# Optimization Analysis of Dual-Mode Renewable Hybrid Power Systems: A Review



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**ABSTRACT:** The escalating threat of global warming necessitates a shift towards clean energy production, with renewable energy sources emerging as a promising solution for sustainable electricity generation. However, the inherent intermittency of renewables requires hybrid systems to maintain reliable electricity. This review explores the optimization of dual-mode renewable hybrid power systems, which operate in both grid-connected and autonomous modes, to address power stability challenges. By analyzing state-of-the-art methodologies, including advancements in control algorithms, architecture sizing, and energy management strategies, this work identifies methods for enhancing system efficiency and cost-effectiveness. Key findings demonstrate that optimized dual-mode systems improve power consistency and operational resilience. The review concludes by outlining a roadmap for future research, highlighting innovations in integration techniques, environmental assessments, and regulatory collaboration as crucial steps toward maximizing the impact of dual-mode systems in achieving global energy sustainability goals.

KEYWORDS: Hybrid energy sources, optimization techniques, minimization, modeling, grid integration

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# I. INTRODUCTION

Energy is a basic necessity for all aspects of human progress, including food, health, infrastructure, prosperity, education, and civilization; as such, its supply should be secure, ample, and freely available (Roy *et al.*, 2022; Majeed Butt 2021; Castro-Toro *et al.*, 2023; Le *et al.*, 2023). However, the increasing global energy demand driven by massive population growth, rapid urbanization, and industrialization poses significant challenges. The depletion of fossil fuel reserves, detrimental effects of greenhouse gas emissions, and reliance on non-renewable energy sources further exacerbate the issue, underscoring the urgent need for alternative energy solutions (Gulzar *et al.*, 2022; Giama *et al.*, 2023).

Renewable energy systems (RESs) have emerged as a promising alternative due to their numerous benefits, including cost-effectiveness, safety, cleanliness, and availability (He *et al.*, 2021; Come Zebra *et al.*, 2021; Lombardi, Pickering and Pfenninger, 2023). Despite their potential, the primary challenge facing renewable energy solutions is their inherent dependence on environmental conditions, location, and operational state, leading to fluctuations in voltage and frequency (Qays *et al.*, 2023). This research addresses the critical need for optimization strategies in dual-mode renewable hybrid systems, which are essential to overcoming these fluctuations and ensuring reliable power supply despite environmental variability.

A "dual-mode" renewable hybrid power system refers to a system that can operate in two distinct modes: grid-connected and autonomous (off-grid) (Pop *et al.*, 2023). In grid-

connected mode, the system interacts with the main power grid, supplying excess energy when production exceeds demand and drawing power from the grid when renewable generation is insufficient (Bubalo *et al.*, 2023). In autonomous mode, the system operates independently, providing power solely from its renewable sources and storage. This flexibility allows the system to adapt to varying energy demands and grid availability, thus enhancing its resilience against intermittent power supply (He *et al.*, 2023). The significance of this research lies in its comprehensive analysis of dual-mode renewable hybrid power systems, focusing on their ability to operate in both modes, which mitigates the challenges posed by fluctuating renewable energy generation.

Addressing this challenge necessitates a deeper examination of renewable hybrid systems. These systems integrate various energy generation, storage, and conversion technologies, offering improved performance, efficiency, and stability compared to single renewable energy systems. The review of renewable hybrid systems is crucial as it explores the configuration and optimization needed to enhance their reliability and effectiveness. Common hybrid system designs include Wind-Hydro, Hydro-Solar, Solar-Wind, Solar-Wind-Biomass, and Solar-Wind-Battery combinations, often supplemented with diesel generators as a backup to meet load demands. The significance of this research lies in its comprehensive analysis of dual-mode renewable hybrid power systems, focusing on their ability to operate in both gridconnected and autonomous modes. This dual-mode functionality enables the systems to adapt to varying demands

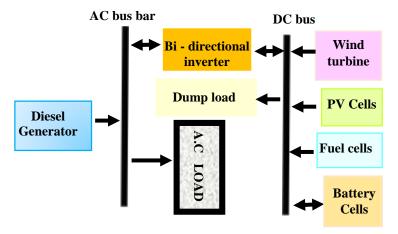
and grid availability, addressing the critical issue of intermittent power supply.

The unique contributions of this review include the indepth exploration of optimization techniques specific to dualmode hybrid systems, advancements in architecture sizing, energy management strategies, and economic evaluations that are essential for enhancing system efficiency and resilience. Additionally, this work identifies emerging pathways for integrating these systems into the global energy landscape, laying a foundation for achieving sustainable energy goals.

#### A. Hybrid Renewable Energy Systems (HRESs)

Hybrid Renewable Energy Systems (HRESs) integrate multiple renewable energy sources to enhance reliability and efficiency (Canale *et al.*, 2021; Khosravani *et al.*, 2023). These systems combine different technologies such as solar, wind, and biomass to mitigate the intermittency issues inherent in standalone renewable energy systems (Asiaban *et al.*, 2021). By diversifying energy sources, HRESs can provide more stable and consistent power supply, crucial for both gridconnected and off-grid applications (Rathod and Subramanian, 2022; Salac *et al.*, 2024).

The integration of energy storage solutions further enhances their flexibility and ability to meet varying energy demands (Shahzad and Jasińska, 2024). HRESs play a vital role in achieving sustainable energy goals by optimizing resource utilization and reducing reliance on fossil fuels, thereby contributing to environmental preservation and energy security (Al-Shahri *et al.*, 2021). As research and development continue to advance, optimizing the design and operation of HRESs remains a focal point to maximize their effectiveness in diverse energy landscapes (Hu and Bui, 2024; Zisos *et al.*, 2023).



# Fig. 1: Schematic diagram of a renewable hybrid power systems

Figure 1 presents the schematic diagram of an HRES, each component plays a crucial role: Photovoltaic (PV) cells convert sunlight into electricity, complemented by wind turbines that harness wind energy for renewable power generation. Fuel cells provide continuous electricity through chemical reactions, acting as a reliable backup source. Batteries store excess energy from PV cells and wind turbines for later use, ensuring stable power supply during fluctuations. The direct current (DC) bus bar distributes direct current power among components like PV cells, wind turbines, batteries, and DC loads, which consume DC electricity directly. A dump load safeguards the system by absorbing surplus energy that cannot be stored or used, preventing overvoltage. Inverters then convert DC electricity into alternating current (AC), compatible with AC loads and grid connections, essential for distributing power to household and industrial appliances. Power management systems monitor and optimize the operation of these components, ensuring efficient energy conversion, load balancing, and system stability. Together, these components and systems optimize energy efficiency, enhance system reliability, and support sustainable energy solutions in diverse operational environments.

Figure 2 summarizes the benefits of hybrid renewable energy systems by integrating diverse energy sources such as PV, Wind, Hydro, etc., enhancing system robustness amid climate change. This integration improves power supply quality, avoiding frequency drift that can disrupt sensitive loads (Rasolomampionona *et al.*, 2024).



Fig. 2: Merits of renewable hybrid power systems

The remainder of this study is organized as follows: Section II covers the optimization objectives for hHRESs, while Section III discusses hybrid system modeling. Section IV addresses key findings, implications, and comparisons with relevant research, along with strategies to mitigate the HRES energy crisis, a research gap assessment, research limitations, and future directions to enhance the study's value. Finally, Section V presents the conclusion.

#### II. THEORETICAL ANALYSIS

#### A. The HRES Optimization Objectives:

The capacity of various renewable energy sources to generate energy varies (Erdiwansyah *et al.*, 2021). To build and implement the power grid effectively, the government and utility corporations must be aware of the precise capacity of various renewable energy sources at various places (Fabra and Llobet, 2022). The cost of operating and maintaining energy-

producing units will eventually decrease with the appropriate deployment of renewable energy sources (Bhuiyan, 2022). When preparing for the implementation of renewable energy sources, minimizing costs and optimizing power generation are the two key goals (Ammari *et al.*, 2022). Various optimization methods have been suggested to accomplish these two goals (Hassan, Kamel and Hussien, 2023).

Numerous optimization models are available in the literature, including control models for the effective use of renewable energy sources, system capital cost optimization objectives (Panda and Das, 2021), emission minimization objectives (Ahmed et al., 2022), energy optimization objectives (Rahman et al., 2021), profit maximization objectives for Distribution Companies (Basu et al., 2022), and energy forecasting objectives (AlKandari and Ahmad, 2024). Recent advancements encompass AI-based predictive algorithms (Firoozi Fard and Hajimirza amin, 2023) to manage renewable energy fluctuations, effectively applied in smart grid systems for dynamic, real-time supply-demand balancing. Machine learning techniques, such as deep neural networks (Shafi et al., 2023) are increasingly employed in energy forecasting, with utility companies leveraging them to improve load balancing in hybrid renewable setups. Genetic algorithms (GA) (Khatri et al., 2023) have also been applied to optimize hybrid configurations by selecting efficient combinations of energy storage and generation, lowering both capital and operational costs.

Additionally. reinforcement learning (RL)-based optimizers (Sankaran et al., , 2022; (Ding et al., , 2023), are applied to adaptive energy pricing in smart grids, promoting market efficiency and balanced energy consumption across peak times. A thorough analysis of optimization techniques used with renewable energy sources can be found in (Okundamiya, 2021), however, there are always new optimization techniques being presented in this area. Consequently, an updated assessment of optimization techniques being applied to various issues about the installation and operation of electricity-generating units based on renewable energy sources is presented in this study (Schulz et al., 2021; (Elaziz et al., 2022).

#### B. Hybrid System's Optimal Sizing:

Different methods for optimal sizing of HRES in the literature include the graphical construction method (Elmelegi *et al.*, 2021), Probabilistic methods (Fernández-Guillamón *et al*, 2022), Iterative methods (Khan *et al.*, 2022), Analytical methods, and artificial intelligence methods (Hoarcă *et al.*, 2023). These approaches use computer models to characterize the various HRES components, enabling system designers to evaluate the performance of various HRES configurations and determine the techno-economic viability of the system. For instance, a hybrid biomass and photovoltaic system in a rural Spanish municipality achieved a 20% reduction in electricity

costs and a 6.13% internal rate of return (IRR) over 12 years (Roldán-Porta *et al.*, 2023).

Similarly, a study at Afe Babalola University in Nigeria evaluated a hybrid energy system (HES) for large buildings, demonstrating potential energy cost reductions of 45% and a 32.09% decrease in CO<sub>2</sub> emissions (Gbadamosi *et al.*, 2022). Currently, several computer software tools have been created to evaluate HRES performance, most famous of them are the hybrid optimization model for electric renewables (HOMER), iHOGA / MHOGA, Hybrid 2, Hybrid Designer, iGRHYSO, SOMES, SOLSTOR, RETScreen, and SOLSIM. (Chisale *et al.*, 2023; Arif *et al.*, 2023; Liu and Rodriguez, 2021).

The following features set these software categories among many others—apart: they offer remarkably precise simulation results for analysis, evaluation, and optimization, lowering initial capital cost, figuring out a renewable system's ideal capacity, predicting long-term system performance, and swiftly solving numerous system configurations, which makes it simple to compare thousands of options in a single run. The following are some of the major shortcomings of these software packages: certain solutions require lengthy and sluggish processes; some software packages, like HOMER, cannot perform thermal analysis of systems; and some software packages cannot guess key values of sizes in the event that they are absent. Moreover, some software packages necessitate the use of experienced-based criteria in order to produce a satisfactory result.

## **III. MATERIALS AND METHODS**

#### A. Hybrid system modeling:

To model any proposed renewable hybrid power system and meet its design objectives, the main focus is on identifying all system variables and components using appropriate techniques. The next step is to create an objective function that includes all necessary restrictions and variables, as well as components, to make sure that the load requirement is met economically and consistently. The objective function of the optimization problem with its overall system components can thus be determined if the following three requirements are satisfied:

- I. Formulating an objective function that, if the anticipated energy generation from the renewable hybrid systems is not fulfilled, that is, optimizing the system's capital cost and minimizing the kilogram of  $CO_2$  emissions, then, a diesel generator is considered in the configuration to augment energy deficiency.
- II. Selecting the hybrid system configuration's ideal renewable energy mix.
- III. Evaluating the ideal system configuration to ascertain the financial and technological prerequisites for implementing the suggested system configuration for any case study.

Considering Figure 1 as a case study, the effective modeling of the Solar-Wind-Battery system configuration is presented as follows:

#### 1) The Hybrid System's Total Capital Cost:

This is represented by the symbol  $(C^{TC})$  and represents the total of the expenses associated with each of the following parts of the hybrid system:

a- The total cost price of wind energy conversion system: This covers the wind turbine's capital cost as well as installation, inverter, and replacement costs. This is according to Eqn. (1).

$$TC^{WT} = \sum_{i=1}^{M_{WT}} C_i^{C_{WT}} + \sum_{i=1}^{M_{WT}} C_i^{I_{WT}} + C^{V_{WT}} + C^{R_{WT}}$$
(1)

Where:

 $TC^{WT}$  = Total cost of the wind energy conversion system

 $C_{WT}$  = Wind turbine's capital cost

 $I_{WT}$  = Wind turbine installation cost

 $V_{WT}$  = Wind turbine inverter cost

 $R_{WT}$  = Wind turbine replacement cost

i = number of renewable energy sources in Eqt. (1), ranging from {1,2,...,M}

b- The solar system's total capital cost: This includes the capital cost of the solar PV system as well as the costs associated with installation, inverter and replacement. Eqn. (2) provides this.

$$TC^{PV} = \sum_{k=1}^{M_{PV}} C_k^{C_{PV}} + \sum_{k=1}^{M_{PV}} C_k^{I_{PV}} + C^{V_{PV}} + C^{R_{PV}}$$
(2)

Where:

 $TC^{PV}$  = Total capital cost of the solar system

 $C_{PV}$  = Solar system's capital cost

 $I_{PV}$  = Solar system's installation cost

 $V_{PV}$  = Solar system's inverter cost

 $R_{PV}$  = Solar system's replacement cost

k = number of renewable energy sources considered in Eqt. (2) ranging from {1,2,...,M}

c- The battery bank's overall cost: Eqn. (3) provides the value as the total of the battery bank's capital cost and replacement cost.

$$C^{BB} = \sum_{i=1}^{M_{BB}} C_i^{C_{BB}} + C^{R_{BB}}$$
(3)

Where:

 $C^{BB}$  = Overall cost of the battery bank  $C_{BB}$  = Capital cost of the battery bank  $C^{R_{BB}}$  = Replacement cost of the battery bank

Eqn. (4) provides the renewable hybrid system's total capital Cost, which may be obtained from Eqns. (1) through (3).

$$C^{TC} = TC^{WT} + TC^{PV} + C^{BB} \qquad (4)$$

d- Replacement cost: This gives the annual cost value of replacing any system component (s) over the project's duration, as shown in Eqn. (5). (Xiong *et al.*, 2023):

$$C^{RP} = C^{CC} \cdot \delta(\mathbf{r}, \mathbf{y})$$
(5)

where:

 $C^{CC}$  = Capital cost of each component,

 $\delta$  = The sinking fund factors

r = Annual interest rate, y = the system component's lifespan. It is important to note that, as shown in Eqn. (6), the sinking fund factor depends on the system lifetime and yearly interest rate.

$$\delta = \frac{1}{(1+r)^y - 1}$$
(6)

#### 2) Estimation of Output Energy:

The energy production from each hybrid system's component is provided as:

a- Photovoltaic System: Equations and manufacturer specifications can be used to calculate a photovoltaic panel's power output. Eqn. (7) provides the power output from the PV panel:

$$P^{PV} = G^R + A^{PV} + \eta^{PV} \tag{7}$$

where:

 $P^{PV}$  = Power generated by solar panels  $G^{R}$  = Global solar irradiance (kW/m<sup>2</sup>)  $A^{PV}$  = The solar panel's surface area measured in (m<sup>2</sup>)  $\eta^{PV}$  = PV module efficiency

Eqn. (8) provides the annual energy generated by the photovoltaic cells.

$$I^{PV} = P^{PV} \times \frac{9 hrs}{day} \times 365 \, days \, [kWh] \tag{8}$$

where: 9 *hrs/day* is the average assumed sunshine hours per day at the case study site within West African.

b-Wind Energy Conversion System: The wind energy system's hourly power output is represented by Eqn. (9) (Saleem and Abas, 2024; Wang *et al.*, 2022):

$$P^{WEC} = \begin{cases} 0 & V^{W} < V^{ci} \text{ or } V^{W} \ge V^{co} \\ P_{R} \frac{V^{W} - V^{ci}}{V^{r} - V^{ci}} & V^{ci} \le V^{W} \le V^{r} \\ P_{R} & V^{r} \le V^{W} < V^{co} \end{cases}$$
(9)

where:

1

 $P^{WEC}$  = The total power produced by the wind energy conversion systems

 $P_R$  = Wind turbine rated power

 $V^W$  = The wind turbine's speed at hub height (h).

$V^{ci}$	= The wind turbine Cut-in speed
$V^{co}$	= The wind turbine Cut-out speed
$V^r$	= The wind turbine rated speed

Expression (10) (Khan *et al.*, 2022;Alham *et al.*, 2023) provides the wind turbine's wind speed using a power law equation at the hub height (h), and reference height,  $h_{ref}$ .

$$V^{W} = V^{r} \left\{ \frac{h}{h_{ref}} \right\}^{\alpha}$$
(10)

where:

 $\infty$  = The range of the shear coefficient, which ranged between 0.10 to 0.40 (Kim *et al.*, 2021; Finnah, 2022). Eqn. (11) expresses the annual energy generated by the wind turbine.

$$J^{G_{WT}} = P^{WEC} \times 8760 \, (h/yr)[kWh]$$
(11)

c- Battery Bank: The battery bank's state of charge can be ascertained using equations (12) and (13), which consider the energy balance relationship between the battery bank and the hybrid system's overall energy demand.

1- Charging state of the battery bank: The process of charging the battery banks begins when the energy produced by alternative energy sources, such as solar, wind, and distributed generation (DG), exceeds the demand for power. This excess energy must be stored in the battery banks for later use. Eqn. (12) provides an expression for the battery bank's available capacity at hour (h).

$$J^{G_{BB}}(h) = J^{G_{BB}(h-1)} \times (1 - \sigma) + \left[ J^{G}(h) - \frac{J^{D_{M}(h)}}{\eta^{inv}} \right] \times \eta^{BB}$$
(12)

**2-Battery bank's state of discharge:** On the other hand, when the total energy produced by the several sources is not enough to fulfill the load requirement, the battery bank comes in to provide the remaining energy needed. During this process, the battery bank depleted. The battery bank's available capacity at any given hour (h) can be found using Eqn. (13).

$$J^{G_{BB}}(h) = J^{G_{BB}(h-1)} \times (1 - \sigma) + \left[\frac{J^{D_M(h)}}{\eta^{inv}} - J^G(h)\right] (13)$$

where:

 $J^{G_{BB}(h)}$  = Energy produced by the battery bank in hour (h) expressed in kWh.

 $J^{G_{BB}(h-1)}$  = The battery bank's energy production in hours (h -1), measured in kWh.

 $\sigma$  = Battery bank's rate of self-discharge.

 $J^{G}(h)$  = Energy generated in kWh by the renewable hybrid system.

 $J^{D_M(h)}$  = Hourly hybrid system energy demand, expressed in kWh

 $\eta^{inv}$  = Inverter efficiency

 $\eta^{BB}$  = Charge efficiency of the battery bank

The total energy produced in an hour by the renewable energy system is estimated as given in Eqn. (14)

$$J_{G_{RES}}(h) = \sum_{m=1}^{NPV} J_m^{G_{PV}} + \sum_{q=1}^{NWEC} J_q^{G_{WEC}}$$
(14)

where:

 $J_m^{G_{PV}}$  = Energy produced by the photovoltaic modules  $J_q^{G_{WEC}}$  = Energy supply by wind energy conversion devices

m,q = the first renewable component in Eqt. (14) respectively

# 3) Objective Function:

The two objective functions considered in this work are: (1) Minimizing the Levelized Cost of Energy (LCOE); and (2) Maximizing system reliability

(2) Maximizing system reliability.

**a.** Minimizing the Levelized Cost of Energy (LCOE): Minimizing the Levelized Cost of Energy (LCOE) refers to the process of reducing the total cost of producing electricity from the renewable hybrid power system over its lifespan, divided by the total energy output expected over that same period. LCOE is a key metric used to compare the economic viability of different energy technologies.

Minimize 
$$LCOE = \frac{\sum_{t=0}^{T} \frac{C_t^{TC}}{(1+t)^t}}{\sum_{t=1}^{T} \frac{I_{GRES}(t)}{(1+t)^t}} \quad discounted cost} \quad (\$/MWh)(15)$$

Subject to:

$$Maximize R = \frac{J_{G_{RES}(h)}}{J^{D_M(h)}}$$
(16)

Eqt. (16) is subject to the following constraints:

i- Energy balance:

$$\sum (J^{PV} + J^{G_{WT}} - J_{BESS \ LOSS}) \ge J_D(t) \tag{17}$$

ii- Operational limit of renewable energy sources:

$$\begin{cases} J_t^{PV} \leq J_{Max}^{PV} \\ J_t^{GWT} \leq J_{Max}^{GWT} \\ J_t^{G_{BB}} \leq J_{Max}^{G_{BB}} \end{cases} \quad \forall t \in \{1, 2, 3, \dots, T\} (18)$$

Where:

 $C_t^{TC}$  is the renewable hybrid system's total capital cost, including capital, installation, inverter, and replacement costs.

 $J_{G_{RES}(t)}$  is the total energy generated from the renewable hybrid system in in a specific year

 $J^{D_M(h)}$  is the hourly hybrid system energy demand, expressed in kWh

 $J^{G_{BB}(h)}$  is the Energy produced by the battery bank in hour (h) expressed in kWh

d = is the discount rate to encourage the use of renewable energy

t = is the time intervals over the renewable hybrid system's operational life

T= is the lifespan of the renewable system, considered to be 25 years.

 $J_D(t)$  is the total energy demand as a function of time R = is the system reliability

#### 4) Application of Advanced Energy Storage Systems:

Advanced energy storage systems, including Lithium-Ion Batteries, Flow Batteries, Solid-State Batteries, Hydrogen Storage Systems, Compressed Air Energy Storage (CAES), and Sodium-Sulfur (NaS) Batteries, are integral to optimizing dual-mode renewable hybrid power systems by addressing the intermittent nature of renewable energy. These technologies store surplus energy during peak production and release it during high demand, enhancing the reliability and operational efficiency of hybrid systems through consistent power delivery and effective load management. By improving demand response strategies, these storage solutions mitigate fluctuations in energy availability, supporting a stable and resilient supply while optimizing system performance in both grid-connected and autonomous modes. Furthermore, the integration of these advanced energy storage technologies tackles current challenges, such as energy density limitations and long-term storage inefficiencies, paving the way for more robust and optimized hybrid systems. Collectively, these advancements promise to enhance the performance and adaptability of dual-mode renewable hybrid power systems, ultimately supporting a sustainable energy future.

#### 5. Some Research Works on Optimization of HRESs

This section provides a comparative analysis of the current study with relevant research on HRESs, employing a rigorous methodology for article selection. Peer-reviewed publications and conference proceedings were retrieved from reputable databases, including IEEE Xplore, Scopus, and Web of Science, focusing on studies from 2021–2024 to ensure contemporary relevance. Keywords such as "hybrid renewable energy systems," "dual-mode systems," and "optimization techniques" were used with Boolean operators like AND, OR, and NOT for refined searches. Inclusion criteria emphasized studies on dual-mode HRESs, the novelty of optimization techniques enhancing system efficiency and resilience, practical case studies demonstrating real-world effectiveness, and evaluations of operational and economic performance. Non-peer-reviewed or unrelated articles were excluded from total initial search of 134 journals. Titles, abstracts, and full texts were systematically screened, resulting in 66 articles selected for detailed review. This process ensured a comprehensive exploration of advancements in dual-mode HRESs, focusing on their adaptive, efficient operations and real-world applicability.

While previous studies have comprehensively addressed sizing and other technical aspects of HRESs, there remains a need for a holistic survey that integrates social, technical, economic, environmental, and policy factors in HRES deployment, particularly in low-income settings. **Table 1 presents comparative analysis of relevant optimization research works on HRESs** and highlights key studies addressing these factors. Given the Sustainable Development Goals' emphasis on "clean and affordable energy for all," it is essential to discuss affordability for low-income earners. This review fills this gap by examining emerging challenges in offgrid HRES acquisition for households in developing countries, enhancing the field's understanding of HRES potential for universal, affordable, and clean energy.

Maślak Moha Singh													
Comparison Criteria	Liu et al. (2022)	Maiya et al. (2023)	& Orłow ski (2022)	Menesy et al. (2023)	Miracle et al. (2023)	mmed & Ali (2024)	Ramesh et al. (2022)	Nikolai dis (2023)	Shafi et al. (2021)	Shezan et al. (2023)	& Gope, (2021)	Singh et al. (2024)	
Relevance to Dual-Mode Renewable Systems	✓		✓	$\checkmark$	$\checkmark$	✓	$\checkmark$	✓	~	~	✓	✓	
Novelty of Optimization Techniques	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	✓	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Case Study Relevance	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$		$\checkmark$	$\checkmark$	$\checkmark$		
Advanced Control Algorithms	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$		$\checkmark$	$\checkmark$		$\checkmark$	$\checkmark$	$\checkmark$		
Adaptive Configuration		$\checkmark$	$\checkmark$			$\checkmark$	$\checkmark$	$\checkmark$		$\checkmark$	$\checkmark$	$\checkmark$	
Economic and System Performance Evaluation	✓			$\checkmark$	$\checkmark$	✓		$\checkmark$					
High Cost-Effectiveness				$\checkmark$	$\checkmark$	$\checkmark$		$\checkmark$					
Enhanced Resilience	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	·	✓		$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	
Integrated Energy Management	✓		✓	$\checkmark$	·	$\checkmark$	✓	$\checkmark$		$\checkmark$	$\checkmark$	$\checkmark$	
Future Research Roadmap	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark$		$\checkmark$	$\checkmark$	✓			$\checkmark$	
Publication year	$\checkmark$	$\checkmark$	$\checkmark$	$\checkmark\checkmark$	$\checkmark$	$\checkmark$	$\checkmark\checkmark$	$\checkmark$	$\checkmark\checkmark$	$\checkmark$		$\checkmark$	
Peer-Reviewed Status	$\checkmark$	$\checkmark$	$\checkmark$			$\checkmark$	$\checkmark$	$\checkmark$		$\checkmark$	$\checkmark$	✓	

Table 1: Comparative Analysis of relevant Optimization Research Works on HRESs

**Legend:** Double tick: Current-trend significant contribution / Highly relevant recent literature (3 yrs), Single tick: Criteria implemented, Blank: No contribution in that criterion.

From the review outcome, it is evident that there is an urgent need for grid integration as a timely alternative energy solution. The effectiveness of smart grids and microgrids in maintaining system stability is particularly noteworthy, as they facilitate seamless interaction between renewable energy sources and the main grid. This study emphasizes the importance of enhancing the integration methods outlined in the reviewed papers, highlighting their potential for improving operational resilience amid evolving energy demands and climatic variability. By advancing these technologies, we can better address the challenges of intermittent energy supply and ensure a more stable and reliable power system.

# IV. DISCUSSION OF FINDINGS

#### A. Research Key Findings, Implications, and Comparison

The key findings of this work emphasize the effectiveness of Dual mode HRES in optimizing power generation and minimizing operational costs. The comprehensive review of optimization techniques reveals that integrating diverse renewable sources such as PV, Wind, and Hydro etc., enhances system robustness and reliability. This study underscores the pivotal role of Dual mode HRES in achieving sustainable energy goals by mitigating the adverse impacts of climate change and ensuring a stable power supply. Specifically, optimizing HRES not only improves power supply quality by reducing frequency drift but also supports cost-effective energy production. Interpreting these findings highlights the flexibility and adaptability of HRES in balancing energy generation with fluctuating demand. By leveraging multiple renewable sources, HRES effectively manages energy availability variations, thereby enhancing grid stability and reliability. This adaptability is crucial for meeting current and future energy demands sustainably, facilitating the global transition away from fossil fuel dependence.

The implications of the research findings are significant for policymakers, energy planners, and researchers. They highlight the potential of HRES to serve as a cornerstone in sustainable energy transitions worldwide. Compared to existing literature, this research contributes updated insights into evolving HRES optimization techniques. It corroborates previous findings on the benefits of integrating renewable sources, as evident in (Conteh *et al.*, 2021), and highlights ongoing advancements in enhancing system performance and operational efficiency, as documented by (Solomin *et al.*, 2021). Additionally, it recognizes the role of HRES in optimizing consistent power generation, as affirmed by (Reddy *et al.*, 2021), while also focusing on reducing operational costs and improving system reliability, as supported by (Al Hasibi and Haris, 2023).

Additionally, the review affirms the pivotal role of HRES in mitigating climate change impacts and ensuring sustainable energy supply. However, differences in perspectives exist regarding specific operational challenges and regional implementation strategies, highlighting the need for contextspecific approaches in deploying HRES. Dual-mode HRESs are particularly relevant in this context, as they offer enhanced flexibility in both grid-connected and autonomous operations, ensuring a resilient, reliable, and adaptive energy supply in diverse geographical and operational settings.

#### B. Crucial Ways to Mitigate HRES Energy Crisis

The increasing need for energy and the finite supply of non-renewable energy sources, including fossil fuels, are referred to as the "energy crisis." Concerns over environmental damage, economic instability, and energy security have grown because of this situation. The growing population is one of the main causes of the energy issue. Does the demand for energy increase in tandem with the growth of the world population? The population of the globe is predicted to reach 9.7 billion people by 2050 according to the United Nation (Singh and Gope, 2021) which will raise the need for energy to meet necessities like heating, lighting, and transportation.

Economic expansion is one of the main causes of the energy issue. Growing economies are frequently linked to rising energy prices. Energy demand rises as nations continue to industrialize and modernize. The International Energy Agency projects that by 2040, the world's energy consumption will have grown by 30% because of population and economic expansion (Soares *et al.*, 2023). Economic expansion is a significant contributing factor to the energy dilemma. Increased energy use is frequently linked to economic growth.

Renewable energy sources, such as solar, wind, hydro, geothermal, biomass, and tidal energy, offer a practical solution to the energy crisis by increasing the availability of clean, sustainable, and reliable energy. Solar energy is among the most promising forms of renewable energy. It might potentially help the globe reduce its dependency on fossil fuels while meeting a significant portion of its energy needs. According to the International Energy Agency (IEA) forecasts, solar energy might provide up to 16% of global electricity needs by 2050 (Singh *et al.*, 2024).

#### C. Research Gap Assessment

Several researchers have used various approaches to determine the ideal size of an autonomous renewable HRES that consists of diesel generators, PV arrays, wind turbines, and battery banks at various points in time. There have been many studies on optimizing hybrid energy systems using various computational intelligence techniques, including stochastic and deterministic approaches (Shezan *et al.*, 2023). However, there have been few comparisons between simulation tools and strategies inspired by nature. Additionally, there have not been many attempts to create a hybrid approach for maximizing renewable energy systems using various resources to suit rural society's energy needs. Therefore, academia and researchers are urged to focus on these subject areas and beyond to determine the variables and parameters appropriate for a given problem (Maiya and Aithal, 2023).

#### D. Research Limitations

Amid pressing environmental challenges, dual-mode renewable hybrid power systems stand as a promising solution for sustainable energy. However, their effectiveness varies across global regions and climates, necessitating targeted optimization for efficiency and cost-effectiveness. This review highlights key challenges that hinder broader deployment:

I. High initial capital costs limit widespread adoption of HRES.

- 1. Readiness and regulatory differences pose barriers to extensive implementation.
- 2. Social acceptance and supportive governmental policies are crucial beyond technical and economic aspects.
- 3. Safety concerns call for adequate safety measures and upgrades to existing protection mechanisms.
- 4. The inflexibility of autonomous systems to adapt to load changes can risk system-wide failures during significant load shifts.
- 5. Establishing intelligent mini-grids with intercommunicating generators is essential yet challenging.
- 6. Reliable communication between system components requires real-time management frameworks, such as IEEE Standard 1547 and IEC 61850 (Demertzis et al., 2021).
- 7. Transient studies are critical to address stability issues in HRES, especially with variable parameters.
- 8. Government subsidies are pivotal to facilitate HRES deployment.
- Further research on advanced semiconductor technologies, including silicon carbide and gallium nitride, is essential to optimize HRES performance.

Addressing these complexities through innovation and collaboration will be critical to realizing the full potential of dual-mode hybrid systems, paving the way for a sustainable future.

#### E. Future Direction

Future research should focus on addressing key challenges identified in optimizing dual-mode renewable hybrid power systems, particularly in enhancing integration techniques for diverse renewable sources and storage technologies. Developing advanced control algorithms and predictive models to manage energy fluctuations more effectively in dualmode operations is crucial. Furthermore, there is a need to explore innovative approaches in system architecture design, energy management strategies, and economic assessments to maximize system efficiency and cost-effectiveness. Longitudinal studies should assess the environmental and socio-economic impacts of these systems to ensure sustainable deployment and scalability. Collaborative efforts between researchers, policymakers, and industry stakeholders are essential for advancing regulatory frameworks and financing mechanisms that support widespread adoption of dual-mode hybrid systems globally.

#### V. CONCLUSION

In our urgent quest for sustainable energy solutions, dualmode renewable hybrid power systems stand as beacons of innovation and hope. This review highlights their critical role in addressing challenges such as the inherent dependence of HRES on environmental conditions, location, and operational state, which result in voltage and frequency fluctuations that can disrupt sensitive equipment, impair system stability, and affect overall system reliability. Key findings in this work underscore the effectiveness of integrating grid-connected and autonomous operational modes to ensure a reliable power supply and enhance system efficiency. The unique contributions of this research include a comprehensive analysis of optimization techniques tailored for dual-mode systems, advancements in architecture sizing, energy management strategies, and economic evaluations-critical elements for improving system resilience and cost-effectiveness. This work identifies avenues for improving system performance and costeffectiveness, thereby laying a foundation for future advancements in renewable energy solutions. To add value to the work, further research should focus on refining integration technologies, developing advanced optimization algorithms, and addressing socio-economic barriers to widespread adoption. These efforts will be crucial in realizing the full potential of dual-mode hybrid systems and advancing global energy sustainability goals.

## AUTHOR CONTRIBUTIONS

**Ariyo, B.O.:** Conceptualization; Formal analysis; Funding acquisition; Investigation; Methodology; Resources; Software; Validation; Visualization; Writing - original draft; Writing - review & editing.

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