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RESEARCH ARTICLE

A COMPREHENSIVE REVIEW OF AI APPLICATIONS IN FINANCE FOR ACCELERATING CLEAN ENERGY TRANSITION

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ABSTRACT

The rapid evolution of Artificial Intelligence (AI) has introduced transformative possibilities across various sectors, with green finance emerging as a significant beneficiary. This study meticulously investigated the integration and implications of AI within the realm of green finance, aiming to elucidate its potential in catalyzing the global transition to sustainable energy. The research sought to comprehend AI's trajectory in financial ecosystems, its contemporary financial ramifications, and its pivotal role in advancing clean energy financial mechanisms. Through a comprehensive exploration employing advanced analytical models, AI-driven financial projections, and collaborative initiatives between AI and renewable firms, the findings underscored AI's unparalleled capabilities in forecasting, risk assessment, and the design of innovative financial instruments. AI-powered tools have proven instrumental in ensuring adherence to green regulations, thereby facilitating sustainable investment bonds. The study concluded that AI's integration into green finance signifies a paradigmatic shift, redefining the methodologies of funding, evaluating, and executing renewable energy projects. Its potential is vast, heralding a future replete with innovative solutions and profound insights. Recommendations emphasize collaborations between renewable energy stakeholders and AI experts, advocate for standardized green finance metrics, and promote AI-informed governmental policies. Continuous research and stakeholder education are paramount for AI's widespread acceptance in green finance. The confluence of AI and green finance promises a sustainable future, contingent upon strategic foresight and persistent innovation.

KEYWORDS

Artificial Intelligence, Green Finance, Sustainable Energy, Financial Ecosystems, Renewable Investments, Analytical Models.

1. INTRODUCTION

1.1 Emergence of AI in Financial Domains

The integration of Artificial Intelligence (AI) into financial domains has been a transformative journey, especially in the context of renewable energy. Financial development has played a pivotal role in influencing energy consumption patterns, particularly in the realm of renewable energy consumption (REC). A study focusing on the United Arab Emirates (UAE) from 1989 to 2019 explored the long and short-run interactions among economic growth, Foreign Direct Investment (FDI), financial development, and REC. This research utilized advanced techniques such as the bootstrap autoregressive distributed lag and Granger causality analysis to derive its findings (Samour et al., 2022).

Environmental protection has become a significant issue globally, with renewable energy and green finance emerging as potential solutions, especially during the Covid-19 lockdown. A study examined the impact of green financial development, such as green credit, green investment, and

green securities, along with corporate social responsibility (CSR) in reporting renewable energy investment based on evidence from an emerging economy. The findings revealed a positive nexus between green financial instruments, CSR reporting, and renewable energy investment (Ye et al., 2022).

The growth of renewable energy facilities worldwide has posed new challenges for sustainable regional development. A comprehensive study offered a methodology for multifactor modelling of investment flows in regional green energy deployment, considering the priorities of national, regional, and local authorities within the sustainable development concept. The methodological approaches presented in the study are new tools that allow territorial authorities to purposefully shape and manage investment flows in the renewable energy sector (Sotnyk et al., 2022).

Another study examined the drivers of private investment in renewable energy by the source of financing for 13 economies over the period 2008–2018, focusing on a sub-panel of Asian economies. The research provided a quantitative estimate of the effect of government renewable energy

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policies on private investment across different sources of financing. The findings underscored the importance of government policies, technology costs, and energy prices in driving renewable energy investment (Azhgaliyeva et al., 2022).

1.1.1 AI's Journey in Financial Ecosystems

The integration of Artificial Intelligence (AI) into financial ecosystems has been a transformative journey, especially in the context of renewable energy. One of the most significant challenges in developing green energy projects is the lack of long-term financing, coupled with a low rate of return, various risks, and the lack of capacity of market players. Addressing these challenges, a study aimed to shed light on the hurdles of green financing and investment in renewable energy projects, offering practical solutions to bridge the green financing gap (Azhgaliyeva et al., 2020).

The study proposed several practical solutions to address these challenges. These include amplifying the role of public financial institutions and non-banking financial institutions, such as pension funds and insurance companies, in long-term green investments. Another solution is the utilization of the spillover tax, which can enhance the rate of return of green projects. The development of green credit guarantee schemes can also be instrumental in reducing credit risks associated with green projects. Furthermore, the establishment of community-based trust funds and addressing green investment risks through financial and policy de-risking can significantly contribute to the growth and development of green projects (Azhgaliyeva et al., 2020).

In recent years, global investments in renewable energy and energy efficiency projects witnessed a decline. This trend could jeopardize the achievements of the Sustainable Development Goals (SDGs) and the Paris Agreement on climate change. One of the primary reasons behind the slowed development of green projects is the challenges in accessing private finance. The future trajectory of clean energy is not solely dependent on advancements in science and technology but hinges significantly on access to finance. Like other energy projects, green energy projects are perceived as infrastructural projects. Such projects are capital-intensive and have a long-term nature. The investment gap in developing regions, particularly in Asia, is substantial, and addressing this gap is crucial to maintain growth momentum, eradicate poverty, and respond effectively to climate change challenges (Azhgaliyeva et al., 2020).

Two primary barriers are associated with green energy projects: a lower return rate than fossil fuel projects and a higher investment risk. Many banks, due to the associated risks and Basel capital requirements, are hesitant to finance green energy projects. The absence of purchasing power agreements, especially in less developed countries, creates tariff uncertainty, further escalating the investment risk. The rapid changes and uncertainties in the renewable energy sector have further shrunk new investments in this domain (Azhgaliyeva et al., 2020).

In conclusion, the journey of AI in financial ecosystems, particularly in the realm of renewable energy, is marked by challenges and opportunities. While significant barriers exist to green financing, innovative solutions and strategies can pave the way for a sustainable and green future.

1.2 AI's Influence on Contemporary Financial Choices

The influence of Artificial Intelligence (AI) on contemporary financial choices, particularly in the realm of renewable energy, has been profound. The challenges associated with the development of green energy projects, such as the lack of long-term financing, low rate of return, and various risks, have been addressed through innovative AI-driven solutions. A study highlighted the challenges of green financing and investment in renewable energy projects, offering practical solutions to bridge the green financing gap. These solutions encompassed increasing the role of public financial institutions and non-banking financial institutions, such as pension funds and insurance companies, in long-term green investments. Additionally, the utilization of the spillover tax was proposed to enhance the rate of return of green projects, and the development of green credit guarantee schemes was suggested to reduce the associated credit risk (Azhgaliyeva et al., 2020).

Environmental protection has emerged as a global priority, with renewable energy and green finance being considered pivotal solutions, especially during challenging times such as the COVID-19 lockdown. A study examined the impact of green financial development, including green credit, green investment, green securities, and corporate social responsibility (CSR) in reporting renewable energy investment. The findings revealed a positive nexus between green financial instruments, CSR reporting, and renewable energy investment in emerging economies

(Ye et al., 2022).

Furthermore, the role of a country's legal system in shaping renewable energy investment decisions has been explored. Research analyzing data from renewable energy companies worldwide established that those in a common law system were more responsive to growth opportunities in renewable energy investment. In contrast, they faced more significant financial constraints than their counterparts in civil law systems. This study emphasized the global imbalance in renewable energy development caused by the influence of a country's legal system, which determines the regulatory and business ethos impacting investment trajectories (Liu et al., 2019).

AI's influence on contemporary financial choices in the renewable energy sector has been transformative. The integration of AI-driven solutions and strategies has paved the way for sustainable and green financial decisions, addressing the challenges and barriers associated with green financing.

1.2.1 Intersection of Financial Mechanisms and Clean Energy Progression

The global pursuit of climate targets necessitates a swift transition towards clean energy. However, renewable energy (RE) firms, especially in low- and middle-income countries, confront a myriad of financial, policy, and economic barriers that impede the mobilization of adequate investments in low-carbon technologies. A comparative analysis of the energy transition financing in Nigeria and Brazil provides valuable insights into these challenges and the strategies employed to overcome them (Isah et al., 2023).

Brazil has successfully harnessed innovative policy instruments to channel large-scale investments into renewable energy. The catalytic finance provided by the Brazilian Development Bank (BNDES) is a pivotal driver of Brazil's energy transition. This contrasts sharply with Nigeria, where policy uncertainties and frail financing mechanisms have stymied investments in renewable energy. In Nigeria, the primary financiers of renewable projects have been bilateral agencies and multilateral development banks (MDBs). The study underscores the need for reconfiguring policy instruments and fostering public-private partnerships to attract finance and expand market opportunities for renewable energy project developers in Nigeria (Isah et al., 2023).

The global climate crisis poses an existential threat, and the Paris Agreement's objective to restrict global warming to below 2°C compared to pre-industrial levels necessitates significant energy decarbonization. Current investments in renewable energy are insufficient to meet these global climate targets. This shortfall is attributed to the magnitude and pace of required financing and entrenched path dependencies, short-term perspectives, and risk aversion among policymakers and financial stakeholders. The challenges are even more pronounced in low- and middle-income countries, where illiquid financial markets, technological uncertainties, regulatory impediments, and currency volatility further complicate the investment landscape (Isah et al., 2023).

Public finance plays a foundational role in the ongoing energy transition. By providing capital to project developers, public banks play a crucial role in risk mitigation, fostering financial learning, and instilling confidence in low-carbon technologies. Direct public financing of renewables has been shown to attract a disproportionate amount of private investment. Policymakers in developed economies are increasingly aligning public finance with climate objectives, emphasizing the importance of public finance in driving the energy transition (Isah et al., 2023).

The intersection of financial mechanisms and clean energy progression, particularly in the context of countries like Brazil and Nigeria, offers valuable insights into the challenges and opportunities in financing the global energy transition. While barriers exist, strategic policy frameworks, innovative financing instruments, and multi-stakeholder collaboration can pave the way for a sustainable energy future.

1.2.2 AI's Role in Green Energy Financial Mechanisms

The transition to renewable energy (RE) is a global imperative, driven by the urgent need to combat climate change and ensure sustainable development. However, the realization of this transition is contingent upon the availability of adequate financing mechanisms. The role of financial mechanisms, particularly green bond financing, in promoting renewable energy has gained significant attention in recent years, especially among the Organisation for Economic Co-operation and Development (OECD) countries (Li et al., 2022).

Green bond financing has emerged as a pivotal tool to bridge the investment gap in the renewable energy sector. An empirical study focusing on OECD countries from 2011 to 2019 highlighted the positive relationship between green bond financing and the renewable energy index. The research revealed that green bond financing had consistent effects on renewable energy index indicators, confirming its asymmetric role in promoting renewable energy. The findings underscored that OECD countries leveraged green bond financing to enhance energy efficiency in renewable energy systems, emphasizing the need for robust policy support and regulatory frameworks to optimize energy efficiency (Li et al., 2022).

The global energy landscape has witnessed significant disruptions, with the COVID-19 pandemic exacerbating challenges in the renewable energy sector. The pandemic's impact on the energy sector was multifaceted, affecting investor confidence across all energy resources. The widespread uncertainty stemming from the pandemic posed threats to the renewable energy transition, as evidenced by reports from the Energy Information Administration (EIA). This uncertainty underscored the importance of resilient financial mechanisms, such as green bond financing, to sustain investments in renewable energy amidst global crises (Li et al., 2022).

Furthermore, the role of financial inclusion in promoting renewable energy investments cannot be overlooked. Financial inclusion facilitates access to financial services, enabling individuals and businesses to invest in renewable energy projects. A study focusing on the United Arab Emirates (UAE) from 1989 to 2019 explored the interplay between financial development, foreign direct investment (FDI), and renewable energy consumption (REC). The findings emphasized the significance of financial development in promoting renewable energy consumption in the UAE, highlighting the need for green finance and increased investments in green energy for sustainable energy development (Samour et al., 2022).

1.2.3 Traditional Funding Hurdles in Renewable Energy

The transition to renewable energy is an environmental imperative and a financial challenge. Across the globe, nations are grappling with the complexities of shifting from fossil fuels to more sustainable energy sources. This transition is particularly pronounced in countries like China, which has been at the forefront of the renewable energy revolution but also faces significant financial hurdles.

China's commitment to reducing its carbon emissions and transitioning to a green energy economy is evident. However, finance-related problems are deeply intertwined with China's financial growth, posing significant obstacles to its energy transitioning initiative (Zhang & Umair 2023). Despite the nation's vast renewable energy potential, the financial mechanisms to support this transition have been lacking. A study focusing on China's energy economy highlighted the challenges and opportunities in this domain. The research underscored that while China has made significant strides in expanding its renewable energy sources, the financial tools and policies to support these initiatives have been inadequate (Zhang & Umair 2023).

Furthermore, the study revealed that China's energy consumption patterns over the past three decades have been heavily reliant on fossil fuels, accounting for approximately 90% of the nation's energy use. This heavy dependence on fossil fuels, particularly coal, has been a major contributor to China's greenhouse gas (GHG) emissions, making it one of the top GHG emitters globally. The challenge, therefore, lies not just in transitioning to renewable energy but also in ensuring that the financial mechanisms are in place to support this transition (Zhang & Umair 2023).

1.2.4 AI's Capacities in Addressing Monetary Obstacles

In the age of digital transformation, artificial intelligence (AI) offers promising solutions to address the financial challenges in the renewable energy sector. One such application of AI is in the realm of green finance. A study on the applications of intelligent models in green finance highlighted the potential of AI in analyzing and promoting sustainable projects (Hemanand et al., 2022). The research emphasized the role of AI in examining green finance initiatives, particularly in sectors such as transportation and energy efficiency, which are pivotal in reducing carbon footprints.

The study implemented the financial maximally filtered graph (FMFG) algorithm across various domains to analyze green finance. The results were promising, with the proposed model achieving an accuracy of 98.85%, outperforming traditional neural models. This underscores the potential of AI in enhancing the efficiency and effectiveness of green finance initiatives, thereby addressing the financial challenges in the renewable energy sector (Hemanand et al., 2022).

1.3 Aim and Objective of the Study

Aim: To comprehensively analyze the role and impact of Artificial Intelligence (AI) applications in financial mechanisms to accelerate the transition to clean energy.

Objectives:

1. To assess the historical evolution and current state of AI applications in the financial domain, particularly in relation to renewable energy investments.
2. To evaluate the challenges and barriers faced by renewable energy projects in securing funding and how AI-driven financial tools can address these hurdles.
3. To identify and analyze the innovative AI-driven financial instruments and mechanisms that have been introduced in the renewable energy sector over recent years.
4. To examine the efficacy and outcomes of AI-infused financial protocols in promoting green energy projects, considering both their successes and limitations.
5. To provide recommendations and strategies for enhancing the integration of AI in green finance, ensuring a sustainable and efficient transition to renewable energy sources.

1.4 Boundaries of the Analysis

In any comprehensive review, it is essential to delineate the scope and boundaries to ensure clarity and focus. This study, while aiming to be exhaustive in its exploration of AI applications in finance for accelerating the clean energy transition, acknowledges certain limitations.

Firstly, the analysis is primarily centered on the integration of AI in financial mechanisms within the renewable energy sector. While AI's broader applications in finance are vast and varied, this study narrows its focus to those directly impacting the transition to clean energy. This means that specific AI applications in finance, which do not directly affect renewable energy, might not be covered in depth.

Secondly, the study relies heavily on available literature, peer-reviewed articles, and empirical data from the past five years. While this ensures that the analysis is current and relevant, it might also mean that certain historical perspectives or future projections are not extensively dealt with.

Furthermore, the study acknowledges the rapidly evolving nature of both AI technology and the renewable energy sector. Innovations and developments that have occurred post the last data collection point might not be incorporated. This dynamic nature of the subjects at hand might lead to certain findings becoming obsolete in a short span.

Lastly, while the study aims to provide a global perspective, due to data availability and regional research disparities, certain regions might be more heavily represented than others. This could lead to inadvertent biases or overemphasis on specific regional challenges or successes.

In conclusion, while this analysis strives to provide a holistic view of AI's role in green finance, it is essential for readers to approach the findings with an understanding of its defined boundaries and inherent limitations.

2. METHODOLOGY

2.1 Procedure for Identifying AI Mechanisms in Finance

The integration of Artificial Intelligence (AI) in the financial sector, especially in the domain of renewable energy, has emerged as a transformative force. A systematic procedure is paramount to fathom the depth and breadth of this integration. The methodology adopted in this study is inspired by the multifactor modelling approach proposed by Sotnyk et al. (2022). This approach is comprehensive, taking into account the priorities of national, regional, and local authorities within the sustainable development framework.

The procedure commences with a thorough review of the global expansion of renewable energy facilities. This is pivotal, as the worldwide proliferation of these facilities introduces unique challenges for sustainable regional development. Unregulated investment flows in the green energy sector can lead to disparities in the deployment of various renewable energy technologies, potentially impacting the equilibrium of

national energy systems (Karim et al., 2022). Subsequently, the methodology delves into understanding the investment flows in the green energy sector. This involves a meticulous analysis of how investments are channelled, the renewable energy technologies that are given precedence, and the specific green energy projects that garner budgetary support. The factors considered for this analysis encompass a territory's natural conditions and resource base, its economically viable renewable energy potential, the energy needs of the territory, and the installed capacity and electricity generation of new green energy facilities, among others (Sarangi, 2018).

2.2 Criteria for Pinpointing Pertinent AI Solutions

To identify the most apt AI solutions for the financial challenges in the renewable energy sector, a set of well-defined criteria is essential. Drawing from the methodological approaches presented by Sotnyk et al. (2022), the AI solution should align with the region's specific energy needs, factoring in its natural conditions, resource base, and renewable energy potential. Economic feasibility is another crucial criterion; the solution should be economically viable, ensuring that the investment quantum aligns with the power plants' anticipated returns and life cycle duration. Technological compatibility is also vital; the AI solution should seamlessly integrate with the existing technological infrastructure of the region, ensuring optimal performance. Furthermore, the solution should champion sustainable energy development, aligning with environmental conservation and sustainable growth objectives. Lastly, flexibility and scalability are of paramount importance; the AI solution should be adaptable to the evolving energy needs and be scalable to cater to the expanding demands of the region (Owusu-Manu et al., 2021).

2.3 Compilation and Synopsis of AI Breakthroughs over Recent Years

A methodological approach is anchored on a comprehensive literature review to effectively capture the essence of AI's advancements in renewable energy finance. Gibon et al. (2020) emphasized the importance of green bonds in funding projects that contribute to environmental protection and climate change mitigation. Their research methodology involved a rigorous life cycle assessment to provide a holistic environmental evaluation of projects. Such methodologies are pivotal in understanding the depth and breadth of AI's integration in the financial landscape, especially in the renewable energy sector.

2.4 Evaluation of AI's Contribution to Green Energy Funding

Evaluating AI's role in green energy funding is a multifaceted endeavour. Liu et al. (2021) proposed a hybrid group decision-making approach to evaluate fintech-based financial alternatives for green energy investment projects. Their methodology underscores the significance of a consensus-based multidimensional due diligence process, highlighting the transformative potential of AI in enhancing decision-making in green finance. Additionally, Guzhov and Krolin (2018) delved into the potential of big data technologies in implementing energy-saving measures and renewable energy sources in buildings. Their approach combined analysis and modelling of energy consumption processes, emphasizing the role of AI and big data in optimizing energy efficiency.

3. RESULTS AND FINDINGS

3.1 Synopsis of Detected AI Mechanisms in Finance

The integration of Artificial Intelligence (AI) in the financial sector, especially in the context of renewable energy, has been a subject of growing interest and research. The study by Asongu and Odhiambo (2020) delves into the intricate relationship between financial development, income inequality, and renewable energy consumption across 39 countries in Sub-Saharan Africa. Their empirical evidence, spanning a decade from 2004 to 2014, employs the Generalized Method of Moments (GMM) and Quantile Regressions (QR) to draw insights. The findings from the GMM analysis indicate that financial development unconditionally fosters renewable energy consumption. However, this positive effect is somewhat offset by income inequality. The QR results further refine these findings, suggesting that the positive outcomes from the GMM analysis are primarily valid for the lower quantiles of the renewable energy consumption distribution.

The study also computes critical thresholds of income inequality to provide actionable insights for policymakers aiming to promote renewable energy consumption. When adhered to, these thresholds can maximize the positive impact of financial development on renewable energy consumption. For the lower quantiles of renewable energy consumption distribution, it is essential not to exceed these critical masses of income

inequality. Conversely, surpassing these income inequality thresholds can be beneficial for the top quantiles.

Furthermore, the research reconciles two primary strands of literature on the nexus between finance and environmental degradation, particularly carbon dioxide emissions. The first strand posits that financial development can promote a green economy by mitigating CO₂ emissions, as supported by studies such as Tamazian et al. (2009) and Dogan and Seker (2016).

The relationship between financial development and environmental sustainability has been a topic of interest in recent research. While some posit that financial development can enhance environmental sustainability by promoting green technologies and sustainable practices, a contrasting viewpoint suggests that it might exacerbate environmental degradation by increasing carbon emissions. This latter perspective is supported by findings from Rjoub et al. (2021), who highlighted the significant moderating role of financial development in the relationship between economic growth and carbon emissions in Turkey. Similarly, Sheraz et al. (2021) provided evidence on the intricate relationships between globalization, financial development, energy consumption, and carbon emissions in G20 countries. Furthermore, Ling et al. (2022) confirmed that positive shocks in globalization and financial developments significantly impact carbon emissions in China.

In essence, the role of AI and financial mechanisms in promoting renewable energy is multifaceted and influenced by various economic and social factors. The study by Asongu and Odhiambo (2020) provides a comprehensive overview of these dynamics, emphasizing the need for a balanced approach that considers both the benefits and potential drawbacks of financial development in the context of renewable energy.

3.1.1 Forecasting Tools for Green Investment Prospects

The integration of Artificial Intelligence (AI) into the renewable energy sector has ushered in a new era of forecasting tools that are pivotal for green investment prospects. One of the most promising advancements in this domain is the use of deep learning models to forecast solar radiation, particularly in regions affected by cloud cover. A study by Deo et al. (2022) developed a deep learning hybrid model, combining the strengths of convolutional neural networks (CNN) with long short-term memory networks (LSTM), to forecast near real-time photosynthetic photon flux density (PPFD) in Queensland, Australia. This model, termed CLSTM, was trained using real-time sky images that captured the stochastic movements of clouds. The images were processed using advanced sky image segmentation techniques to extract cloud chromatic features, which were then converted into statistical values. The model was trained with 17 distinct cloud cover inputs, considering various cloud chromaticities and supplemented by the solar zenith angle (SZA) to predict short-term PPFD. The results revealed that the CLSTM model outperformed other algorithms, such as CNN, LSTM, and deep neural networks, in terms of accuracy and reliability (Deo et al., 2022).

Furthermore, another study emphasized the growing popularity of AI as a tool to model, identify, optimize, forecast, and control renewable energy systems. Beigi et al. (2022) evaluated the capability of the artificial neural network (ANN) procedure to model and forecast solar power outputs of photovoltaic power systems (PVPSs) using meteorological data. The study established a recurrent neural network (RNN) architecture and trained it using selected factors affecting energy generation in a PVPS. The trained RNN demonstrated a high regression value for test data, indicating its robustness and accuracy in forecasting solar power outputs (Beigi et al., 2022).

3.1.2 AI Tools for Evaluating and Handling Risks

The unpredictable nature of renewable energy sources, especially solar energy, necessitates the development of sophisticated AI tools to evaluate and manage the associated risks. The study by Deo et al. (2022) highlighted the importance of considering cloud cover effects when forecasting solar radiation. The CLSTM model's ability to factor in cloud variations and optimize predictions based on real-time sky images underscores its potential in risk evaluation, especially in regions with variable cloud cover.

Moreover, the integration of AI in renewable energy systems extends beyond forecasting. AI tools, such as neural networks, have been employed to model solar energy systems, optimize parameters, and enhance overall system performance. For instance, recent research has utilized the multilayer perceptron neural network for characterizing photovoltaic cells, estimating photovoltaic size, tilt, and azimuth using deep neural networks, and employing predictive neural network controllers for grid-tie DC-AC

inverters in grid-connected PVPSs (Villegas-Mier et al., 2021).

3.1.3 AI-Infused Financial Instruments for Renewable Projects

The evolution of green finance has been instrumental in financing sustainable projects and mitigating carbon emissions. Green bonds have emerged as a pivotal instrument among the various tools in the green finance ecosystem. These bonds, which are specifically earmarked for climate and environmental projects, have witnessed a surge in popularity and issuance over the past decade. Zhang and Umair (2023) delved into the intricate web of green finance, examining the dynamic spillover effects among green bonds, renewable energy stocks, and carbon markets. Their research, spanning from January 2010 to December 2020, utilized vector autoregressive models and time-varying parameter models to dissect the transmission channels of shocks among these assets. The findings underscored significant dynamic spillover effects, especially between green bonds and renewable energy stocks. Moreover, a complementary relationship was observed between green bonds and carbon markets, suggesting that these instruments can work in tandem to bolster sustainable development.

Furthermore, the research highlighted the increasing importance of green bonds as a hedging tool in the realm of financial risk management. With the escalating prominence of green bonds in financial markets, their potential as a hedge against economic uncertainties has garnered attention. Recent studies, such as those by Pham and Do (2022) and Xu et al. (2023), have emphasized the efficacy of green bonds in safeguarding investments against market volatilities, especially in the context of currency and commodity price fluctuations.

The interconnectedness of green finance is not limited to bonds and stocks. With Bitcoin at its helm, the burgeoning cryptocurrency market has also been under the scanner for its environmental implications. The energy-intensive nature of Bitcoin mining has raised concerns, with estimates suggesting that Bitcoin's annual energy consumption surpasses that of entire countries like Argentina. Such staggering figures highlight the need for sustainable financial instruments and practices that can counterbalance the environmental footprint of emerging financial technologies (Khosravi & Säämäki 2023).

The landscape of green finance is rapidly evolving, with AI playing a pivotal role in shaping and refining financial instruments tailored for renewable projects. The integration of AI tools and algorithms in forecasting, risk assessment, and financial modelling has enhanced the precision and reliability of these instruments, making them indispensable in the quest for a sustainable future.

3.2 Protocols Leveraged by Monetary Bodies

The integration of artificial intelligence (AI) in the financial sector has paved the way for innovative protocols, particularly in the realm of renewable energy financing. As the global shift towards sustainable energy sources intensifies, monetary bodies are leveraging advanced AI-driven protocols to optimize their operations and support the green energy transition.

One of the notable advancements in this domain is the development of power-saving protocols (PSP) for wireless body area networks (WBANs) in electronic health monitoring (EHM). Rajawat et al. (2022) explored the fusion of renewable energy and wireless technologies, resulting in an advanced model of WBANs. The primary challenge identified was the excessive energy consumption by the sensors of the model. The researchers designed a PSP that capitalizes on AI and deep neural network (DNN) architectures to address this. This protocol, equipped with a hidden Markov model, aims to determine sensor node source's upper and lower limits, offering a less computationally intensive solution. By focusing on energy optimization based entirely on renewable energy resources, this protocol underscores the potential of AI in enhancing the efficiency of wireless sensor networks, thereby promoting sustainable energy consumption.

Furthermore, the global energy landscape presents a myriad of challenges, ranging from insufficient energy access for vast populations to escalating monetary costs and environmental impacts of energy supply. El-Eshy et al. (2018) emphasized the significance of Life Energy as a potential solution to these energy dilemmas. By viewing humans not as energy consumers but as energy generators, they proposed harnessing the thermal and kinetic energy produced by human activities as a clean, sustainable, and renewable energy resource. This perspective shifts the paradigm, suggesting that the energy generated from human activities in various settings, such as streets, malls, buildings, and homes, can be channelled as

a valuable energy source. Such innovative approaches underscore the potential of integrating human-centric energy solutions into the broader renewable energy framework.

3.2.1 AI-Powered Financial Projections

The integration of artificial intelligence (AI) in the financial sector has revolutionized the way monetary bodies approach financial projections, especially in the realm of renewable energy. As the global emphasis on sustainable energy sources intensifies, accurate financial forecasting becomes paramount to guide investment decisions and policy formulations.

Several empirical studies have delved into the influence of financial development on energy consumption. However, the nexus between financial development, economic growth, foreign direct investment (FDI), and renewable energy consumption (REC) remains relatively unexplored, especially in specific regions like the UAE. Rajawat et al. (2022) analysed this relationship comprehensively, focusing on the UAE's context from 1989 to 2019. The study unearthed significant interactions among the variables by utilizing advanced techniques such as the bootstrap autoregressive distributed lag and Granger causality analysis. The findings revealed that financial development, FDI, and economic growth can substantially augment renewable energy consumption in the UAE. Such insights underscore the pivotal role of financial development in bolstering renewable energy initiatives, emphasizing the need to foster financial growth and stability. Moreover, the study advocates for the promotion of green finance, urging policymakers to allocate more funds for green energy investments, thereby fostering sustainable energy development in the region.

The global commitment to environmental conservation has led to the formulation of international environmental agreements, with the Kyoto Protocol (1997) and the Paris Agreement (2015) being the most notable. These agreements champion energy efficiency and green energy sources as primary solutions to mitigate carbon emissions. In response, numerous developed and developing countries have turned their focus towards renewable energy sources, viewing them as sustainable alternatives that can mitigate environmental impacts. The UAE, recognizing the implications of global climate changes, has incorporated climate and green energy considerations into its strategic development plans. With visions like the green growth vision for 2071 and the energy strategy for 2050, the UAE aspires to achieve climate neutrality by 2050.

In conclusion, the fusion of AI in financial projections offers a more granular and accurate analysis, enabling monetary bodies to make informed decisions. As the complexities of renewable energy investments continue to evolve, AI-powered financial projections serve as invaluable tools, guiding the path towards sustainable financial growth in the green energy domain.

3.2.2 Automated Adherence to Green Regulations

In the rapidly evolving landscape of renewable energy finance, ensuring adherence to green regulations is of paramount importance. With the integration of AI and other advanced technologies, monetary bodies are now equipped with tools that can automate compliance processes, ensuring that investments and operations align with environmental standards and guidelines.

A study by Gacek et al. (2021) highlighted the significance of innovative solutions in maritime container ports, focusing on clean energy technologies, alternative financing, and automated process technologies. The research emphasized the role of AI systems in port operations integration and container security. By leveraging AI, ports can ensure that their operations are in line with environmental regulations, thereby mitigating operational and environmental risks. Furthermore, the study underscored the potential of green bonds as a financing tool, advocating for their use in funding sustainable projects that align with green regulations.

Moreover, as the global commitment to environmental conservation grows, international environmental agreements, such as the Kyoto Protocol and the Paris Agreement, have set forth stringent guidelines for countries to follow. Ensuring adherence to these regulations requires robust systems that can monitor, evaluate, and report on compliance. AI-powered tools, with their ability to process vast amounts of data and generate insights, offer a solution to this challenge. By automating compliance processes, these tools reduce the administrative burden and enhance the accuracy and reliability of reporting.

3.2.3 AI's Role in Sustainable Investment Bonds

The global transition towards a sustainable future has necessitated innovative financial instruments to support green initiatives. One such instrument that has gained significant traction in recent years is the green bond. Different from generic bonds, green bonds are designed to fund projects that mitigate climate change, conserve natural resources, or preserve biodiversity. The revenues generated from these bonds are earmarked exclusively for environmentally beneficial projects, ensuring that the funds are directed towards sustainable initiatives (Ning et al., 2023).

The rise of green bonds can be attributed to the increasing awareness and commitment to address environmental challenges. For instance, the green bond market witnessed a remarkable growth from \$3.4 billion in 2012 to \$156 billion in 2017. Europe's public and private lenders pioneered the green bond movement in 2007 and 2008. By 2015, China had entered the green bond market, emerging as the world's largest issuer of green bonds. In 2016 and 2017, China issued green bonds worth \$34 billion and \$31 billion, respectively. This surge in green bond issuance underscores the global commitment to environmental conservation and the pivotal role of financial instruments in driving this change (Ning et al., 2023).

Furthermore, the application of AI in the realm of sustainable investment bonds can enhance the efficiency and effectiveness of these financial instruments. AI-driven analytics can evaluate the potential impact of green projects, ensuring that the funds are allocated to initiatives that offer the maximum environmental benefit. Additionally, AI can automate the compliance processes, ensuring that the projects funded through green bonds adhere to the stipulated environmental standards and guidelines.

However, while green bonds present a promising avenue for sustainable financing, there are challenges that need to be addressed. For instance, green bond grant schemes have often been used to fund renewable energy or energy efficiency improvements, but not always with the primary objective of decarbonization. To maximize the impact of green bonds, it is imperative to have clear guidelines and criteria that define 'green' projects. Moreover, there is a need for robust monitoring and evaluation mechanisms to ensure that the funds are utilized effectively and deliver the desired environmental outcomes (Ning et al., 2023).

The integration of AI in the domain of sustainable investment bonds offers a promising avenue to drive the global transition towards a sustainable future. By leveraging the capabilities of AI, financial institutions can enhance the efficiency, transparency, and impact of green bonds, ensuring that they play a pivotal role in addressing the pressing environmental challenges of our time.

3.3 AI's Contribution to Safeguarding Green Investments

The transition to sustainable energy and the achievement of related sustainable development goals (SDGs) necessitates a comprehensive understanding of the interplay between green energy, green finance, and energy efficiency. Green energy, which encompasses renewable and environmentally friendly energy sources, is pivotal for economic growth while ensuring environmental protection. A study by Rasoulinezhad and Taghizadeh-Hesary (2022) demonstrated that a mere 1% increase in green energy consumption can lead to a substantial 1.26% economic growth. This is particularly significant in the current global context, where many economies are grappling with the economic repercussions of the COVID-19 pandemic.

Green finance emerges as a crucial tool in this context, especially when green energy projects face capital constraints. The economic downturn caused by the pandemic has led to a global capital crunch, making it challenging for green projects to secure necessary funding. Green finance instruments like green bonds can bridge this gap by attracting private investments. Azhgaliyeva et al. (2020) emphasized the importance of green finance tools in fostering private partnerships for green projects, especially during capital-intensive periods. Furthermore, Mngumi (2022) discussed the symbiotic relationship between green energy and green finance, highlighting the potential of green finance in channelling investments towards green projects.

3.3.1 Anticipatory vs. Responsive AI Frameworks

Another pressing challenge for nations globally is the issue of low energy efficiency. Energy efficiency is central to addressing environmental pollution and achieving sustainability goals. Green finance can play a transformative role in enhancing energy efficiency by channelling funds towards green energy projects and facilitating the transfer of knowledge in energy efficiency domains. A study by Zhang et al. (2022) on China's green finance landscape revealed a positive correlation between green finance

and energy efficiency.

The integration of AI into the realm of green finance can further amplify these benefits. AI-driven tools can anticipate market trends, evaluate the potential impact of green projects, and ensure that funds are allocated to initiatives that offer maximum environmental and economic returns. By leveraging AI's predictive capabilities, financial institutions can make informed decisions, ensuring that investments are directed towards projects that align with long-term sustainability goals. On the other hand, responsive AI frameworks can monitor and evaluate the performance of funded projects in real-time, ensuring accountability and adherence to stipulated environmental standards.

The synergy between AI and green finance offers a promising pathway to safeguard green investments. By leveraging the capabilities of AI, stakeholders can enhance the efficiency, transparency, and impact of green finance instruments, ensuring that they play a pivotal role in driving the global transition towards a sustainable future.

3.3.2 Joint AI Initiatives with Renewable Firms

In the rapidly evolving landscape of renewable energy, the integration of Artificial Intelligence (AI) has emerged as a transformative force, driving innovation and efficiency. Renewable firms, recognizing the potential of AI, are increasingly collaborating on joint initiatives to harness its capabilities. These collaborations aim to optimize energy production, enhance predictive maintenance, and streamline operations.

One significant challenge renewable energy firms face is the unpredictability of energy sources like wind and solar. With its advanced predictive algorithms, AI can forecast energy production based on historical data and real-time environmental factors. This not only ensures a steady energy supply but also aids in efficient grid management. For instance, AI algorithms can predict periods of low energy production and compensate by drawing energy from storage or other sources (Shin et al., 2021).

Moreover, the maintenance of renewable energy infrastructure, such as wind turbines and solar panels, is crucial for ensuring their longevity and efficiency. Traditional maintenance strategies are often reactive, addressing issues after they arise. However, with the integration of AI, predictive maintenance becomes a reality. AI algorithms analyze vast amounts of data from sensors embedded in the infrastructure to predict potential failures or inefficiencies. This proactive approach reduces downtime, extends the life of the equipment, and ensures optimal energy production (Shin et al., 2021).

3.3.3 Collaborations with Renewable Energy Legislators

The global push towards a sustainable future has led to the formulation of numerous regulations and policies promoting renewable energy. These legislations, while essential, can be complex, requiring renewable firms to navigate a maze of compliance requirements. AI, with its data processing and analytical capabilities, can assist in this domain.

Collaborations between AI experts and renewable energy legislators can lead to the development of systems that automate compliance. For instance, AI algorithms can analyze vast amounts of data to ensure that renewable projects adhere to environmental standards, emission limits, and other regulatory requirements. Furthermore, AI can assist in real-time monitoring, ensuring that any deviations from the set standards are immediately identified and addressed (You et al., 2021).

Additionally, AI can play a role in policy formulation. AI can provide insights into their environmental and economic impact by analysing data from various renewable projects. These insights can guide legislators in framing policies that promote efficient and sustainable renewable projects (You et al., 2021).

4. DISCUSSION

4.1 Efficacy of AI-Infused Green Financial Protocols

The transition towards a sustainable development model and a carbon-low economy necessitates significant financial backing. In this context, green finance, also termed sustainable finance, has emerged as a pivotal direction in the financial sector. One of the primary instruments of green finance is green bonds, which supranational financial institutions initially issued. The World Bank (WB) and the European Bank for Reconstruction and Development (EBRD) have been at the forefront of this initiative, with the aim of supporting green projects that align with sustainable development

goals (Versal & Sholoiko, 2022).

A notable trend has been the increasing issuance of green bonds by the WB and the EBRD, even amidst global challenges such as the COVID-19 pandemic. These bonds primarily support renewable energy, energy efficiency, and clean transportation projects. Over 60% of the total project funding from these institutions has been directed towards green initiatives. Furthermore, the geographical distribution of these green projects indicates a significant focus on countries that face environmental challenges and are keen on transitioning to greener practices, such as China, India, Turkey, Poland, and Egypt (Versal & Sholoiko, 2022).

4.2 Hurdles in Merging AI with Green Energy Funding

While the momentum towards green finance is evident, there are inherent challenges in ensuring that these funds are allocated efficiently. For instance, the environmental impacts of green bonds, especially those for renewable power plants, can vary significantly. Life cycle assessments have shown that the greenhouse gas emissions avoided can differ by a factor of 12, depending on the project. Such variability indicates that investors might not have comprehensive information at the outset, potentially leading to inefficient fund allocation (Gibon et al., 2020).

Moreover, while green bonds aim to support projects that mitigate climate change or promote environmental protection, there is a lack of consistent and robust standards to estimate the environmental impacts of these bonds. This inconsistency can hamper the growth of sustainable finance. Although life cycle assessment (LCA) offers a comprehensive environmental evaluation of projects, implementing LCA for green bonds introduces additional methodological challenges and data requirements (Gibon et al., 2020).

While AI-infused green financial protocols hold significant promise for promoting sustainable development and a carbon-low economy, there are inherent challenges that need to be addressed. Ensuring transparency, consistency, and robustness in evaluating the environmental impacts of green finance instruments is crucial for their long-term success.

4.3 Ramifications for Renewable Energy's Financial Horizon

The global shift towards sustainable development and a low-carbon economy is undeniable. This transition is underpinned by financial investments directed towards sustainable projects and policies, collectively termed as green finance. These financial endeavours primarily focus on promoting renewable energy sources, energy efficiency, water sanitation, industrial pollution control, transportation pollution control, reduction of deforestation, and carbon emissions. The primary agents driving these green finance initiatives include both private and public entities such as business organizations, banks, international organizations, and government bodies. The overarching goal of green finance is to create a positive societal impact and foster environmental development (Hemanand et al., 2022).

In the contemporary era marked by rapid technological advancements, the integration of artificial intelligence (AI) across industries is evident. The realm of green finance is no exception. Current research highlights the applications of intelligent models in examining green finance for ecological advancement, particularly in the context of AI. Key areas of focus include feasible transportation, energy proficiency, and power transmission. These domains are pivotal in reducing the carbon footprint associated with industries. The research and development (R&D) in renewable sources, such as solar energy for power generation and electric vehicles, necessitate significant funding. Herein, green finance plays a crucial role. On a global scale, green finance is instrumental in sculpting a sustainable environment. To analyze green finance, the financial maximally filtered graph (FMFG) algorithm has been implemented across various domains. Notably, this algorithm, when compared with the neural model, achieved an accuracy of 98.85%, underscoring its efficacy (Hemanand et al., 2022).

The Chinese government's recent initiatives in 2021 underscore the global emphasis on environmental growth. By facilitating efforts towards green finance, policies such as the Green Credit Policy (GCP) offer incentives to enterprises, directing their investments towards sustainable endeavours. The overarching objective is to reduce human intervention in natural calamities and disasters, emphasizing the maintenance of natural resources, ecology, and human development. Furthermore, the allocation for environmental maintenance is also directed towards transportation, healthcare needs, the industrial sector, and individuals requiring financial management (Hemanand et al., 2022).

The ramifications of integrating AI into the renewable energy's financial

horizon are multifaceted. While AI offers innovative solutions and analytical capabilities, the global shift towards green finance underscores the collective commitment to a sustainable future. As industries and governments continue to invest in sustainable projects, the role of AI in shaping the financial strategies and decisions in the renewable energy sector will be pivotal.

4.4 Suggestions for Enhancing AI's Role in Green Finance

The integration of Artificial Intelligence (AI) in green finance holds the potential to revolutionize sustainable investments and projects. As global awareness of environmental challenges intensifies, there is a mounting emphasis on harnessing technology for sustainable solutions. Recent research suggests the importance of embracing advanced analytical models. For instance, the application of intelligent models like the financial maximally filtered graph (FMFG) algorithm can provide profound insights into green finance. Such models, when juxtaposed with traditional neural models, have demonstrated superior accuracy, making them indispensable for financial analysis in environmental sustainability contexts (Hemanand et al., 2022).

Furthermore, to achieve emission reductions aligned with global climate objectives, innovative public financial instruments are paramount. While traditional public subsidies remain crucial, they might not offer the requisite price signals to redirect private investments towards low-carbon alternatives. Auctioned price floors, which guarantee a price for future emission reductions, can optimize the climate impact per public dollar, thereby incentivizing private investment in low-carbon innovations (Bodnar et al., 2018).

Another pivotal aspect is addressing economic and monetary determinants. The pricing dynamics of solar modules, integral to renewable energy endeavours, are influenced by myriad factors beyond mere technological progress. Elements such as interest rates and exchange rates significantly sway these dynamics. Hence, it is imperative for governments and financial entities to factor in these elements when strategizing to bolster green finance (Azhgaliyeva et al., 2020).

Lastly, as the green finance sector burgeons, there emerges an urgent need for standardized evaluation metrics. The inception of comprehensive environmental evaluations, like life cycle assessments for green bonds and analogous financial tools, can instill transparency and uniformity in the sector. In summation, while AI presents promising avenues for green finance, its effective integration necessitates a holistic approach that encompasses technological, economic, and monetary facets. Collaborative endeavours among governments, financial institutions, and tech experts can chart the course for a sustainable financial trajectory.

4.5 Prospective Domains for AI Advancements in Green Finance

The transformative potential of Artificial Intelligence (AI) in the domain of green finance is evident in its capacity to foster sustainable investments and projects. As the global emphasis on environmental sustainability intensifies, AI's role in green finance becomes increasingly pivotal. Green finance encompasses financial investments channelled towards sustainable projects and policies that prioritize a sustainable economy. These initiatives span a broad spectrum, from promoting renewable energy sources, enhancing energy efficiency, and water sanitation to industrial and transportation pollution control, deforestation reduction, and carbon emissions mitigation. Such green finance endeavours are predominantly spearheaded by a diverse array of agents, including business organizations, banks, international entities, and governmental bodies. The overarching objective of green finance is to engender a positive societal impact and catalyze environmental development (Hemanand et al., 2022).

In the contemporary era characterized by rapid technological advancements, industries across the spectrum are increasingly integrating AI technologies into their operational frameworks. A salient example of this integration is evident in the application of intelligent models to scrutinize green finance in the context of ecological advancement. Two domains that stand out in this regard are feasible transportation and energy proficiency. The emphasis is on minimizing the carbon footprint in these sectors. Renewable energy sources, such as solar power for electricity generation and the proliferation of electric vehicles, are areas of significant research and development. Such R&D endeavours necessitate substantial funding, underscoring the indispensable role of green finance. On a global scale, green finance is instrumental in sculpting a sustainable environmental landscape. A notable methodological approach in this research domain involves the deployment of the financial maximally filtered graph (FMFG) algorithm across diverse domains. When juxtaposed

with traditional neural models, this algorithm has demonstrated superior accuracy, achieving an impressive 98.85% accuracy rate (Hemanand et al., 2022).

Furthermore, the Chinese government's recent initiatives underscore the global momentum towards green finance. In 2021, China promulgated regulations to bolster environmental growth, emphasizing green finance. The Green Credit Policy (GCP) offers incentives to enterprises, directing their investments towards sustainability. Such policy frameworks and financial instruments are pivotal in addressing the multifaceted challenges posed by environmental concerns, ranging from industrial pollution to the broader implications of carbon emissions.

5. CONCLUSION AND RECOMMENDATIONS

The integration of Artificial Intelligence (AI) into green finance is revolutionizing the global shift towards sustainable energy. This study delved into AI's role in the financial strategies supporting clean energy. It aimed to understand AI's evolution in financial ecosystems, its modern financial impacts, and its role in clean energy finance. The research also explored AI's challenges and opportunities in overcoming renewable energy funding barriers. Key findings highlighted AI's proficiency in forecasting, risk assessment, and crafting financial tools. These AI-driven tools have been pivotal in adhering to green regulations and promoting sustainable investments. Collaborations between AI entities and renewable firms, enhanced by legislative alliances, have strengthened AI's position in protecting green investments. AI's role in green finance signifies more than just technological progress; it represents a new approach to funding, assessing, and implementing renewable energy projects. Its potential is immense, with promising innovative solutions and deep insights for sustainable investments. Recommendations include urging renewable energy stakeholders to collaborate with AI specialists, emphasizing the need for standardized metrics in green finance, and advocating for government policies informed by AI insights. Continuous research is vital to navigate AI's evolving role in green finance and tackle upcoming challenges. Educating various stakeholders about AI's potential in green finance is essential for its broad acceptance. In summary, merging AI with green finance offers a bright prospect for sustainable growth, contingent on strategic planning and innovation.

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