatically. Many researchers concluded that 6G has no underpinning technology which is difficult to come up with 6G mobile communication at this time [15] and network security must be enhanced to avoid such issues. On the other hand, Zhang et al. expected that network security in 6G enables a broad spectrum of AI services from network devices to terminal devices, transforming connected things into connected intelligence [12, 13].

Recently, artificial intelligence and distributed ledger technology techniques have demonstrated their effectiveness in various fields, including education, smart healthcare, and network security. By definition, Artificial intelligence (AI) refers to systems that help in decision-making by analyzing their environment and acting independently to achieve specific goals. Because AI encompasses different methodologies and situations, greater accuracy is essential to have meaningful and productive discussions about it [55]. The Distributed Ledger Technology (DLT) is a decentralized database that administers by various contributors across different nodes [56]. DLT may generate cooperative trust across different network entities because of its decentralization, transparency, anonymity, immutability, traceability, and robustness. As a result, 6G is expected to be merged with various sorts of slicing enabled by new technologies and paradigms [7, 12], to make the system more intelligent, flexible and safeguard the network infrastructure [2].

The importance of AI in the envisioned 6G network is immense since the 6G is intimately

associated with intelligent network orchestration and management. Since AI and DLT approaches have strong analysis and intelligent recognition capabilities [50], they can carry out performance optimization and advanced learning. However, in the study of Lu and Zheng [14], in many circumstances, 6G networks will have ultra-high throughput and ultra-wide bandwidth, posing a significant problem in applying AI and DLT in 6G. Also, Helin Yang et al. [12] also stated that 6G's development will be multi-layered, dynamic, and heterogeneous which needs to support seamless connectivity. Therefore, they suggested that a literature review considering the advancements and unanticipated issues could be useful. Specifically, Sun et al. [7] and Zhang et al. [51] stated that more fundamental works and efforts to design more robust models, safer data storage, and efficient encryption schemes should be made and done to accelerate the development of 6G. Therefore, to further analyze the network security in 6G, this study aims to identify a systematic literature review on 6G's network security using various emerging technologies and identify issues and challenges along with the proposed solutions. This paper sought to answer the following research questions:

1. What are the issues and challenges that have been identified in the 6g network?
2. What are the recent technologies that address the issues and challenges in 6g network security?
3. In the recent solution presented, which technology is the most feasible solution towards AI-enabled security in 6g networks?

## 2 METHODOLOGY

In this section, the methodology and procedures were discussed to achieve the research goals.

### 2.1 General Literature Search and Selection

Comprehensive browsing of research articles has been conducted in various online research databases such as Google Scholar, ResearchGate, IEEE Xplore, and other repositories such as arXiv and Elsevier. These databases have been utilized to discover and access journal articles, conference proceedings, surveys, and other related materials.

2.1.1 *Search keywords:* After the initial research, all relevant articles were filtered according to:

- a. *Issues and challenges:* The papers regarding network security issues and challenges were reviewed. The keywords used are: “issues on 6g, AI in 6g, security issues, and limitations of 6g”.
- b. *Recent network security solutions:* In determining the recent solution, keywords such as: “advanced network security and recent technologies on a network”.
- c. *Technology comparison:* In identifying the most suitable solution in network security, keywords used such as: “advantages of 6g in network security and AI advances network security”.

2.1.2 *Criteria:* To compile the articles, a paper was filtered based on the three criteria:

- a. The content of the paper has a piece of evidence or supported studies to prove the claims,
- b. The abstract, methodology, and discussion of the paper are clearly relevant, and
- c. All gathered articles were published less than five years ago.

## 2.2 Identifying the Challenges in Applying AI for Securing 6g Network

In organizing the data, there are patterns in identifying the issues and challenges based on the data's conciseness and reliability. Having similarities in the identified problems, the researcher grouped them to fall into one category. Additionally, research articles without related evidence or supporting documents to prove the claims are excluded from the review. All of the data are listed in a table and summarized afterward.

## 2.3 Determining Recent Technologies for Addressing the Problem in Securing 6G Network

After identifying the various issues and challenges, the researcher can further determine several solutions. With this, data collection was made by searching additional sources to identify further and investigate possible solutions. Articles gathered were filtered according to the structure and validity of the solution presented, and those articles were published in the last five years. As a result, the researcher put a table presenting the technologies together with their features and advantages.

## 2.4 Discovering Best Solutions for Securing 6G Network

In this part, all peer-reviewed articles were filtered to distinguish the best solution for network security. Using a comparison, all solutions will be evaluated according to:

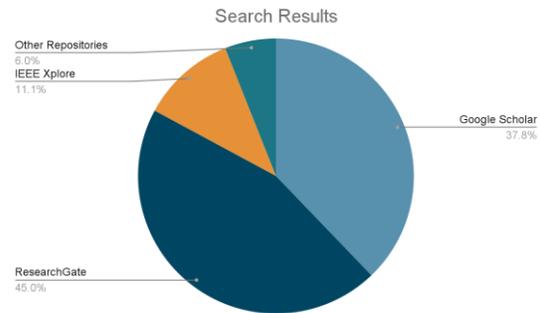
- a. Published articles from 2016 to the present,
- b. Articles presented advantages of such technologies.

As a result, a table will be presented containing the identified solution.

## 3 RESULTS AND DISCUSSION

### 3.1 Literature Search

Table 1 presents the initial process of browsing articles from different research databases using different keywords. The filtration of paper is from 2017 to 2021. The results are a mix of articles, journals, magazines, surveys, and other patent papers.



**Figure 1. Search results from the research database**

There are a lot of relevant articles, journals, surveys, and useful articles were obtained from academic sources as potential references. However, some paper was excluded from the selection and filtration procedure due to their poor quality and poor content. As a result, thirty-five articles were collected and included for the identification of issues and challenges and determining the recent solution in 6g. Table 1 shows the final tally of the selected articles.

**Table 1. The final tally of selected articles**

Source	Articles
ResearchGate	[1][10][26][27][29][30][31][32][34][35][44]

	[53][54]
Google Scholar	[20][23][25][28][33][36] [37][38][46][52]
IEEE Xplore	[19][21][22][24][32][43]
Other Repositories	[14][15][16][40][41][49]

### 3.2 Issues and Challenges Affecting AI and DLT in 6G Network Security

Despite the success of the 6G network, it may incur issues and challenges that affect the implementation of AI in 6G. To identify the issues and challenges there were twelve reliable articles collected to answer the first research question. Table 2 shows the summary of issues along with the articles.

#### 3.2.1. Higher energy efficiency

Large mobile communication networks have become a source of energy consumption across the world. 6G networks will have ultra-high throughput, ultra-wide bandwidth, and ultra-large-scale ubiquitous wireless nodes in the future, posing a significant energy consumption concern [14]. Throughput can be considerably enhanced by increasing spectrum efficiency and spectrum bandwidth, but energy efficiency issues will become more important, requiring a reduction in energy consumption per bit. The general understanding of network sensors will result in energy consumption in two ways: first, a significant number of sensors will result in high overall energy consumption; second, how to provide energy for universal deployment conveniently and effectively will be a challenge. Furthermore, 6G networks will encounter power consumption issues in the future due to massive amounts of data processing power consumption and ultra-large-scale antenna processing power consumption in the intelligent connectivity scenario. Green energy-saving communication is especially critical in light of the forthcoming 6G network's massive energy consumption demand [19, 20].

#### 3.2.2 Connection flexibility

With the development of science and technology, communication nodes, particularly those related to the Internet of Things, will be spread out across a larger area. In order to accomplish the network's connection and interaction demands anytime and anywhere, a ubiquitous Internet of Things (IoT), a universal

identification system, and universal networks will be required in the future [24]. The future communication

**Table 2. Identified Issues and Challenges in 6g**

Issues and Challenges	Brief Description	Article
Higher energy consumption	The quantity of energy required to operate a piece of electrical equipment. This is in contrast to the level of performance, which is measured by the output of power.	[14][19][20]
Connection flexibility	Connection flexibility in networks refers to the capacity to adjust network resources, such as flows or topology, to changes in design requirements. The connection flexibility serves as the foundation for creating private data networks and connects businesses to the internet.	[21][24]
Spectrum Allocation and usage rule	Spectrum allocation is the process of controlling the usage of the electromagnetic spectrum and distributing it among numerous and sometimes conflicting groups and interests.	[25][32]
Molecular communication	The presence or absence of a specific type of molecule is used to encode messages in molecular communications systems digitally. The molecules are transferred into communication mediums like air and water for transmission.	[15][22][31]
Interoperability of protocols	Interoperability of protocols is the capacity of information systems to work together, covering communication protocols, hardware, software applications, and data compatibility layer.	[16][35]

network 6G's communication objective should be to allow everyone to engage with any relevant object for valuable information at any time and from any place [21].

### 3.2.3 *Spectrum allocation and usage rule*

The development of 6G will encounter technological challenges and a slew of non-technical issues, including industrial complications, spectrum allocation, usage restrictions, and policies and regulations [25]. With such issues, 6G will penetrate all sectors of societal production and existence and be more tightly interwoven with other industries. As a result, mobile communication will no longer be limited to its industry but will need to collaborate with other companies and fields. However, some traditional businesses' fundamental behavior or benefits will create industry barriers to 6G's entry, either directly or indirectly [32].

Using the 6G terahertz band, for example, will require coordinated allocation from many governments and areas around the world. A consistent frequency range should be assigned as much as possible. Coordination with users in other sections of the spectrum, such as weather radar [25], must also be considered.

### 3.2.4 *Molecular communication*

Security and privacy issues relating to communication, authentication, and encryption processes have already been discovered. However, Farsad et al. [22] claimed that an adversary may disrupt this form of a communication channel and that just a few research have ever evaluated the safety of molecular communication lines [15, 31].

Malicious behaviors and communication mechanisms are among the security and privacy concerns raised by VLC (visible light communication). Wang and his team also stated that an attacker must be in the line of sight of the victim in order to begin an attack on an ongoing VLC operation. This would obviously make it easier for attackers to be identified [15].

### 3.2.5 *Interoperability of protocols*

Both non-terrestrial and terrestrial communication networks will be included in the 6G

network. TCP/IP protocols are utilized in terrestrial communication networks but are incompatible with non-terrestrial communication networks, such as satellite communication [16]. Because of the long transmission latency, ultra-wide bandwidth, and greater bit error rate, TCP/IP protocols have a poorer efficiency. As a result, TCP/IP protocol changes are required to handle both non-terrestrial and terrestrial communication networks efficiently. Furthermore, both types of communication networks use different protocols. In that situation, protocol interoperability will be a concern [35].

## 3.3 **Recent Solution for the Identified Problems of 6G Network Security**

There are many recent popular areas for network security that can address the issue of 6G when applied in different technologies. As a result, these technologies are the most commonly used in 6G due to their effectiveness in various fields and it is expected to be merged with various sorts of slicing enabled by new technologies and paradigms. Therefore, Table 3 presents the two emerging technologies that provide better network security and provide efficiency in terms of handling parameters.

### 3.3.1 **Distributed and Scalable AI/ML**

6G envisions autonomous networks that perform Self-X (self-configuration, self-monitoring, self-healing, and self-optimization) with minimal human involvement [44]. Ongoing specification efforts to integrate AI/ML as an integral component in future networks, such as AI/ML techniques with pervasive automation of network management operations, including security, are critical. Since AI/ML will be widely used in a distributed and large-scale system for a variety of applications, including network management, distributed AI/ML approaches are expected to enforce quick control and analytics on the massive amounts of data generated in 6G networks [1].

Additionally, AI function will be spatially pushed closer to the source of interest data for ultra-low latency, while ML functions will be distributed over the network to achieve performance advantages owing to optimized models and ensemble decision-making in 6G. Overcoming practical limits of some network parts such as computing inadequacies and sporadic connection, on the other hand, is still a work

in progress [38]. In 6G, distributed AI/ML may be employed for security at many stages of cybersecurity protection and defense. The value of AI/ML-driven cybersecurity is based on the benefits of autonomy, increased accuracy, and predictive capabilities for security analytics.

#### 3.3.1.1 Features AI/ML in 6G Network Security

a. *Distributed Intelligence* – One feature of AI is distributed intelligence. With AI, moving target defense strategies are a proactive solution that adds dynamicity to the network and makes AI-enabled attackers' learning process more difficult [1].

b. *Trusted computing enablers* - The increasing reliance on AI/ML in future networks poses the basic question of whether ML components are trustworthy. When essential network services, such as security, are managed by AI, this becomes much more of a problem. Trusted computing enablers, formal verification approaches, and integrity checks are useful tools for this.

c. *Network visibility* - Visibility is essential for controllability and accountability. More than black-box operation, security specialists and monitoring demand transparent and coherent insight into AI-based schemes. One research challenge is how to keep track of security-related AI events in real-time.

#### 3.3.2 Distributed Ledger Technology (DLT)

Blockchain has recently gotten a lot of attention as a distributed ledger technology (DLT) in the telecommunications business. Disintermediation, immutability, non-repudiation, evidence of provenance, integrity, and pseudonymity are all advantages of DLTs that are particularly significant for enabling different services on 6G networks with trust and security [40]. DLT and other data analytic technologies can be used to create new attack vectors [41]. Since data is the enabler of AI algorithms, it is critical to assure its integrity and provenance from reliable sources [43]. By enabling confidence in AI-driven systems in a multi-tenant/multi-domain environment, DLT offers the ability to guarantee the

integrity of AI data via immutable records and distributed trust amongst multiple stakeholders.

Furthermore, most present 5G service models will need to be greatly modified in order to support the role of DLT/blockchain in meeting 6G objectives. For example, safe VNF administration, secure slice brokering, automated Security SLA management, scalable IoT PKI management, and secure roaming and offloading handling can all benefit from DLT [40]. Blockchain is also a promising choice for preserving privacy in content-centric 6G networks. The usage of a shared communication channel in blockchain may allow network participants to be identified by pseudo names rather than their real names or location information.

#### 3.3.2.1 Features of DLT in 6G Network Security

a. *Secured model and data resilience* - During the learning and inference phases, models should be secure and resilient (e.g., against poisoning attacks). Blockchain [42] might be a solution for a distributed, transparent, and secure data exchange system.

b. *Enhanced Privacy* - Different machine learning approaches such as neural networks, deep learning, and supervised learning may be used to safeguard data, images, location, and communication privacy (e.g., Android, intelligent vehicles, IoT).

### 3.4 Comparison of Recent Solution

This section discussed how AI and DLT addressed the issues using different components or proposed solutions which helps in implementing better network security.

#### 3.4.1 Higher energy efficiency

6G will almost probably surpass 5G in energy efficiency, and additional energy-saving methods will be implemented [10]. The machine learning algorithms may learn about the wireless environment and choose the best configuration to get the desired results [47]. As stated by Alsharif, 6G will necessitate a comprehensive wireless communication approach that is both energy-efficient and cost-effective that will execute battery-free communications whenever and wherever feasible, with a communication

**Table 4. Components Used for AI and DLT**

Issues and Challenges	Artificial Intelligence	Distributed Ledger Technology
	Proposed Solutions	
High energy consumption	Energy-efficient wireless communication [10]	Energy harvesting techniques [54] 6G-driven multimedia data structure [53]
Connection flexibility	Big communications [10]	
Spectrum allocation and usage rule	Beamforming [46]	THz band [52]
	Spectrum sharing [48][53]	
Molecular communication	Terahertz frequencies [15,46]	
Interoperability of protocols	TCP spoofing [49]	<b>x</b>

efficiency of 1 pico-joule per bit [10]. Apart from directing beam communication using MIMO antenna arrays, 6G communication provides the advantages of high-power THz-waves, allowing devices to deliver power beams in a specific direction. Moreover, in DLT, by using a 6G-driven multimedia data structure technique, the simultaneously enhances QoS and energy consumption in 6G-based smart automation systems [53][54]. Also, energy harvesting approaches for utilizing renewable energy resources would be extremely beneficial in the development of green 6G-IoT systems.

#### 3.4.2 Connection flexibility

6G design envisions linked intelligence and employs artificial intelligence at many levels of the network structure [8]. The multi-connectivity of a device in a mesh network allows numerous base stations to analyze a device's activity using AI classification algorithms and jointly decide the authenticity using weighted average approaches as in. [1].

Both AI and DLT use Big Communication (BigCom) [19] in 6G. Since BigCom provides extensive coverage of urban and remote areas by maintaining resource balance, BigCom allows subscribers to communicate with one another with a high data rate speed. Due to the unconventional technologies adopted by 6G communication systems, it will include operational and environmental aspects and the services of the networks [10].

#### 3.4.3 Spectrum allocation & usage rule

According to Routray & Mohanty, the multiple-input and multiple-output (MIMO) allow excellent approaches to enhance spectral efficiency in 6G by using beamforming which is improved by advanced

signal processing and prominent modulation constellations [46]. In DLT, Zhao et al. stated that the THz band would be utilized in the context of 6G-based to improve spectral efficiency and transmission rates, particularly in ultra-dense heterogeneous networks with millions of users [52].

Another approach is the spectrum sharing applied in AI and DLT. Spectrum sharing can help 6G applications to meet high data rate needs since the data rate is directly related to available bandwidth [48][53].

#### 3.4.4 Molecular communication

Intelligent radio is supported by both molecular communication and THz technology. Molecular communication technology is linked to authentication, encryption, and communication security and privacy concerns with THz technology [15]. Other components used are distributed artificial intelligence and intelligent radio intersect with blockchain technology and quantum communication [46].

#### 3.4.5 Interoperability of protocols

Non-terrestrial systems include a terrestrial terminal, an aerial/space station that functions similarly to a terrestrial base station, a service link connecting the terrestrial terminal and the aerial/space station, and (a gateway that connects the non-terrestrial access network to the terrestrial access network. TCP spoofing is employed for Fast TCP full-buffer capacity. TCP multiplexing increases performance by dividing TCP sessions into numerous data flows [49]. The blockchain and distributed ledger technologies are generally safe as the last applications of the 6G network, although they may still be the target of malicious action [15].

## 4 CONCLUSION

Most network security faces different challenges where they have difficulty integrating various technologies to address the issues. This paper reviews issues and challenges in 6G network security when applied in AI and DLT. Specifically, this paper identifies the five issues in implementing recent technologies such as higher energy efficiency, connection flexibility, tactile challenges, spectrum allocation and usage rule, molecular communication, and interoperability of protocols.

Moreover, there have been many solutions to address the issues mentioned above. Recently, emerging technologies such as AI/ML and Distributed Ledger Technology seem to be the most viable solution in addressing network issues in 6G. AI/ML will be spatially pushed closer to the source of interest data for ultra-low latency, while ML functions will be distributed over the network to achieve performance advantages owing to optimized models and ensemble decision-making in 6G. Overcoming the practical limits of some network parts is still a work in progress. On the other hand, immutability, non-repudiation, evidence of provenance, integrity, and pseudonymity are advantages of DLTs that are particularly significant for enabling different services on 6G networks with trust and security.

Given the problems and solutions, a comparison of technologies was also identified to prove which technology is most suitable in 6G network security. Results show that AI/ML algorithms can be leveraged to learn the wireless environment and derive the appropriate configuration from achieving common objectives, while the DLT has still issues in solving some other areas and advanced research is needed.

## 5 FUTURE DIRECTION

Since AI is the leading technology in the 6G network, further research would still be beneficial to improve and upgrade the technology. 6G network should also consider the 6G cloud computing addressed by centralized data centers accessed via the leading network. Massive numbers of storage and processing devices near the network's edge, some of which are owned and installed by end-users, but the majority by service providers. This means that cloud services are pushed out from the network's core to the

network's edge, resulting in lower latency. Therefore, issues and challenges on cloud computing must be addressed and more research to avoid these problems in the future.

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