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Revolutionizing Telecom with AI and ML: Navigating the Challenges, Seizing the Opportunities

Santhosh Pininti

Electrical Engineering, IIT Kanpur, Kanpur, India, 208016

ABSTRACT

The telecommunications industry is undergoing a profound transformation driven by the integration of Artificial Intelligence (AI) and Machine Learning (ML), significantly influencing both customer satisfaction and operational efficiency. This analysis explores the dual impact of AI and ML, highlighting the opportunities they offer alongside the challenges they introduce.

On the positive side, AI and ML enhance telecommunications by enabling intelligent customer service, network optimization, and predictive analytics. Real-time data analysis empowers telecom operators to improve service quality, reduce downtime, and anticipate network congestion. AI-powered chatbots and virtual assistants provide 24/7 customer support, resulting in faster response times and improved user experience. Additionally, AI-driven analytics allow companies to personalize services based on individual preferences, increasing customer loyalty and unlocking new revenue streams.

However, the adoption of AI and ML is not without its challenges. Integrating these technologies into existing telecom infrastructure demands substantial investment and complex system upgrades, including significant workforce training. Moreover, the reliance on data-intensive processes raises critical concerns around data privacy and cybersecurity. The risk of breaches and cyberattacks grows as decision-making becomes more data-driven. Regulatory compliance adds another layer of complexity, as telecom providers must navigate diverse data protection laws across regions.

In conclusion, while AI and ML present transformative opportunities for innovation and efficiency in the telecom sector, they also require careful consideration of the associated risks. Companies that can strategically balance these opportunities and challenges will be well-positioned to gain a competitive advantage and drive long-term success in an increasingly digital landscape. Continued research and development will be key to overcoming implementation hurdles and maximizing the potential of these advanced technologies.

1. INTRODUCTION

Artificial Intelligence (AI) and Machine Learning (ML) are rapidly reshaping the telecommunications industry, driving innovation at a scale and speed never seen before. From enabling ultra-fast 5G networks to powering autonomous systems and the Internet of Things (IoT), these technologies are redefining how we communicate, connect, and share information globally. Their integration into telecom infrastructures promises increased efficiency, improved reliability, and the development of intelligent, adaptive services that benefit both consumers and enterprises.

However, this technological advancement also introduces a host of legal and ethical concerns. As AI and ML systems become more deeply embedded in telecom operations, questions surrounding fairness, data privacy, security, and regulatory compliance have gained urgency. For instance, how can we ensure that AI-driven telecom systems operate without bias? How do we safeguard the sensitive personal data they collect and process? And what governance frameworks are needed to ensure these systems are used responsibly and transparently?

This paper sets out to explore the dual nature of AI and ML in the telecom sector—highlighting both the transformative opportunities they present and the complex legal issues they raise. The discussion begins with an overview of AI and ML technologies and their current applications within telecommunications. It then delves into the regulatory and ethical challenges, particularly focusing on concerns around privacy, security, and algorithmic fairness. Finally, the paper considers how the telecom industry can effectively harness the potential of AI and ML while addressing the associated risks, paving the way for responsible innovation in an increasingly connected world.

2. LITERATURE REVIEW

1. In their study titled "The Role of Artificial Intelligence in the Telecommunications Industry," Astha Arora and Neelesh Verma discuss the increasing complexity of modern communication networks driven by emerging technologies such as Network Functions Virtualization (NFV) and Software-Defined Wide-Area Networking (SD-WAN). They emphasize that, in response to the growing demands of consumers, Communication Service Providers (CSPs) must enhance their understanding of network operations, planning, and optimization. To this end, researchers are leveraging Artificial Intelligence (AI) and Machine Learning (ML) techniques to improve network management, control, and

architecture, paving the way for more autonomous operations. Industry practitioners are also contributing to advancements through collaborative efforts such as the Artificial Intelligence Division and the Advanced Machine Learning Group within the Telecommunication Infra Project (TIP). The study further outlines key use cases for AI/ML in telecom, highlights the challenges posed by cloud computing and virtualization, and provides insights into the extent of automation achievable through these technologies.

2. In their paper titled "Application of Artificial Intelligence in Enhancing Efficiency of Operations in the Telecom Industry," Santosh Elapanda, U.V. Adinarayana Rao, and E. Sravan Kumar highlight the growing prominence of the term "artificial intelligence" among technology professionals. They argue that due to its accuracy and reliability, AI has become the preferred choice for technology-driven enterprises. The telecommunications sector, encompassing some of the world's largest corporations, is witnessing substantial AI investment aimed at improving operational efficiency. This surge is attributed to the sector's pivotal role in unifying global economies and simplifying connectivity. Consequently, the demand for AI integration in telecom has grown significantly. Many organizations are channeling resources into automating routine processes through AI, while simultaneously funding research initiatives to explore disruptive technological innovations. The study emphasizes the advantages of AI-powered automation in telecom service management, including the development of intelligent, self-healing platforms capable of delivering both preventive and corrective solutions.

Several product design challenges were encountered during the research phase, which were subsequently addressed through the application of risk management techniques.

3. KEY RESEARCH QUESTIONS

- > What are the primary legal challenges associated with the implementation of AI and ML in the telecommunications sector?
- > What regulatory frameworks or strategic approaches can be adopted to effectively address these challenges?
- > What are the potential legal implications of AI and ML adoption for businesses, consumers, and governmental bodies?
- > How can the deployment of AI and ML technologies be ensured to remain fair, transparent, and accountable?
- > In what ways can the telecommunications industry uphold data privacy and security while leveraging AI and ML?

4. RESEARCH HYPOTHESIS

Artificial Intelligence (AI) and Machine Learning (ML) are transforming the telecommunications sector by introducing both significant benefits and complex challenges.

5. OBJECTIVES

- Identify and assess the key challenges and opportunities presented by the integration of Artificial Intelligence (AI) and Machine Learning (ML) in the telecommunications industry.
- Offer strategic recommendations for how telecom companies can leverage these opportunities and effectively address the associated challenges.
- > Explore the potential of AI and ML to improve the reliability, performance, and operational efficiency of telecommunications networks.

6. RESEARCH DESIGN AND METHODOLOGY

The research methodology refers to the systematic approach employed for data collection, analysis, and interpretation throughout the research process. It outlines the tools and techniques utilized to gather relevant information necessary for the study. Common methods include questionnaires, interviews, and surveys, which serve as key components for effective data acquisition. This particular study adopts a doctrinal research approach, relying primarily on data obtained from credible online sources.

7. KEY CHALLENGES IN IMPLEMENTING AI AND ML IN TELECOM INDUSTRY

The integration of Artificial Intelligence (AI) and Machine Learning (ML) into the telecommunications sector offers significant potential, yet it also presents several notable challenges:

- 1. Data Security and Privacy: AI and ML systems rely on large volumes of data, often containing sensitive customer information. Telecom operators must ensure robust data protection measures are in place to prevent misuse and unauthorized access.
- 2. Skills Gap: There is a shortage of skilled professionals with expertise in AI and ML within the telecom sector. To address this, telecom companies must invest in workforce training and professional development programs.

- 3. High Implementation Costs: The initial investment required for AI and ML infrastructure can be substantial, especially for small to midsized telecom providers.
- 4. Ethical Considerations: Ensuring fairness, transparency, and the elimination of bias in AI systems is critical. Ethical concerns around data use, decision-making, and automation must be proactively managed.
- 5. In addition to these overarching issues, telecom operators face domain-specific challenges during AI/ML deployment:
- 6. Network Optimization: Improving network performance with AI/ML requires access to vast amounts of high-quality network data. However, acquiring and managing this data can be costly and resource-intensive.
- 7. Predictive Maintenance: While AI can help forecast equipment failures, effective models require historical data on network disruptions which is often limited, especially for newer technologies like 5G.
- 8. Fraud Detection: Training AI systems to detect fraudulent activity demands access to data on past fraud incidents. The evolving tactics of fraudsters make it difficult to maintain comprehensive and up-to-date datasets.
- 9. Customer Service: AI-powered chatbots and virtual assistants can enhance customer support. However, ensuring these systems understand and respond accurately to diverse queries remains a technical challenge.
- 10. Product and Service Innovation: Leveraging AI/ML to develop innovative offerings requires deep technical knowledge, which can be both expensive and difficult to acquire.

Strategies to Overcome These Challenges

To harness the full potential of AI and ML, telecom operators should consider the following approaches:

- > Invest in training programs to upskill employees in AI and ML technologies.
- > Partner with startups and AI/ML solution providers for innovation and integration.
- > Start with small-scale projects and expand based on results.
- > Implement strong data privacy and security frameworks.
- Establish ethical guidelines for the responsible use of AI and ML.

By addressing these challenges strategically, telecom companies can position themselves for sustained innovation and competitive advantage in the AIdriven digital era.

8. UTILIZATION OF AI IN TELECOM

The COVID-19 pandemic has accelerated the adoption of artificial intelligence (AI) and data analytics across industries, including telecommunications. A significant 74% of business executives believe that AI will play a crucial role in enhancing organizational efficiency in the future. The era when data mining and information analysis were merely competitive advantages is quickly evolving—soon, they will be indispensable components of business operations.

Telecommunication companies, following this trend, are increasingly integrating AI-driven solutions into their strategic frameworks. Forward-looking telecom providers are leveraging AI and machine learning to improve network performance, enhance customer satisfaction and retention, streamline operational processes, and drive profitability.

Data science has evolved beyond merely serving as a tool for gathering market intelligence—it is becoming a critical asset for any telecommunications company aiming to remain competitive over the next two decades. Leading telecom providers are already harnessing the power of data-driven technologies to gain a strategic edge. Key benefits include:

- Enhanced customer satisfaction through more efficient and responsive customer service initiatives
- Increased sales and delivery of personalized customer support experiences

1. Enhancing Customer Satisfaction through Machine Learning:

One of the most prominent applications of Artificial Intelligence (AI) in the telecommunications sector is the enhancement of customer service. Leading U.S. telecom providers such as AT&T, Comcast, and Verizon are actively incorporating AI across key customer-facing operations. These include delivering personalized service offers, deploying intelligent chatbots, and streamlining support processes to respond more efficiently to customer needs.

AI-driven customer support solutions typically fall into the following three categories:

- Customer Service Interaction AI is used to handle customer inquiries through virtual assistants and chatbots, providing quicker and more accurate responses.
- Personalized User Experience and Sales Machine learning algorithms analyze user behavior to tailor product recommendations and promotional offers.

Call Center Automation – AI technologies help automate routine tasks within call centers, improving operational efficiency and reducing wait times.

2. AI-Powered Communication in Customer Service

AI-powered customer communication systems in the telecom industry rely on advanced algorithms capable of processing vast volumes of historical and real-time data. These systems are designed to handle customer inquiries at a scale far beyond human capability. For effective machine learning training, diverse and extensive datasets—commonly referred to as big data—are essential.

Common implementations of AI in customer service include chatbot interfaces and virtual assistants. However, AI also operates behind the scenes, enhancing efficiency and reducing operational costs. For example, AI can analyze background data to diagnose the root cause of customer issues and recommend the most effective resolution strategies.

Key Use Cases in the U.S. Telecom Companies:

- Serving as virtual agents or initial touchpoints in live chat and contact center systems.
- Routing potential buyers directly to marketing teams and assigning customer inquiries to the most suitable service agents.
- Analyzing network data alongside customer service interactions to diagnose and resolve issues more efficiently.
- Scanning and prioritizing high-potential leads from large volumes of emails for sales teams.
- Enabling voice-based browsing or purchasing of media content, replacing traditional remote-control interfaces.
- Providing chatbot-driven entertainment through platforms like Facebook Messenger or telecom-branded apps.

These applications are made possible by Natural Language Processing (NLP) technologies, which allow AI systems to understand and respond to written and spoken language. Understanding NLP's capabilities through real-world use cases helps illustrate its growing value in the telecom sector.

Al as a Virtual Customer Service Agent

Major telecom operators like AT&T, Spectrum, and CenturyLink are using AI-driven virtual assistants to enhance cost-efficiency in customer support. For instance, Spectrum's "Ask Spectrum" virtual assistant provides customers with general information about services, account details, and troubleshooting guidance. It can escalate complex issues to live agents or direct users to appropriate resources in the Help Center, enabling human representatives to focus on more demanding inquiries.

AT&T, one of the world's largest telecom companies, employs AI across all online chat services. In December 2016, it introduced "Atticus," an entertainment-focused chatbot that interacts with users via Facebook Messenger.

Similarly, Vodafone launched "TOBi" in April 2017 on its UK website. TOBi assists users by simulating human-like conversations to help with account usage, order tracking, and troubleshooting—using a combination of AI and rule-based logic.

9. APPLICATIONS OF GEN AI IN THE TELECOM INDUSTRY

Generative Artificial Intelligence (Generative AI) holds immense potential to transform the telecommunications industry. a sector known for its rapid evolution and technological dynamism. Below are key areas where generative AI is being applied or shows significant promise:

- Network Optimization: Generative AI can analyze vast network data to identify and address performance issues in real-time. By detecting
 patterns such as signal interference or network congestion from log data, it helps telecom operators optimize performance and enhance the
 user experience.
- Predictive Maintenance: By forecasting potential equipment failures before they occur, generative AI enables telecom providers to perform timely maintenance. Analyzing sensor and operational data, it identifies failure patterns and alerts operators, reducing downtime and increasing overall network reliability.
- Customer Service Enhancement : Generative AI powers virtual agents that handle customer queries using Natural Language Processing (NLP). These intelligent assistants offer accurate, context-aware responses, improving service quality and reducing the workload on human agents
- Personalized Marketing: Through the analysis of customer data—including browsing behavior and purchase history—generative AI can craft tailored recommendations and promotional offers. This leads to more effective marketing campaigns, improved customer engagement, and increased loyalty.
- 5. Resource Allocation Optimization: By forecasting future network demand and identifying potential congestion points, generative AI helps telecom companies allocate resources more efficiently. This not only minimizes costs but also ensures better service delivery.
- 6. Network Security: Generative AI enhances security by analyzing user behavior and network traffic to detect anomalies and potential threats such as phishing or hacking attempts. Early detection enables proactive countermeasures to prevent cyberattacks and data breaches.
- 7. Quality of Service (QoS) Management: By predicting network performance degradation, generative AI enables operators to take preemptive action. It allocates additional resources where needed, ensuring consistent service quality and reliability for users.
- 8. Intelligent Infrastructure Development: Generative AI facilitates the creation of adaptive, self-optimizing network infrastructures. These systems can learn from user behavior and environmental changes, adjusting in real-time to maintain peak performance and user satisfaction.
- 9. Virtual Assistants: Telecom companies can deploy generative AI-powered virtual assistants that provide personalized assistance based on customer behavior and preferences. This not only improves the customer experience but also reduces the burden on human support teams.

- 10. Smart Billing Systems: Generative AI can analyze customer usage trends to create personalized billing plans. By aligning billing structures with individual usage patterns, it helps reduce billing disputes and enhances customer satisfaction.
- 11. Fraud Detection: AI models can identify unusual activity patterns across telecom networks that may indicate fraud, such as spam or unauthorized access. Generative AI enables early detection and alerts operators, safeguarding network integrity and reducing financial loss.

10. GLOBAL PERSPECTIVE ON AI REGULATION

Around the world, countries are increasingly enacting laws, regulations, and policy frameworks to govern the development and use of Artificial Intelligence (AI). While approaches vary, a common trend is emerging: striking a balance between fostering innovation and ensuring responsible, ethical AI deployment.

China: China stands out as the first country to implement a comprehensive AI law through its PRC Regulations. These regulations were developed collaboratively by seven regulatory agencies. Notably, they impose strict content restrictions: AI chatbots are prohibited from generating false, harmful, violent, pornographic, or anti-national content. The policy emphasizes strong oversight and content integrity.

European Union: The European Union has adopted a regulatory-intensive approach, similar to its General Data Protection Regulation (GDPR). The proposed EU Artificial Intelligence Act introduces a risk-based framework, classifying AI systems as low, moderate, or high-risk depending on their potential impact and autonomy. High-risk applications—particularly in healthcare and transportation—must meet stringent requirements for robustness, data transparency, and human oversight. Practices considered to pose "unacceptable risk," such as social credit scoring, are outright banned.

United States: The U.S. Federal Trade Commission (FTC) has issued five key principles for businesses using AI:

- 1. Be transparent with consumers about AI use
- 2. Provide clear explanations for AI-driven decisions
- 3. Ensure fairness and avoid bias
- 4. Use reliable, sound models and datasets
- 5. Uphold accountability for legal compliance, ethics, and non-discrimination

Additionally, the proposed Artificial Intelligence Bill of Rights serves as a non-binding guideline outlining ethical standards for AI usage.

United Kingdom: The UK promotes a "pro-innovation" regulatory stance. Rather than applying rigid classifications or rules, the UK proposes a principle-based framework focused on outcomes. Key principles include safety, security, fairness, transparency, accountability, and redress. Sector-specific regulators are expected to apply these principles contextually based on domain expertise.

Other Jurisdictions:

Saudi Arabia: has established the Saudi Data & AI Authority and the National Center for Artificial Intelligence, emphasizing innovation over strict regulation.

Australia: introduced a set of eight voluntary AI Ethics Principles to guide organizations.

Singapore: is developing an independent AI governance framework tailored to private sector needs, offering practical guidance on ethical and governance issues.

Canada: has adopted a national AI strategy focusing on industrial partnerships, research, and talent development.

India: India is rapidly emerging as a key player in the global AI policy landscape. As its regulatory framework continues to evolve, its direction and influence will be crucial to watch, particularly given the country's technological growth and strategic importance.

In summary, global approaches to AI governance range from tightly regulated frameworks to more flexible, innovation-first strategies. While some jurisdictions emphasize ethical oversight and risk management, others prioritize industry growth and technological advancement. The diversity in regulatory models reflects the complexity and transformative potential of AI worldwide.

1. The AI Landscape in India:

India is adopting a hybrid approach to Artificial Intelligence (AI), seeking to balance innovation with responsible regulation. The country has taken significant strides to promote ethical and inclusive AI development aimed at economic growth and social transformation. The 2018 National Strategy on AI by NITI Aayog outlined key pillars such as research and development, training, centers of excellence, access to data, and high-performance computing infrastructure. Furthering this vision, the Responsible AI for Social Empowerment (RAISE) 2020 summit emphasized the transformative potential of AI for societal empowerment, drawing participation from governments, industries, and academia worldwide.India is also a founding member of the Global Partnership on Artificial Intelligence (GPAI), alongside countries such as the U.S., U.K., EU member states, Australia, Canada, Japan, and others. GPAI supports the development of human-centric AI rooted in values like inclusivity, diversity, innovation, and economic prosperity.To facilitate national-level coordination, the Indian government launched the National Artificial Intelligence Portal, serving as a hub for AI-related initiatives, policies, and resources.

Regulatory Developments

India's approach to AI regulation is evolving. On July 20, 2023, the Telecom Regulatory Authority of India (TRAI) released a set of recommendations addressing AI and big data usage in the telecom sector. These guidelines explore critical areas including:

- > The definition of AI
- Ethical principles and responsible usage
- Emerging risks and regulatory requirements
- Data governance and restrictions on misuse
- Global perspectives and implications across sectors

Although initiated by TRAI, these recommendations extend beyond telecom, recognizing the cross-sectoral impact of AI on domains such as banking, healthcare, agriculture, transportation, and education. TRAI emphasizes the need for a uniform regulatory framework applicable across industries, to foster innovation while ensuring consistent ethical standards and safeguards.

Proposed AI Governance Authority: A key recommendation from TRAI is the establishment of a dedicated regulatory body: the Artificial Intelligence and Data Authority of India. This agency would be responsible for overseeing the ethical development and deployment of AI nationwide. Given the rapid evolution of AI technologies, the body must be agile, adaptive, and responsive, with a focus on effective cross-sector coordination.

While the intent behind this proposal is commendable, its success will depend on the government's ability to implement it effectively and ensure that the authority is both empowered and efficient—especially when compared to existing regulatory bodies in India.

11. CONCLUSION

The integration of Artificial Intelligence (AI) into the telecommunications sector is unlocking transformative opportunities for both industries. AI is being leveraged to develop innovative products and services, enhance customer experience, and optimize network performance. As a result, telecom operators are realizing significant benefits, including improved network efficiency and reliability, reduced operational costs, enhanced customer satisfaction, and the creation of new revenue streams. However, for widespread adoption, several challenges must be addressed. These include concerns related to data privacy and security, shortages in skilled personnel, high implementation costs, and ethical considerations surrounding AI deployment. **Key Findings:**

- AI is driving a major transformation in the telecom sector, with applications spanning network optimization, fraud detection, predictive maintenance, customer service automation, and new service development.
- > The implementation of AI is yielding measurable benefits such as higher operational efficiency, greater reliability, cost savings, improved user experiences, and diversified revenue channels.
- > Despite its potential, barriers to adoption remain—including technological skill gaps, ethical risks, and data governance challenges.

Recommendations for Telecom Operators:

- > Invest in workforce development to build AI and machine learning capabilities across teams.
- > Collaborate with AI/ML startups and technology providers to accelerate innovation and integration.
- > Adopt a phased implementation strategy, starting with pilot projects and scaling gradually.
- Strengthen data privacy and cybersecurity measures to protect customer information and build trust.
- Establish clear ethical guidelines and governance frameworks for the responsible use of AI and ML technologies.

By addressing these challenges proactively, telecom operators can fully harness the power of AI to drive sustainable growth, innovation, and competitive advantage in an increasingly digital world.

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