



(REVIEW ARTICLE)



Security schemes for the next-generation networks: A survey

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GSC Advanced Research and Reviews, 2024, 21(02), 427–455

Publication history: Received on 10 October 2024; revised on 18 November 2024; accepted on 21 November 2024

Article DOI: <https://doi.org/10.30574/gscarr.2024.21.2.0446>

Abstract

The rapid evolution of next-generation networks (NGNs), characterized by advancements such as 5G, 6G, edge computing, and the Internet of Things (IoT), has introduced unprecedented opportunities for connectivity and innovation. However, this progress has also expanded the attack surface, leading to new and complex security challenges. This paper provides a comprehensive review of state-of-the-art security schemes tailored for NGNs, emphasizing the interplay of confidentiality, integrity, availability, and privacy. Key areas explored include authentication mechanisms, end-to-end encryption, intrusion detection systems, and distributed ledger technologies. Furthermore, the role of artificial intelligence and machine learning in predicting and mitigating threats is analyzed. The paper also investigates emerging paradigms such as zero-trust architectures, quantum-resistant cryptographic algorithms, and secure network slicing. Through a critical assessment of existing frameworks and their limitations, this work proposes a unified approach that integrates adaptive security policies, decentralized trust models, and real-time threat intelligence. By addressing both technical and operational perspectives, this study aims to guide the development of resilient and secure NGNs, ensuring a sustainable digital future.

Keywords: NGNs; Security; Privacy; IoT; Architecture; Next generation networks

1. Introduction

Next-Generation Networks (NGNs), driven by technological advancements such as 5G, 6G, edge computing, and the Internet of Things (IoT), are reshaping the global communications landscape [1], [2]. As shown in Figure 1, these networks promise unparalleled connectivity, ultra-low latency, massive device density, and enhanced data rates, laying the foundation for transformative applications across industries [3], [4]. From autonomous vehicles and smart cities to remote healthcare and industrial automation, NGNs are poised to support a wide range of critical use cases. However, as these networks evolve, so do the security challenges they face.

The complexity and heterogeneity of NGNs introduce a vastly expanded attack surface. Unlike traditional networks, NGNs rely on highly distributed architectures, dynamic spectrum sharing, and virtualization technologies, such as Network Function Virtualization (NFV) and Software-Defined Networking (SDN). While these innovations enable flexibility and scalability, they also introduce new vulnerabilities that adversaries can exploit [5]. For instance, the integration of billions of IoT devices, many with limited computational and security capabilities [6], presents a significant challenge in ensuring secure communication and data integrity.

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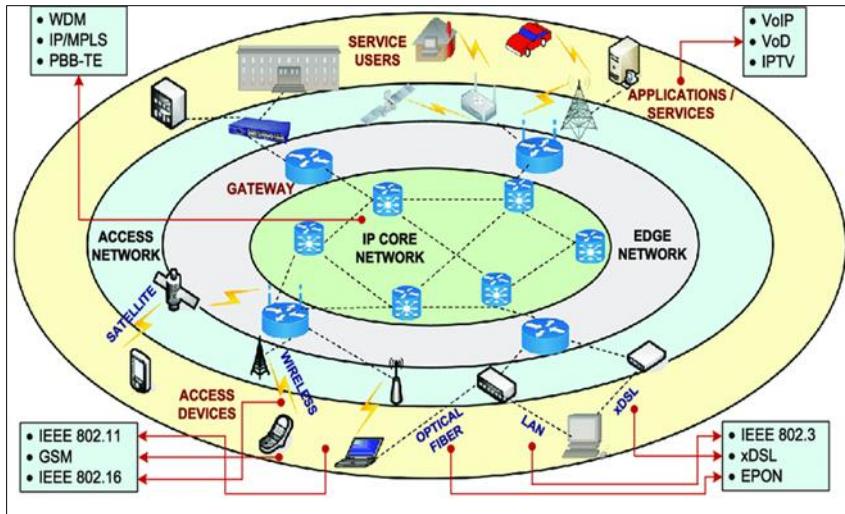


Figure 1 Next generation network

Furthermore, the convergence of physical and digital domains in NGNs amplifies the risks associated with cyber-physical systems [7], [8]. Attackers can exploit vulnerabilities to disrupt critical infrastructure, compromise sensitive data, or even endanger human lives. These risks necessitate a paradigm shift in how security is approached. Traditional, perimeter-based security measures are insufficient in an environment where devices, users, and applications interact dynamically across diverse trust domains [9]-[11]. This paper focuses on addressing the pressing need for robust and adaptive security schemes for NGNs. Current security solutions must evolve to address the unique characteristics of NGNs, including:

- *Distributed architecture*: NGNs rely on edge computing and fog networks to process data closer to the source, reducing latency but increasing the complexity of securing multiple decentralized nodes.
- *Dynamic and multi-tenant environments*: Virtualization and network slicing enable resource sharing across multiple users and applications. Ensuring isolation and preventing data leakage in such environments is a critical challenge.
- *Emerging threats*: Sophisticated attacks such as Advanced Persistent Threats (APTs), Distributed Denial-of-Service (DDoS) attacks, and quantum computing-driven cryptographic breaches require proactive and innovative countermeasures.
- *Regulatory and privacy concerns*: As NGNs become the backbone of sensitive and critical services, compliance with global data protection regulations and safeguarding user privacy are paramount.

To address these challenges, this paper provides a comprehensive analysis of existing security frameworks and emerging technologies tailored to NGNs. It explores the role of artificial intelligence (AI) and machine learning (ML) in threat detection and response, the potential of blockchain and distributed ledger technologies for decentralized trust, and the development of quantum-resistant cryptographic algorithms to future-proof NGNs.

By evaluating the strengths and limitations of current security schemes, this study aims to propose a holistic and adaptive approach to securing NGNs. The findings and recommendations presented in this paper will serve as a valuable resource for researchers, practitioners, and policymakers, guiding the development of resilient security architectures that can meet the demands of next-generation networks.

2. Architecture of next-generation networks

The architecture of NGNs represents a significant departure from traditional network designs, emphasizing flexibility, scalability, and user-centric service delivery [12]. NGNs integrate advanced technologies such as virtualization, distributed computing, and intelligent resource management to meet the demands of modern applications. Their architecture is characterized by a convergence of diverse technologies, enabling seamless integration across fixed, wireless, and mobile networks. NGNs employ a layered architecture comprising access, core, and service layers, each optimized to deliver high-speed connectivity, ultra-low latency [13], and massive device support. The access layer facilitates connectivity for end-users and IoT devices through advanced wireless technologies like 5G/6G, fiber optics, and Wi-Fi 6/7 [14]-[17]. At the core layer, NGNs utilize Software-Defined Networking (SDN) and Network Function

Virtualization (NFV) to centralize control and virtualize network functions [18], ensuring efficient resource allocation and rapid service provisioning [19]. The service layer hosts applications and services, leveraging edge computing and cloud platforms to deliver personalized, low-latency experiences.

A defining feature of NGN architecture is its reliance on network programmability, virtualization, and distributed computing [20]-[22]. SDN enables centralized management of the network control plane, while NFV decouples network functions from hardware, allowing rapid deployment of services across diverse environments [23], [24]. Additionally, network slicing enables the creation of multiple virtualized networks on a shared physical infrastructure, each tailored to specific use cases, such as autonomous vehicles or smart healthcare. Figure 2 shows the various functional units of the NGNs.

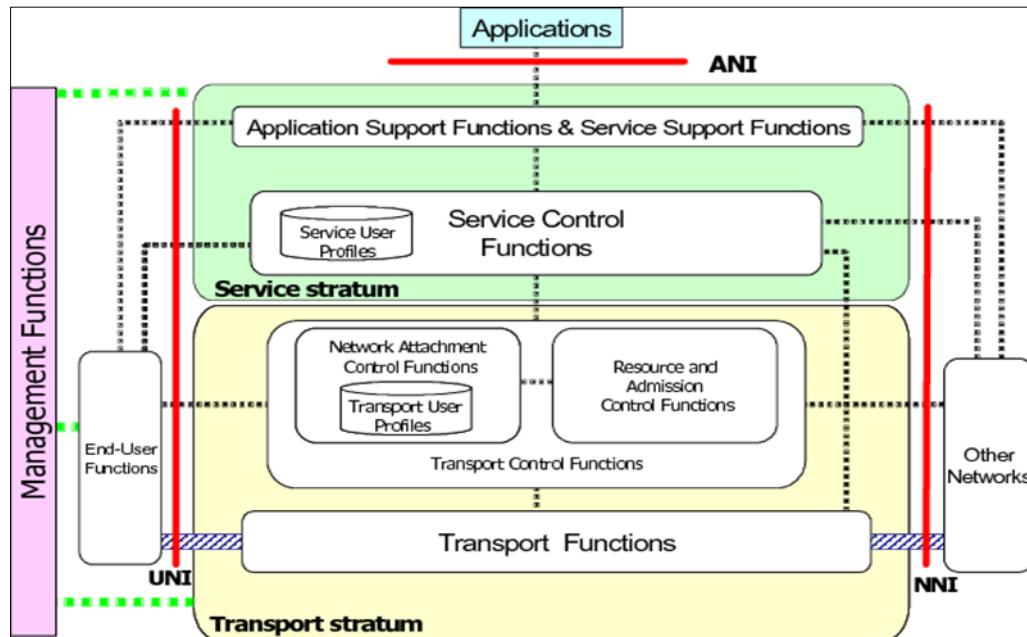


Figure 2 Overview of next generation network

Distributed edge computing nodes extend computational power [25] closer to end-users, reducing latency and bandwidth usage while enhancing data processing capabilities. Together, these components create a highly adaptable and efficient architecture, capable of supporting future innovations and the exponential growth of connected devices [26], [27]. This architecture not only underpins the evolution of communication systems but also sets the stage for smart cities, industrial automation, and other advanced applications. Table 1 provides an overview of the key components and architectural principles that define NGNs.

Table 1 NGNs key concepts

Concept	Discussion
Multi-tier architecture	<p>NGNs employ a layered and hierarchical architecture to ensure efficient resource utilization and service delivery [28]-[30]. The key tiers include:</p> <p>Core Network Layer: Acts as the backbone of the network, providing high-speed, high-capacity data transport. Utilizes technologies like Network Function Virtualization (NFV) and Software-Defined Networking (SDN) for flexibility and programmability. Supports advanced routing, traffic management, and interconnectivity with legacy and external networks.</p> <p>Edge Network Layer: Hosts edge computing nodes to process and store data closer to end-users, reducing latency.</p>

	<p>Enables localized services such as content caching, real-time analytics, and low-latency applications (e.g., augmented reality and autonomous vehicles).</p> <p>Incorporates Multi-Access Edge Computing (MEC) to support diverse access technologies.</p> <p>Access Network Layer:</p> <p>Provides the interface between end-users/devices and the network.</p> <p>Utilizes a mix of wireless (e.g., 5G/6G, Wi-Fi) and wired (e.g., optical fiber) technologies to ensure seamless connectivity.</p> <p>Supports dynamic spectrum allocation and adaptive transmission protocols for high performance [31].</p>
Virtualized and programmable infrastructure	<p>Network Function Virtualization (NFV):</p> <p>Replaces dedicated hardware appliances with software-based network functions (e.g., firewalls, load balancers) hosted on generic hardware [32], [33].</p> <p>Enables rapid deployment and scaling of network services.</p> <p>Software-Defined Networking (SDN):</p> <p>Decouples the control plane (decision-making) from the data plane (traffic forwarding) for centralized network management [34], [35].</p> <p>Facilitates dynamic configuration, traffic optimization [36], and integration with third-party applications.</p>
Network slicing	<p>Allows the creation of multiple virtual networks (slices) over a shared physical infrastructure [37], [38].</p> <p>Each slice is tailored to specific use cases with distinct requirements (e.g., ultra-low latency for autonomous vehicles, high bandwidth for video streaming).</p> <p>Enables multi-tenancy and supports various service-level agreements (SLAs).</p>
Convergence of heterogeneous technologies	<p>NGNs integrate a wide range of access and core technologies, ensuring seamless interoperability across networks [39], [40]. Key technologies include:</p> <p>Wireless Technologies: 5G/6G, Wi-Fi 6/7, and satellite communications.</p> <p>IoT Integration: Supports billions of devices through low-power, wide-area networks (e.g., NB-IoT, LoRaWAN).</p> <p>Fixed Networks: High-speed optical fiber for backhaul and fronthaul connectivity.</p>
Intelligence and automation	<p>Artificial Intelligence (AI) and Machine Learning (ML)</p> <p>Enable intelligent resource allocation, traffic prediction, anomaly detection [42], and self-healing capabilities.</p> <p>Autonomous Networks</p> <p>Employ closed-loop automation for real-time monitoring and decision-making (e.g., self-optimizing networks).</p>
Security and privacy mechanisms	<p>Zero-Trust Architecture</p> <p>Ensures that every device, user, and application is continuously authenticated and authorized before granting access [43]-[46].</p> <p>End-to-End Encryption</p> <p>Protects data integrity and confidentiality across the entire communication pathway [47].</p> <p>Quantum-safe cryptography</p> <p>Prepares for the advent of quantum computing by adopting cryptographic algorithms resistant to quantum attacks [48].</p>
Service-Oriented Architecture (SOA)	<p>Focuses on delivering user-centric services rather than infrastructure-centric management [49].</p> <p>Employs APIs and microservices to enable modular, scalable, and reusable service components.</p>

	Supports diverse applications, including enhanced mobile broadband (eMBB), ultra-reliable low-latency communication (URLLC), and massive machine-type communication (mMTC) [50].
Sustainability and energy efficiency	Integrates green technologies such as renewable energy-powered base stations and energy-efficient protocols [51], [52]. Optimizes resource utilization through intelligent traffic management and adaptive load balancing.

The architecture of NGNs is built on the principles of flexibility, scalability, and intelligence to meet the diverse and dynamic requirements of modern applications [53]. By leveraging advancements in virtualization, distributed computing, AI, and secure communication, NGNs provide a robust foundation for the digital transformation of industries and society [54]-[56]. This architectural framework ensures seamless connectivity, high performance, and resilience, enabling a wide range of use cases for the future digital ecosystem.

3. Security issues in next generation networks

The NGNs bring transformative capabilities, including ultra-low latency, high bandwidth, and massive connectivity. However, the same features that make NGNs revolutionary also introduce significant security challenges. As these networks become integral to critical infrastructures and everyday life, addressing security concerns is paramount to ensure their reliability, privacy, and resilience [57]. Table 2 explores the key security issues in NGNs, focusing on their sources, and implications.

Table 2 Key security issues in NGNs

Security issue	Details
Increased attack surface	<p>Massive device connectivity NGNs, particularly through IoT, support billions of interconnected devices, many with minimal or no built-in security features [58]-[60]. Compromised IoT devices can serve as entry points for attacks like Distributed Denial-of-Service (DDoS) or data breaches [61], [62].</p> <p>Heterogeneous network environment The integration of various access technologies (5G/6G, Wi-Fi, satellite, etc.) creates a complex ecosystem with diverse vulnerabilities [63]. Securing all interfaces and ensuring seamless handovers between technologies remain significant challenges.</p>
Vulnerabilities in virtualized and programmable infrastructure	<p>Network Function Virtualization (NFV) NFV decouples network functions from dedicated hardware, making them vulnerable to software-based attacks, such as malware and rootkits [64], [65]. Multi-tenancy in virtualized environments raises risks of side-channel attacks and resource exploitation.</p> <p>Software-Defined Networking (SDN) The centralization of the control plane in SDN creates a single point of failure [66]. An attacker compromising the SDN controller can gain control over the entire network.</p> <p>Network Slicing While network slicing allows multiple virtual networks to coexist, a breach in one slice could potentially affect others, particularly if isolation mechanisms are inadequate [67].</p>
Sophistication of cyber threats	<p>Advanced Persistent Threats (APTs) NGNs' critical role in industries and national infrastructure makes them prime targets for state-sponsored and highly sophisticated attacks [68], [69].</p>

	<p>APTs are stealthy, persistent, and capable of exfiltrating sensitive information over long periods.</p> <p>DDoS attacks</p> <p>The higher bandwidth and interconnected nature of NGNs amplify the potential impact of DDoS attacks [70], which can disrupt critical services such as healthcare and emergency communication.</p> <p>Zero-day exploits</p> <p>The rapid deployment of new technologies in NGNs may introduce unknown vulnerabilities, creating opportunities for zero-day exploits [71].</p>
Privacy Concerns	<p>Data collection and surveillance</p> <p>NGNs process vast amounts of sensitive user data, including location, health, and financial information [72].</p> <p>Unauthorized access to this data can lead to breaches of privacy and regulatory violations [73].</p> <p>Data sharing across domains</p> <p>NGNs enable cross-domain services, where data flows between multiple providers. Ensuring data protection across these domains is complex and requires robust policies [74].</p> <p>AI-driven inference attacks</p> <p>Malicious actors can use AI and machine learning to analyze network traffic and infer sensitive information about users or organizations [75].</p>
Emerging threats from quantum computing	<p>Cryptographic vulnerabilities</p> <p>Quantum computing poses a threat to traditional encryption algorithms, such as RSA and ECC, used in NGNs [76], [77].</p> <p>Without quantum-resistant cryptography, NGNs risk exposure to future decryption of encrypted data.</p>
Edge computing and distributed architecture	<p>Edge node vulnerabilities</p> <p>Edge computing nodes process and store data closer to users but are often less secure than centralized data centers [78].</p> <p>Attacks on edge nodes can disrupt services or compromise sensitive data [79].</p> <p>Inter-edge communication risks</p> <p>As edge nodes communicate with each other and the core network, securing these interactions against tampering and eavesdropping is critical [80].</p>
Insider threats	<p>Compromised trusted entities</p> <p>Insider threats, whether intentional or accidental, remain a significant concern in NGNs [81], especially in multi-tenant environments where administrators manage shared infrastructure.</p> <p>Access control failures</p> <p>Inadequate or poorly implemented access control policies can lead to unauthorized data access and privilege escalation [82].</p>
Trust management	<p>Lack of a unified trust framework</p> <p>The diverse components of NGNs require interoperable trust mechanisms [83] to ensure secure interactions between devices, users, and networks.</p> <p>Current trust frameworks are often fragmented, leading to potential vulnerabilities.</p> <p>Fake base stations and spoofing</p> <p>Attackers can set up fake base stations to intercept communications [84], disrupt services, or distribute malware.</p>
Threats to critical infrastructure	Cyber-Physical Systems (CPS)

	<p>NGNs underpin critical infrastructures like smart grids, transportation, and healthcare systems [85]. Attacks on these systems can have catastrophic consequences.</p> <p>Ensuring the security of both physical and digital components is a complex challenge.</p> <p>Service disruption</p> <p>The reliance on NGNs for essential services makes them attractive targets for attackers [86] seeking to cause widespread disruption.</p>
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NGNs' advanced capabilities come with complex security challenges, requiring a holistic and adaptive approach. By addressing vulnerabilities in architecture, protecting user privacy, and preparing for future threats like quantum computing, NGNs can be secured against evolving risks.

4. Current security solutions for next generation networks

The NGNs encompass advanced technologies such as 5G, 6G, edge computing, and the Internet of Things (IoT). As shown in Figure 3, 5G provides the foundation with ultra-high-speed data rates, low latency, and massive device connectivity, making it ideal for real-time applications like autonomous vehicles and smart healthcare [87]–[89]. Building on this, 6G envisions even faster data transmission, AI-driven network optimization, and advanced use cases such as holographic communication and brain-computer interfaces [90]. Edge computing complements these networks by processing data closer to the source, reducing latency, conserving bandwidth, and supporting time-sensitive applications. Meanwhile, the IoT connects billions of devices, from sensors and wearables to industrial machines, facilitating smart environments and pervasive connectivity [91], [92]. Together, these technologies form a cohesive ecosystem in NGNs, delivering unprecedented capabilities to meet the demands of future digital transformation.

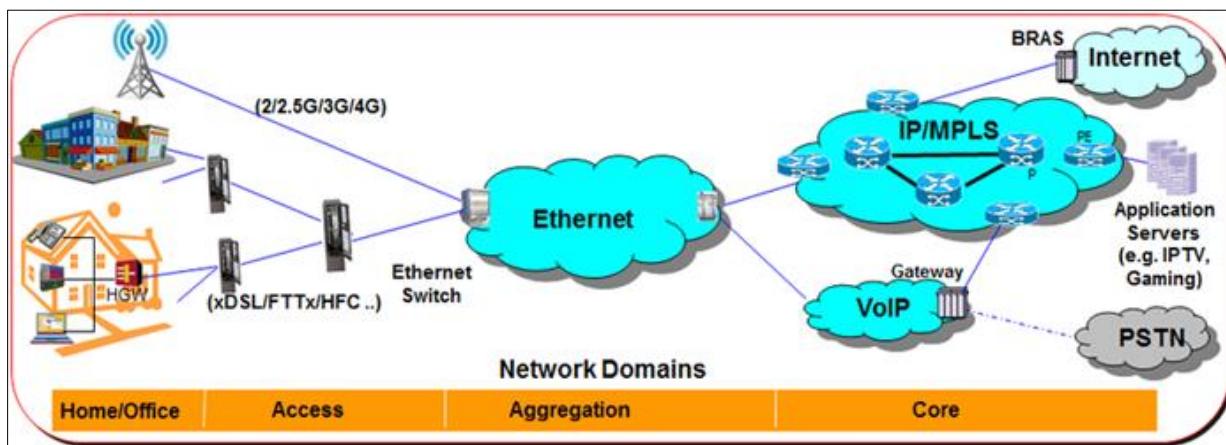


Figure 3 Technologies in NGNs

Securing these networks requires innovative solutions tailored to address their unique characteristics and vulnerabilities. Table 3 provides an extensive discussion of the current security solutions being implemented or developed to safeguard NGNs, emphasizing their capabilities, applications, and limitations.

Table 3 Current security solutions

Solution	Example	Explanation
Authentication mechanisms	Authentication is fundamental to securing NGNs by ensuring that only authorized entities can access network resources [93].	
	<i>Multi-Factor Authentication (MFA)</i>	Combines multiple forms of verification (e.g., passwords, biometrics, and device authentication) to enhance security [94], [95].

		Addresses vulnerabilities of single-factor authentication by requiring multiple proofs of identity. Used in access control for NGN devices, especially in IoT and edge environments.
	<i>Mutual authentication</i>	Ensures that both parties in communication verify each other's identities [96], [97]. Particularly useful in securing connections between edge nodes and core networks.
	<i>Public Key Infrastructure (PKI)</i>	Employs digital certificates to authenticate devices and users [98], [99]. Widely used in NGNs for secure communication, especially in IoT ecosystems.
Encryption technologies	Encryption ensures data confidentiality and integrity during transmission and storage in NGNs [100].	
	<i>End-to-End Encryption (E2EE)</i>	Protects data from being accessed by unauthorized parties throughout its journey [101]. Ensures secure communication for services like voice over IP (VoIP), messaging, and video streaming.
	<i>Quantum-Resistant Cryptography</i>	Emerging solutions such as lattice-based, hash-based, and multivariate cryptography address threats posed by quantum computing [102], [103]. Designed to replace traditional encryption algorithms (e.g., RSA, ECC) vulnerable to quantum attacks.
	<i>Lightweight Cryptography</i>	Tailored for resource-constrained devices [104] in IoT environments. Algorithms like SPECK, SIMON, and ChaCha20 provide strong encryption with low computational overhead [105], [106].
Secure network slicing	Network slicing allows the creation of multiple virtual networks, each with tailored security measures [107].	
	<i>Slice isolation</i>	Enforces strict separation between network slices to prevent lateral movement of attacks [108]. Achieved through virtualization technologies such as hypervisors and container-based solutions.
	<i>Slice-specific security policies</i>	Each slice is provisioned with unique security configurations [109] based on its use case (e.g., high priority for healthcare, low latency for autonomous vehicles).
Intrusion Detection and Prevention Systems (IDPS)	IDPS monitor NGN traffic for malicious activities [110] and take action to mitigate threats.	
	<i>AI-powered IDPS</i>	Leverage machine learning algorithms to identify patterns of known and unknown attacks [111]. Effective in detecting anomalies and advanced persistent threats (APTs) in real time.
	<i>Distributed IDPS</i>	Deployed at edge nodes and core networks to provide multi-layered monitoring and defense [112]. Ensures low-latency threat detection close to data sources.
Artificial Intelligence (AI) and Machine Learning (ML)	AI and ML are central to NGN security due to their ability to analyze massive data volumes and adapt to evolving threats [113].	

	<i>Threat prediction</i>	ML models trained on historical data predict potential attack vectors and vulnerabilities [114]. Proactively identifies weak points in network configurations and traffic flows.
	<i>Dynamic resource allocation</i>	AI-driven mechanisms allocate network resources [115] based on security needs, such as enhancing bandwidth for critical services under attack.
Blockchain and Distributed Ledger Technology (DLT)	Blockchain ensures secure and tamper-proof transaction records, enhancing trust in NGNs [116].	
	<i>Decentralized identity management</i>	Blockchain enables secure authentication and identity verification without centralized authorities [117]. Suitable for multi-party environments like IoT ecosystems.
	<i>Secure data sharing</i>	Facilitates transparent and verifiable data exchanges among stakeholders while maintaining data integrity [118].
Secure edge computing		Edge computing processes data closer to the source, reducing latency but introducing new security risks [119].
	<i>Trusted Execution Environments (TEEs)</i>	Hardware-based isolation for secure data processing at edge nodes. Protects sensitive computations [120] and keys from unauthorized access.
	<i>Edge-specific firewalls</i>	Distributed security models where edge nodes collaborate to detect and mitigate threats [121].
	<i>Decentralized security mechanisms</i>	Distributed security models where edge nodes collaborate to detect and mitigate threats [122].
Zero-trust security model	Zero-trust architecture assumes no implicit trust within the network and verifies every access request [123].	
	<i>Micro-segmentation</i>	Divides the network into smaller zones, each with its own access policies [124]. Limits the movement of attackers within the network.
	<i>Continuous monitoring and validation</i>	Real-time validation of user and device [125] behaviors ensures ongoing compliance with security policies.
Advanced DDoS mitigation techniques	NGNs are vulnerable to Distributed Denial-of-Service (DDoS) attacks due to their high bandwidth and interconnected nature [126].	
	<i>AI-based traffic analysis</i>	AI tools differentiate between legitimate traffic and DDoS attacks based on behavioral patterns [127]. Enables dynamic rerouting and traffic shaping to mitigate attacks.
	<i>Cloud-based DDoS protection</i>	Offloads traffic to cloud-based solutions [128] for scrubbing before forwarding legitimate traffic to the NGN.
Privacy-preserving technologies	With increasing data privacy concerns, solutions focus on protecting user data without compromising functionality [129], [130].	
	<i>Differential privacy</i>	Adds noise to data analytics outputs to prevent reverse engineering of sensitive information [131]. Used in NGNs for statistical analysis without compromising user privacy.

	<i>Homomorphic encryption</i>	Allows computations on encrypted data without decrypting it [132]. Ensures data confidentiality during processing in NGNs.
	<i>Data minimization techniques</i>	Restrict data collection to the bare minimum required for functionality, reducing exposure risks [133], [134].
Resilient infrastructure	NGNs employ redundancy and self-healing mechanisms to ensure availability even under attack [135], [136].	
	<i>Redundant architectures</i>	Multiple backup systems and alternate communication paths enhance network resilience [137].
	<i>Self-healing networks</i>	AI-driven networks detect faults and automatically reroute traffic or deploy patches [138].

As shown in Figure 4, current security solutions for NGNs leverage cutting-edge technologies such as AI, blockchain, and zero-trust models to address unique vulnerabilities. AI enhances NGNs by enabling real-time threat detection, predictive maintenance, and intelligent resource management [139], [140]. Machine learning algorithms analyze vast amounts of network data to identify anomalies and mitigate threats like Distributed Denial-of-Service (DDoS) attacks, while deep learning models [141] optimize traffic routing and load balancing. AI also facilitates the automation of network operations, allowing NGNs to adapt dynamically to changing conditions and demands. For instance, AI-driven intrusion detection systems not only recognize known attack patterns [142] but also anticipate emerging threats, making NGNs resilient against sophisticated cyberattacks.

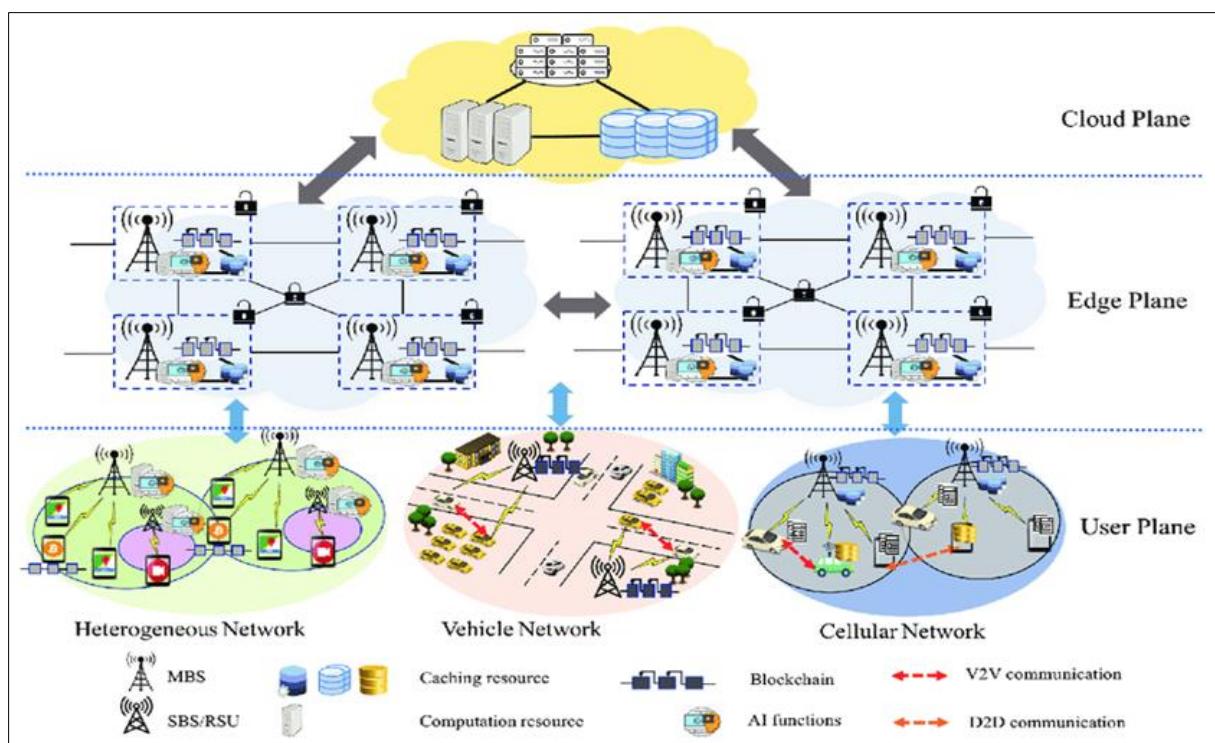


Figure 4 Solutions to NGNs security issues

Blockchain introduces a decentralized and tamper-proof framework for securing NGNs. Its distributed ledger technology ensures data integrity and enhances trust among stakeholders, making it particularly valuable in multi-tenant environments like IoT ecosystems [143]-[146]. Blockchain can securely manage identities, enforce access controls, and facilitate transparent data sharing across devices and networks. For example, smart contracts can automate and enforce security policies in network slicing, ensuring compliance without human intervention. Complementing these technologies, the zero-trust security model addresses the fundamental vulnerabilities of traditional perimeter-based defenses [147], [148]. By assuming no implicit trust within the network, zero-trust enforces strict identity verification and continuous monitoring of all entities, regardless of their location. Micro-segmentation

and dynamic access controls prevent lateral movement of attackers [149], safeguarding NGNs against insider threats and breaches. Together, AI, blockchain, and zero-trust models establish a robust and adaptive security foundation for NGNs, ensuring reliability and trustworthiness in increasingly complex and interconnected environments. While these solutions provide robust defenses against a wide range of threats, continuous innovation and adaptation are required to meet the evolving challenges of NGNs.

5. Research gaps and future research direction is next generation networks security

While significant progress has been made in securing NGNs, several research gaps persist due to the complexity and evolving nature of these networks. Addressing these gaps is critical for enhancing security, ensuring resilience, and enabling the full potential of NGNs. Table 4 and Table 5 present some key research gaps and proposed future research directions in NGN security, respectively.

Table 4 Research gaps

Gap	Description
Lack of comprehensive security frameworks	Existing security solutions often focus on specific aspects of NGNs (e.g., IoT, SDN) but fail to address security holistically across the entire ecosystem [150]. The absence of a unified, end-to-end security framework [151] that integrates access, edge, core, and application layers is a significant gap.
Insufficient real-time threat detection	While AI and ML-based systems have shown promise in detecting threats [152], their effectiveness in real-time, dynamic NGN environments is limited by: Scalability challenges with large datasets. The inability to quickly adapt to new, sophisticated attack vectors. Current intrusion detection systems struggle to provide actionable insights during zero-day attacks [153]-[156].
Inadequate quantum-resistant cryptographic solutions	Although research in quantum-resistant cryptography is progressing [157], practical implementations of these algorithms in NGNs remain scarce. Existing cryptographic methods may not meet the performance requirements of NGNs, particularly in latency-sensitive applications [158] like autonomous vehicles.
Privacy challenges in cross-domain data sharing	NGNs require seamless data sharing across domains (e.g., healthcare, transportation), but ensuring privacy during such exchanges is complex [159]. Current privacy-preserving techniques, such as differential privacy and homomorphic encryption, are computationally intensive and may not scale efficiently [160], [161].
Vulnerabilities in edge computing	Edge computing nodes are more susceptible to physical and cyber threats due to their distributed and resource-constrained nature [162]-[166]. Research on lightweight yet robust security solutions for edge devices is still in its infancy.
Network slicing security	Network slicing introduces vulnerabilities related to slice isolation, tenant data leakage, and misconfigured policies [167], [168]. Comprehensive solutions for securing multi-tenant environments and enforcing slice-specific policies are lacking.
Lack of trust models for heterogeneous environments	NGNs integrate diverse technologies and devices, making it challenging to establish and maintain trust across the ecosystem [169], [170]. Existing trust models do not fully address issues like dynamic device behavior and multi-vendor environments.
DDoS attack mitigation challenges	The scale and sophistication of Distributed Denial-of-Service (DDoS) attacks targeting NGNs surpass the capabilities of many existing defence mechanisms [171], [172].

	There is a need for scalable and proactive solutions that can effectively mitigate such attacks without disrupting legitimate traffic.
Inadequate security metrics and benchmarks	The absence of standardized security metrics and benchmarks makes it difficult to evaluate and compare the effectiveness of different security solutions in NGNs [173], [174]. This gap hinders the development of universally accepted best practices.

The future of Next-Generation Networks depends on robust, scalable, and adaptive security mechanisms. For instance, Artificial Intelligence (AI) and Machine Learning (ML) are transformative technologies in the evolution of Next-Generation Networks (NGNs), playing a crucial role in optimizing performance, enhancing security, and enabling automation. AI and ML empower NGNs to process massive volumes of data generated by devices, users, and applications, enabling real-time decision-making and dynamic network management [175], [176]. For example, ML algorithms can predict traffic patterns and dynamically allocate resources to ensure consistent Quality of Service (QoS) for latency-sensitive applications like autonomous vehicles and telemedicine. Additionally, AI-driven automation in Software-Defined Networking (SDN) and Network Function Virtualization (NFV) enables NGNs to adapt to changing demands without human intervention, reducing operational costs and improving efficiency [177], [178].

In the realm of security, AI and ML enhance NGNs by proactively detecting and mitigating threats. As shown in Figure 5, advanced ML models can identify anomalies in network traffic, recognize patterns of known attacks, and even detect zero-day vulnerabilities through behavioral analysis [179]-[182]. These technologies also play a pivotal role in threat prediction and prevention, using historical data to forecast potential attack vectors and vulnerabilities.

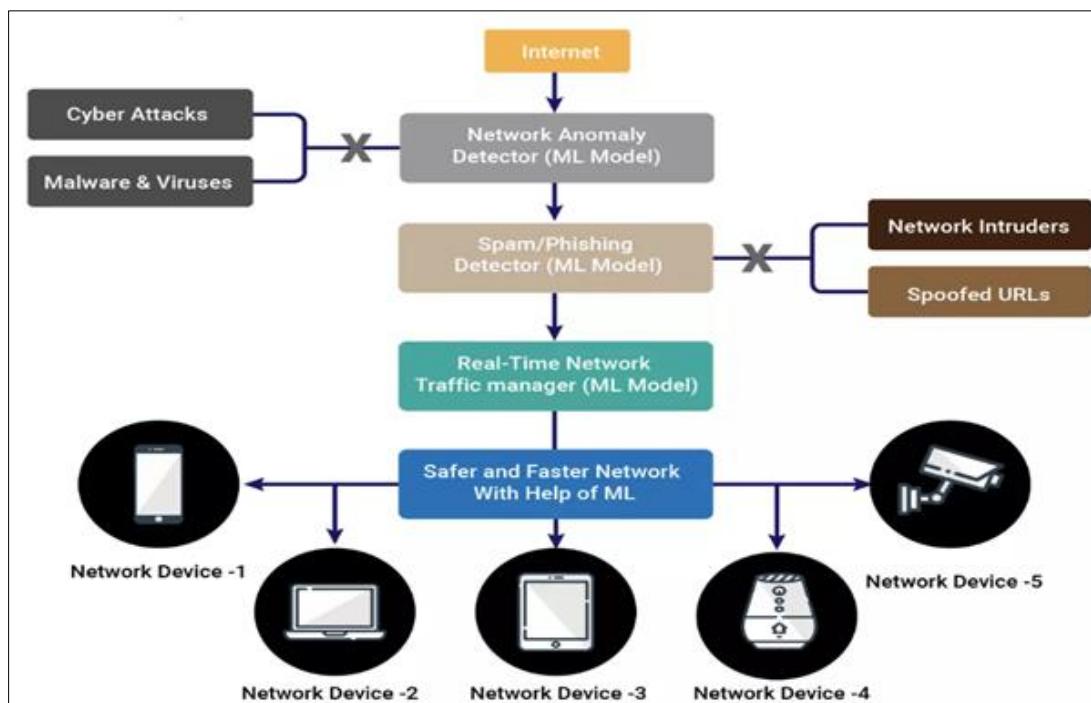


Figure 5 AI and ML for enhanced NGNs security

Moreover, AI-powered systems support edge computing by enabling distributed intelligence, where edge nodes process data locally and make autonomous decisions, reducing latency and enhancing responsiveness [183], [184]. The integration of AI and ML into NGNs creates intelligent, resilient, and adaptive networks capable of meeting the growing demands of future applications while maintaining robust security and reliability [185]. Securing edge computing in NGNs is critical due to its decentralized nature and proximity to end-users, which increase its vulnerability to cyber threats [186]. Edge devices shown in Figure 6 often operate in resource-constrained environments and are geographically dispersed, making them prime targets for attacks like Distributed Denial-of-Service (DDoS), data breaches, and physical tampering [187]-[190]. To address these challenges, robust security measures such as Trusted Execution Environments (TEEs) are employed to provide hardware-based protection for sensitive data and computations.

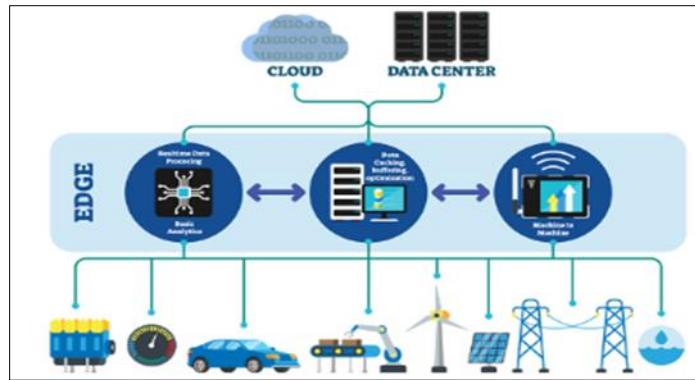


Figure 6 Edge computing in NGNs

Lightweight encryption protocols and authentication mechanisms tailored for edge devices ensure secure communication between the edge and core network [191], [192]. Additionally, decentralized security models, such as blockchain, enhance trust by enabling tamper-proof data integrity and transparent access control [193], [194]. AI and machine learning further fortify edge computing by enabling real-time threat detection and autonomous mitigation at the edge nodes [195]. These combined strategies ensure that edge computing remains a secure and reliable enabler of NGN services, from IoT applications to real-time analytics. Figure 7 shows network slicing in next generation networks.

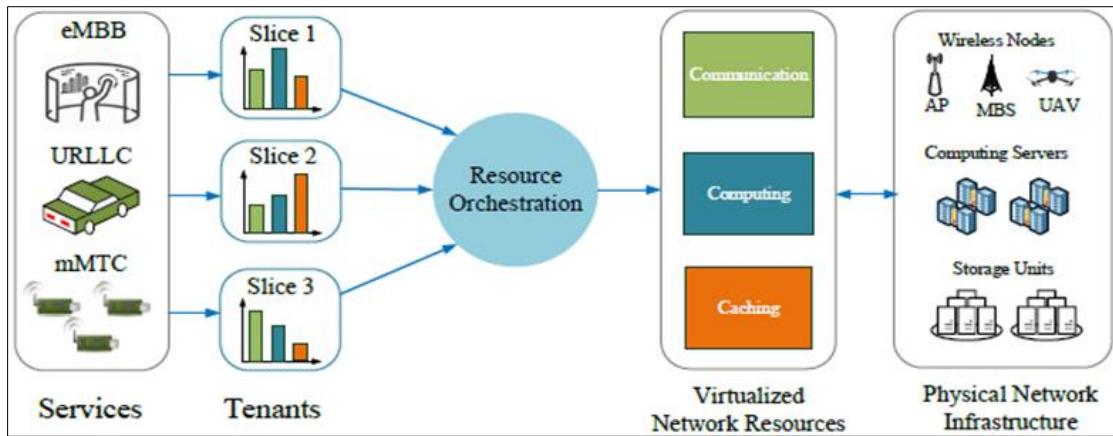
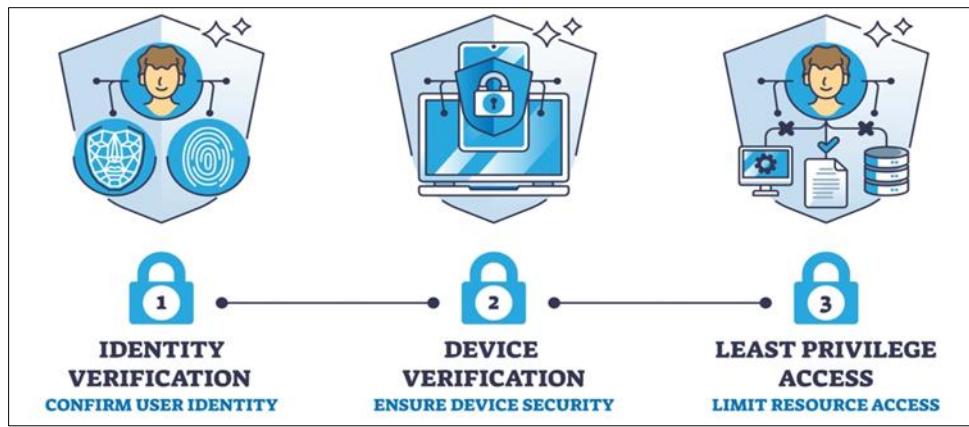


Figure 7 Network slicing in NGNs

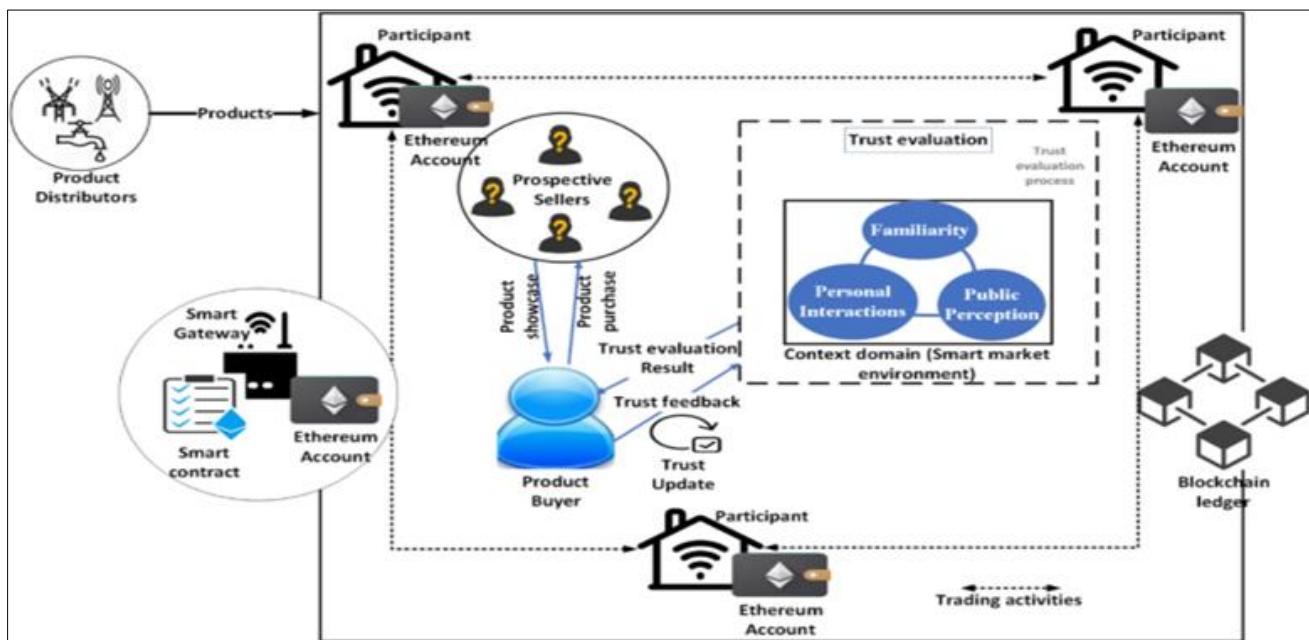
Enhancing network slicing security in NGNs is crucial for safeguarding the tailored virtual networks that cater to diverse use cases, such as healthcare, autonomous vehicles, and smart cities [195], [196]. Network slices, being logically isolated, face challenges like tenant data leakage [197], misconfiguration, and cross-slice attacks. To mitigate these risks, advanced slice isolation mechanisms are implemented to prevent lateral movement of threats between slices [198]. Dynamic policy enforcement ensures that security configurations for each slice are consistently maintained and adapted to its specific requirements. Additionally, blockchain technology can enhance transparency and trust by managing slice-specific identities and access controls in a decentralized manner [199]-[201]. AI and machine learning also play a vital role, enabling real-time monitoring of slices to detect anomalies [202] and automatically mitigate threats. By integrating these technologies, NGNs can maintain robust security across all network slices, ensuring the reliability and privacy of critical applications.

Trust management is a cornerstone of security in NGNs, given their complex and heterogeneous environments that integrate diverse devices, users, and technologies [203]-[205]. Figure 8 presents a typical zero trust model. With the proliferation of IoT devices, cloud services, and edge computing nodes, traditional trust models relying on static credentials or centralized authorities are no longer adequate [206].

**Figure 8** Zero trust model

NGNs require dynamic and distributed trust management systems capable of evaluating trustworthiness in real-time. This involves assessing the behavior of devices, users, and network components based on multiple parameters, such as past interactions, compliance with policies, and environmental context. By leveraging AI and machine learning [207], NGNs can establish behavior-based trust scoring systems that continuously adapt to the dynamic conditions of the network, enabling rapid identification of malicious entities.

As shown in Figure 9, blockchain technology is emerging as a powerful tool for decentralized trust management in NGNs [208]. Its distributed ledger ensures tamper-proof recording of transactions, making it ideal for managing trust across diverse and untrusted entities [209]-[211]. For instance, blockchain can be used to securely validate device identities in IoT networks, ensuring only authorized devices participate in communications [212]. Additionally, smart contracts can automate trust-related functions, such as access control and policy enforcement, without relying on centralized systems.

**Figure 9** Blockchain-based trust management

Combining blockchain with zero-trust security principles further strengthens NGNs by ensuring that no entity, regardless of its location or role, is inherently trusted [213], [214]. Together, these technologies enable NGNs to achieve robust and scalable trust management, fostering secure and reliable interactions in increasingly interconnected ecosystems. As illustrated in Figure 10, Distributed Denial-of-Service (DDoS) attacks are serious security challenges in NGNs. Mitigating DDoS attacks in NGNs is critical due to the increasing scale and sophistication of such threats [215].

[216]. NGNs leverage technologies like AI and machine learning [217] to detect and respond to anomalous traffic patterns in real time, enabling proactive mitigation before attacks overwhelm the network.

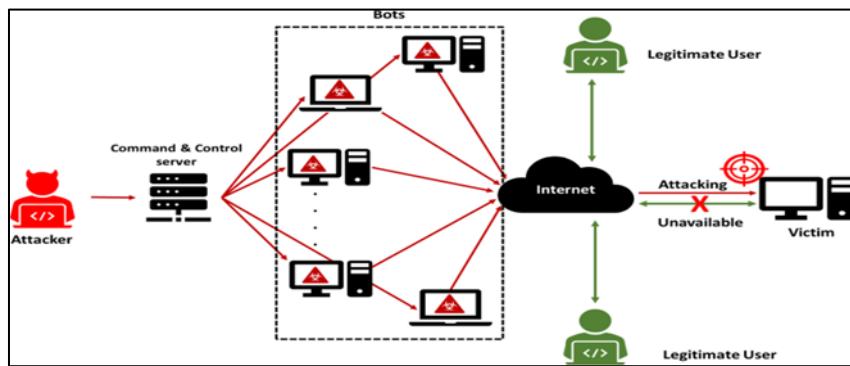


Figure 10 Distributed Denial-of-Service in NGNs

These systems analyze traffic behavior to distinguish between legitimate and malicious flows, even in large-scale attacks [218], [219]. Network Function Virtualization (NFV) and Software-Defined Networking (SDN) enhance DDoS defense by dynamically reallocating resources, rerouting traffic, and deploying virtualized security functions where needed [220], [221].

Table 5 Future research scopes

Scope	Explanation
Development of holistic security architectures	Design end-to-end security frameworks [222] that integrate access, edge, core, and application layers. Incorporate adaptive mechanisms to respond to emerging threats dynamically [223].
Advancing AI and ML for proactive security	Develop AI and ML models capable of: Detecting and mitigating zero-day threats [224] in real time. Handling large-scale, heterogeneous NGN traffic without significant computational overhead. Focus on explainable AI (XAI) to provide transparency [225] and trust in automated decision-making processes.
Quantum-resistant and post-quantum cryptography	Conduct large-scale testing and deployment of quantum-resistant cryptographic algorithms in NGN environments [226]. Explore hybrid cryptographic solutions [227] that combine classical and quantum-resistant algorithms during the transition to quantum-secure networks.
Privacy-preserving data sharing	Develop efficient privacy-preserving techniques tailored for NGN applications, such as federated learning for decentralized data analysis [228], [229]. Explore novel methods, such as secure multi-party computation (SMPC) [230], for cross-domain collaborations.
Securing edge computing	Investigate lightweight security protocols optimized for edge nodes with limited resources [231], [232]. Focus on self-healing mechanisms for edge nodes [233] to recover quickly from cyberattacks or failures.
Enhancing network slicing security	Design advanced isolation techniques to prevent lateral movement between slices [234], [235]. Develop automated policy enforcement mechanisms to ensure slice-specific security configurations are accurately implemented.

Trust management in heterogeneous environments	Research blockchain-based decentralized trust models [236] for managing diverse entities in NGNs. Incorporate behavior-based trust scoring systems to adapt to dynamic changes in device and user behavior.
Advanced DDoS mitigation techniques	Explore AI-driven adaptive mitigation strategies [237] capable of distinguishing between legitimate and malicious traffic in real time. Investigate distributed and collaborative DDoS defense mechanisms leveraging edge nodes [238].
Sustainability in security	Develop energy-efficient security mechanisms to align with the sustainability goals of NGNs [239]-[242]. Explore the trade-offs between security, performance, and energy consumption in resource-constrained environments.
Standardization and benchmarks	Collaborate with international organizations to establish standardized security metrics and testing protocols for NGNs. Promote the development of open-source tools and frameworks for benchmarking security solutions [243]-[245].

At the edge, edge computing nodes play a vital role by filtering malicious traffic closer to its source, reducing the load on core infrastructure. Additionally, blockchain-based decentralized defense mechanisms are emerging as a means to enhance collaboration among distributed nodes, enabling more effective identification and blocking of malicious traffic [246]. Basically, mechanisms offer robust solutions for securing next-generation networks by enabling trustless, transparent, and tamper-resistant environments. These mechanisms distribute network security responsibilities across multiple nodes, reducing single points of failure and enhancing resilience against cyberattacks [247]. Smart contracts can automate threat detection and mitigation, ensuring faster response times without requiring centralized control. Additionally, blockchain ensures the integrity of data and logs, enabling effective auditing and forensic analysis for improved cybersecurity [248]. These combined strategies ensure NGNs remain resilient against DDoS attacks, safeguarding critical applications and services.

6. Conclusion

Next-generation networks are poised to transform communication systems by offering unprecedented capabilities, including ultra-low latency, massive connectivity, and enhanced bandwidth. However, these advancements come with complex security challenges that threaten the confidentiality, integrity, and availability of NGN infrastructures. Addressing these challenges is critical as NGNs become the backbone of critical services across healthcare, transportation, smart cities, and industrial automation. This paper has examined the security landscape of NGNs, highlighting key issues such as increased attack surfaces, vulnerabilities in virtualized environments, privacy concerns, and emerging threats like quantum computing. Existing security solutions, including AI-driven intrusion detection systems, blockchain for decentralized trust, and advanced cryptographic techniques, were explored for their potential to mitigate these risks. Despite these advancements, significant research gaps remain, such as the need for holistic security architectures, scalable threat detection mechanisms, and quantum-resistant cryptographic implementations. Future research must focus on developing comprehensive, adaptive, and sustainable security frameworks that can scale with the dynamic and heterogeneous nature of NGNs. Emphasis should be placed on integrating privacy-preserving technologies, trust management models, and proactive defense mechanisms to ensure resilience against evolving threats. Additionally, global collaboration among academia, industry, and regulatory bodies is essential to establish standardized practices and benchmarks, fostering a secure and interoperable NGN ecosystem.

Compliance with ethical standards

Disclosure of conflict of interest

The author declares that she holds no conflict of interest.

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