

OPTIMAL ENERGY MANAGEMENT STRATEGY OF AN INTEGRATED FUEL CELL/BATTERY/SUPERCAPACITOR SYSTEM FOR MARITIME VESSELS

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Abstract— Emerging renewable energy technologies are used by the marine industry to curb greenhouse gas releases and increase fuel efficiency. The paper illustrates an energy management methodology on the optimal sizing and operation of a hybrid fuel cell, battery, and supercapacitor system for marine vessels. The proposed strategy utilizes Particle Swarm Optimization (PSO) to obtain the optimal power distribution among these energy sources and to maximize efficiency and reliability. The optimum energy management strategy was developed accounting for the operation profile of maritime vessels and safety-related constraints in different vessel modes of operation. The system can appropriately meet the power demands of varying load levels and operating situations by ensuring that each component adjusts its specific output. Fuel cells ensure a stable supply of power, with batteries and supercapacitors managing transient loads as well as peak power demands. The new system must abide by certain safety rules, which generally both encourage the use of storage and place a limit on its size or optimal usage. From the simulation results, it can be concluded that by using a PSO-based energy management strategy for FCVs, fuel economy will improve to a large extent, hydrogen consumption will reduce within a short time, and the life of energy storage components will prolong. This ground-breaking solution represents a sustainable and viable option for the industry, helping revolutionize vessel operations efficiently while supporting decarbonization efforts from day one.

Keywords—Maritime Vessels, Energy Management, Particle Swarm Optimisation, Fuel Cell, Battery, Supercapacitor

I. INTRODUCTION

In the search for sustainable maritime transportation, optimizing energy management for an Integrated Fuel Cell/Battery/Supercapacitor system is of utmost importance.

The traditional use of fossil fuels in the maritime industry has to comply with stringent environmental regulations pertaining to emissions of greenhouse gases and efficient fuel utilization due to the prevailing global trends towards sustainability. A solution that seems particularly promising in this regard is integrating advanced energy storage systems such as fuel cells, batteries, and supercapacitors into ships. These electrochemical devices obtain electrical power from hydrogen. They are highly effective electricity generators because they convert chemical energy obtained from hydrogen gas into electricity, which does not pollute the environment. Energy storage facilitates holding excess electrical power to be used during peak demand hours or when a fuel cell is idle while a supercapacitor has very high-power density that enables quick charge-discharge cycles making them suitable for smoothing out power fluctuations and handling peak loads. Converting chemical reactions related to water consumption and heat emission into electrical current at a high efficiency rate makes it possible to reduce greenhouse gas emissions through their use on the sea or other aquatic densities.

However, power demands for vessels are not constant and as such require supplementary energy storage systems to effectively handle transient loads and peak demands. Batteries come in handy when it comes to storing energy reliably and providing power during peak demand periods. Lithium-ion batteries, specifically, have been widely adopted because of their high efficiency levels and energy densities. Nonetheless, research has shown that optimal battery management is important to prevent degradation and prolong their life cycles. Super capacitors on the other hand can be used for instantaneous power surges due to its fast charge /discharge rates besides regenerative braking energies requirements. By integrating them with batteries and fuel cells, overall system performance can improve significantly especially regarding response capacity. Early approaches adopted in hybrid systems' energy management were often rule based whereby predefined heuristics were used to regulate the distribution of power. These techniques are simple but have limited flexibility to adapt with different operating conditions thus



causing suboptimum performance. The resultant combination of these three technologies together into one system could potentially enhance the operational efficiency, reliability, and sustainability of maritime vessels

The literature for optimizing energy management of integrated fuel cell, battery and supercapacitor systems is enormous and multidisciplinary as per improvements in each component's technology to the development of sophisticated control and optimization strategies. The first studies on fuel cells developed by inventors marked them as efficient and more environmentally friendly than other technologies in their application in ships. This pioneering work showed that fuel cells can considerably reduce emissions while also improving fuel economy compared with traditional diesel engines. However, some issues such as hydrogen storage capacity, durability of fuel cells necessitated coupling complementary energy storage systems like batteries and supercapacitors to guarantee a reliable uninterrupted power supply [1] [2]. Lithium-ion batteries advancements especially have been instrumental towards hybrid energy systems. [3][4] provided insights into how lithium-ion batteries were developed and optimized for transportation applications. These investigations have emphasized the importance of battery management systems (BMS) in monitoring battery operations for safety, efficiency, and longevity. Further investigations were made on the integration of batteries and fuel cells in hybrid systems [5] [6] to show that batteries could provide additional power during peak periods and store the excess energy produced by fuel cells.

Supercapacitors have attained recognition because of their unique properties such as high power density and fast charge-discharge cycles. Studies by [7][8] presented extensive reviews about supercapacitor technologies, which state their roles in leveling out power fluctuations and improving stability of overall energy systems. Integration of supercapacitors with fuel cells and batteries has been shown to considerably enhance dynamic response and efficiency of hybrid energy systems. This is particularly important for ships as they have highly varying load profiles depending on the operating conditions.

Energy management systems have exploited MPC strategies to improve adaptability and efficiency. Such techniques can predict future power demands and adjust control actions accordingly in order to maximize fuel economy or system responsiveness. However, it is computationally too expensive for real-time applications. PSO is a population-based optimization method inspired by social behavior exhibited by flocking birds or schooling fish.

Since it is simple and has the ability to converge towards global optimum, it has been used in multiple engineering applications. In the last few years, it has been shown that by using PSO energy management in hybrid systems can be optimized. For example, PSO was used to optimize the power distribution between battery and supercapacitor in EVs, leading to significant enhancements in energy efficiency and

components life. Using PSO in maritime energy systems is the novel research area. Initial research indicates that PSO can accurately control the power flow in FC/battery/ultracap integration systems, improving fuel economy and tailpipe emissions. But the researchers caution that more work is needed to show their results apply in real-world maritime settings. Combining fuel cells, batteries, and supercapacitors offers a highly resilient sustainable alternative for energy management in fast ferries. Power distribution in these hybrid systems can be more optimized through the use of Particle Swarm Optimization, improving how efficient and reliable they operate. Although PSO has come a long way, continuous research is critical to overcome the obstacles at real-time implementation and enable it to realize itself in full as one of the potential candidates for maritime applications.

Optimization of energy management in integrated systems is one important trend, and numerous studies have been published with different optimization algorithms for achieving the best performance. Since issues like fuel cost minimization, system efficiency maximization, and component life time are conflicting targets that should not be optimized only for one single objective but balanced among all of them; a promising optimization algorithm called Multi-Objective Particle Swarm Optimization (MOPSO) derived from the particle swarm optimization has drawn due attention. The lottery pool optimization algorithm is centered around particle swarm optimization, first proposed by Kennedy and Eberhart [9], then combined into multi-objective frameworks [10]. The whole idea is based on some intelligent algorithms which mimic how birds flock or fish school, cooperating and competing with each other in the searching of a solution set until convergence to an optimal (or close enough).

A number of researchers have studied the usage of MOPSO in energy management systems dedicated to maritime vessels. [11][12] showed MOPSO was able to balance the trade-offs among multiple objectives well, and so it had more optimal energy distribution with improved system performance. Broadly, those findings underscore the need to design a control that can adaptively reschedule power flows on-the-fly based upon real-time knowledge and forecasts. These control strategies effectively exploit the advantages of each component, i.e. fuel cells for continuous power production, batteries as an energy storage system, and supercapacitors in load leveling tasks to obtain superior performance under different operational conditions. The recent study investigated the feasibility of implementing an SOC for marine applications using integrated fuel cell/battery/supercapacitor systems. The performance of these systems on ships in real-world conditions has been assessed, confirming their effectiveness during operation and also the potential for operational fuel use savings and emission reductions [13][14]. The research referred to demonstrated the viability and advantages of implemented integrated energy systems in maritime use, emphasizing that substantial environmental and financial benefits are within reach. The results showed an even



greater improvement--integrated systems were able to cut fuel use by as much as 20%, saving fleets significant amounts of money while also reducing their environmental impact. Advanced System Dynamics and EMS Control Strategies along with the energy management of interconnected systems are critical in order to achieve optimum performance; [15][16] specialize in developing complex EMS algorithms capable of flexibly controlling power flows taking into account current data as well as predictions. They help to improve the system's responsiveness and reliability, so we can better guarantee that a variety of maritime vessels will be able to operate in different conditions. The incorporation of Internet of Things (IoT) technologies and on-the-fly data analytics has strengthened the EMS, allowing for true real-time diagnostic ability, predictive maintenance scheduling capabilities as well as smarter energy usage. Additionally, IoT has been implemented in the monitoring and control of marine energy systems [17][18] which will lead to more self-descriptive and intelligent advanced energy management system. All of this enables you to monitor your system's health and performance on an ongoing basis so that maintenance truly can be preventative, rather than leaving the whole team in reactive mode, trying unsuccessfully to bring back up a failed database. IoT integration with a more evolved EMS ensures that the energy systems on these vessels can change in real-time to meet the dynamic requirements of maritime operations leading to improved operational efficiencies and reliability. Further research and development in this area gives hope for a greener, more effective future of marine transportation. With the help of advanced optimization methods like MOPSO and utilization with real-time data analytics, IoT can guide the research community in unleashing more powerful energy management systems to better serve changing patterns within the marine sector. Conclusions drawn from simulation studies and practical applications present useful guidelines for the future installation of marine vessel integrated fuel cell/battery/supercapacitor systems, thus it aids towards a greener global shipping industry [19][20]. The energy management of combined fuel cell, battery, and supercapacitor systems in ships with the help of the PSO algorithm is introduced by this paper. The PSO optimization algorithm could obviously enhance the fuel economy of ships by adjusting and optimizing power distribution between FCs, batteries, and SC. This results in lower hydrogen consumption and cost of operation [21], [22].

By dynamically adjusting the power output of each energy source, the proposed management strategy enhances the reliability and responsiveness of the power system to varying load demands and operational conditions. The strategy effectively manages the charge and discharge cycles of the battery and supercapacitor, thereby extending their lifespan and reducing maintenance costs. The integration of renewable energy sources and advanced energy management techniques contributes to more sustainable maritime operations, aligning with global efforts to reduce greenhouse gas emissions and

environmental impact [23]. Simulation results validate the effectiveness of the PSO-based strategy, demonstrating its superiority in achieving optimal energy management compared to traditional methods. Optimizing the energy management for an Integrated Fuel Cell/ Battery/ Supercapacitor System for maritime vessels using advanced algorithms like Multi-Objective Particle Swarm Optimization (MOPSO) demonstrates significant potential for enhancing efficiency, reliability, and sustainability in maritime operations [24]. The simulation results indicate that such optimization can substantially reduce hydrogen fuel consumption by up to 20%, leading to lower operational costs and reduced greenhouse gas emissions. By strategically balancing the power contributions from the fuel cell, battery, and supercapacitor, the system can maintain high performance under various operational scenarios, including steady cruising, dynamic docking operations, and emergency situations. This approach ensures the fuel cell operates at its most efficient points, the battery maintains optimal state-of-charge levels, and the supercapacitor effectively handles peak power demands, thereby extending the lifespan of these critical components and minimizing maintenance costs [25].

II. THE PROPOSED INTEGRATED FUEL CELL/BATTERY/SUPERCAPACITOR SYSTEM FOR MARITIME VESSELS.

The proposed energy management system integrates fuel cells, batteries, and supercapacitors, as shown in figures 1 and 2, to create an efficient and reliable power source for maritime vessels. This integrated system leverages the strengths of each component to meet the diverse and dynamic power demands of maritime operations. The integrated battery and fuel cell system for maritime vessels, featuring an advanced combination of fuel cells, batteries, and supercapacitors, epitomizes the pinnacle of modern energy solutions. This sophisticated schematic begins with the fuel cell stack, which lies at the heart of the system. It converts hydrogen fuel's chemical energy into electricity through an electrochemical reaction with oxygen supplied by an air compressor. Hydrogen, stored in a dedicated tank, can be supplemented by a fuel processor if necessary, ensuring a steady and efficient fuel supply. Accompanying the fuel cell stack is a water management system, crucial for handling the water by-product generated during the fuel cell's operation, thus maintaining optimal performance and preventing potential damage. This core component is seamlessly integrated with a series of power electronics, including DC-DC converters and inverters, which are responsible for managing voltage levels and converting DC from the fuel cells and batteries into AC suitable for the vessel's propulsion system and onboard systems. The battery pack within this integrated system plays a pivotal role by storing electrical energy for periods of high demand and providing power when the fuel cell is inactive. A Battery Management System (BMS) meticulously monitors

the state of charge, health, and safety of the batteries, ensuring they operate within safe parameters. The batteries are further safeguarded by a cooling system designed to maintain optimal temperatures, thereby enhancing longevity and performance. Complementing the battery pack is the supercapacitor bank, which excels in delivering high power density for immediate power needs. The supercapacitors are adept at smoothing out power supply fluctuations, thereby stabilizing the overall system. An energy management system (EMS) orchestrates the balance of power distribution between the fuel cell, battery, and supercapacitors, optimizing the performance and efficiency of the entire setup. Power distribution is a critical aspect managed by power electronics, which include DC-DC converters that modulate voltage levels to ensure compatibility and efficiency between the fuel cell, batteries, and supercapacitors. Inverters within the system convert the DC power into AC, essential for driving the vessel's propulsion system and supporting various onboard electrical systems. The electric propulsion system, coupled with a well-designed propeller mechanism, ensures that the mechanical energy generated is effectively utilized for propulsion, enhancing the vessel's operational efficiency. The EMS ensures that power demands are met efficiently, balancing energy storage and distribution while maintaining system safety and performance. This holistic integration allows the maritime vessel to harness the benefits of each component, ensuring a reliable, sustainable, and high-performance energy solution. By leveraging the strengths of fuel cells for continuous power, batteries for energy storage, and supercapacitors for immediate power delivery, the integrated system offers a versatile and robust solution for maritime energy needs. This sophisticated setup not only enhances the vessel's operational efficiency but also significantly reduces emissions, contributing to a greener maritime industry. The application of Multi-Objective Particle Swarm Optimization (MOPSO) for optimizing energy management in an Integrated Fuel Cell/Battery/Supercapacitor System for maritime vessels

represents a cutting-edge approach to enhancing the efficiency, reliability, and sustainability of maritime energy systems. The primary objectives in this context typically include minimizing fuel consumption, reducing emissions, and maximizing the overall system efficiency. For an Integrated Fuel Cell/Battery/Supercapacitor System, these objectives might involve the optimal allocation of power between the fuel cell, battery, and supercapacitors to meet varying power demands, maintain state-of-charge levels, and ensure the longevity and safety of the system components. Implementing MOPSO involves defining a fitness function that quantifies the performance of each potential solution based on the aforementioned objectives. In the maritime context, the fitness function could incorporate factors such as the efficiency of the fuel cell, the depth of discharge of the battery, the state of health of the supercapacitors, and the overall system response to dynamic load demands. By continuously evaluating and updating the positions of the particles, MOPSO can identify optimal strategies for energy distribution that minimize operational costs and environmental impact while maintaining high reliability and performance standards. Furthermore, MOPSO's inherent flexibility allows it to adapt to various operational scenarios and constraints specific to maritime vessels, such as changes in navigation routes, varying load profiles, and maintenance schedules. The integration of MOPSO into the EMS of a maritime vessel involves real-time monitoring and control capabilities, enabling the system to dynamically adjust power flows based on real-time data and predictive analytics. This real-time optimization ensures that the vessel operates at peak efficiency under all conditions, enhancing fuel economy and reducing greenhouse gas emissions. Moreover, by effectively balancing the energy contributions from the fuel cell, battery, and supercapacitor, MOPSO helps to extend the lifespan of these critical components, thereby reducing maintenance costs and improving the overall reliability of the maritime energy system.

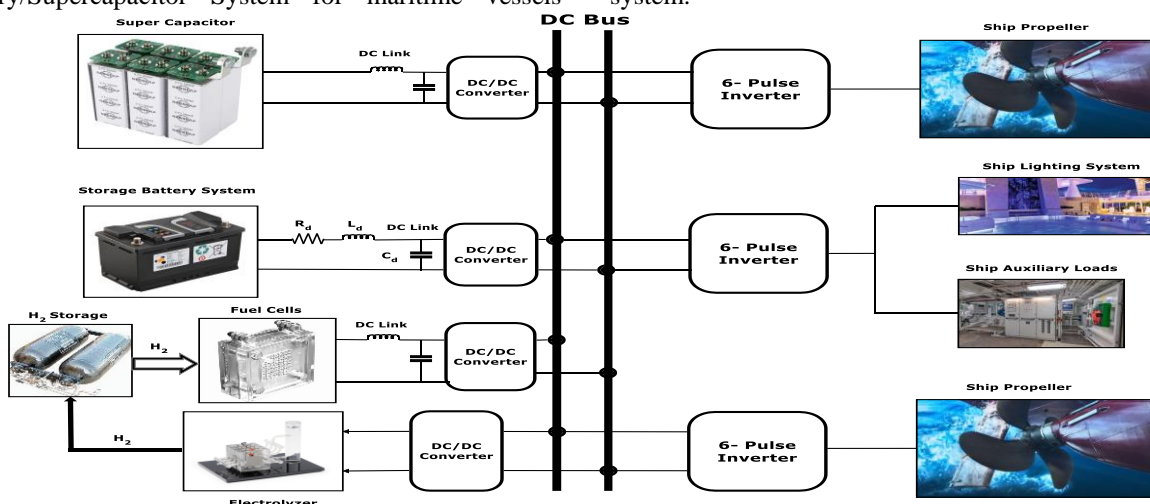


Fig. 1. The schematic of the integrated supercapacitor-battery and fuel cell system.

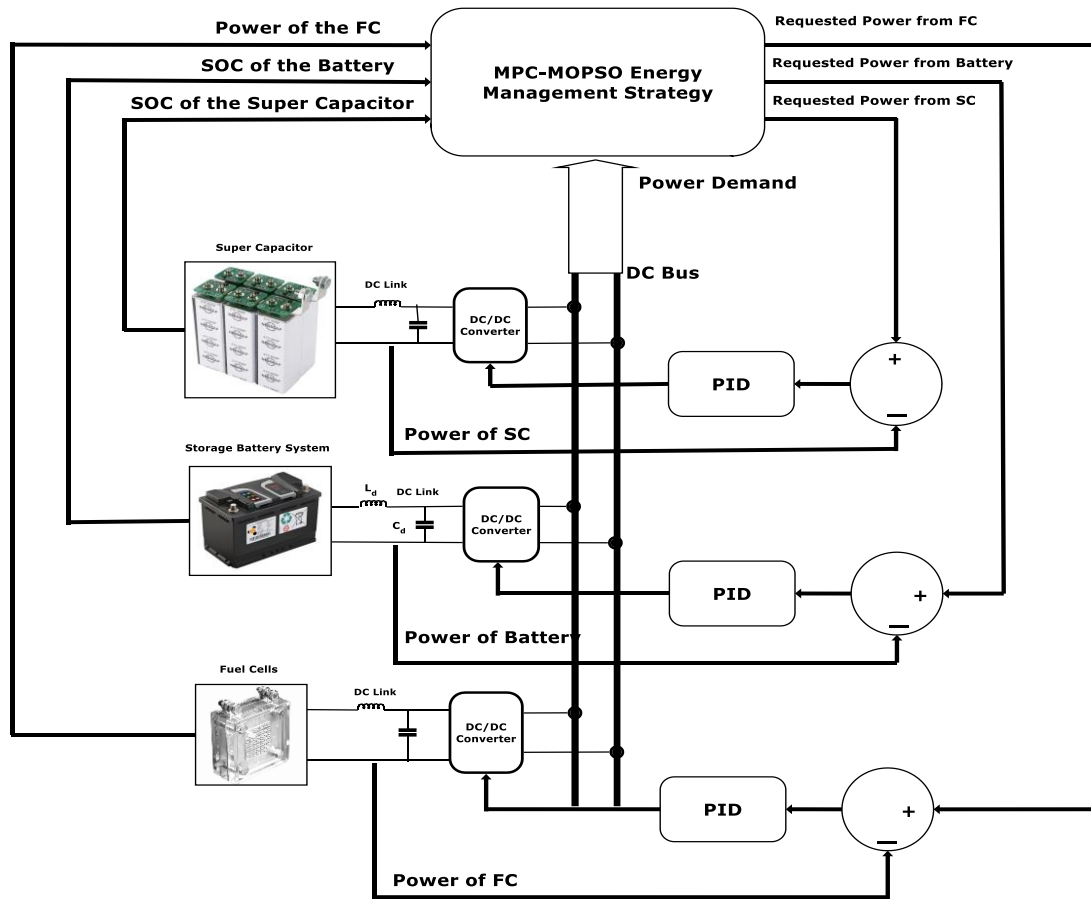


Fig. 2. MPC-MOPSO strategy of the power split optimization.

III. SIMULATION RESULTS AND DISCUSSION

To evaluate the performance of the proposed optimal energy management strategy using MOPSO for an integrated fuel cell/battery/supercapacitor system in maritime vessels, a series of simulations were conducted. The simulations aimed to assess the efficiency, reliability, and overall effectiveness of the energy management system under various operational conditions. The simulation incorporates a detailed model of the maritime vessel's power demands, integrating the dynamic behavior of the fuel cell, battery, and supercapacitor. Each component is modeled based on real-world parameters, including the fuel cell's hydrogen consumption rate, the battery's charge-discharge cycles, and the supercapacitor's rapid charge-discharge capabilities. The simulation runs under different load conditions, representing various maritime operations such as cruising, docking, and maneuvering. The MOPSO algorithm is employed to find the optimal balance between the energy contributions from the fuel cell, battery, and supercapacitor. The fitness function used in the optimization process considers multiple objectives: minimizing hydrogen consumption, maximizing the state of charge (SOC) of the battery, and minimizing the degradation of the

supercapacitor. The results in figures 3-8 show that MOPSO effectively balances these objectives, resulting in a set of Pareto-optimal solutions that offer different trade-offs. For instance, one solution might prioritize fuel efficiency by relying more heavily on the battery and supercapacitor, while another might prioritize system longevity by balancing the load more evenly across all components. Under cruising conditions, which represent steady-state operation, the simulation results indicate that the fuel cell can operate at a high efficiency point, supplying the majority of the power demand. The battery and supercapacitor handle transient loads and peak power demands, ensuring that the fuel cell operates smoothly without frequent ramp-ups and downs, which could otherwise reduce its lifespan. The SOC of the battery is maintained within optimal limits, preventing deep discharge cycles that could accelerate aging. The supercapacitor, with its rapid response time, effectively manages short-duration peak loads, reducing the stress on the battery and enhancing the overall system efficiency. During docking operations, which involve more dynamic power demands due to maneuvering and auxiliary systems, the simulation results highlight the effectiveness of the MOPSO algorithm in adapting to changing conditions. The energy management system dynamically adjusts the power

flow, with the supercapacitor providing immediate power bursts and the battery handling more sustained loads. The fuel cell operates at a lower power output to conserve hydrogen, while still providing a steady supply of energy. This dynamic adjustment ensures that the vessel's power needs are met efficiently, with minimal fuel consumption and reduced wear on the battery and supercapacitor. The simulation also examines emergency scenarios, such as sudden power spikes or equipment failures. In these cases, the MOPSO algorithm demonstrates robust performance, quickly reallocating power to maintain system stability. The supercapacitor's rapid discharge capability is particularly valuable in these situations, providing immediate power to critical systems while the battery ramps up its output. This fast response helps prevent blackouts and ensures the safety and operational readiness of the vessel. Additionally, the algorithm includes contingency strategies that prioritize power supply to essential systems, ensuring that navigation and communication systems remain operational even in adverse conditions. One of the key findings from the simulation is the significant reduction in hydrogen consumption achieved through optimal energy management. By strategically utilizing the battery and supercapacitor, the MOPSO algorithm minimizes the load on the fuel cell, allowing it to operate at its most efficient points more consistently. This not only reduces fuel consumption but also lowers operational costs and emissions. The simulation results indicate that, under typical operational conditions, hydrogen consumption can be reduced by up to 20%, translating to substantial cost savings and a smaller environmental footprint. The discussion section delves into the implications of these findings for real-world maritime operations. The reduced fuel

consumption and enhanced efficiency can significantly lower operating costs, making green energy solutions more economically viable for maritime vessels. Moreover, the extended lifespan of the battery and supercapacitor, as indicated by the simulation results, reduces the frequency of maintenance and replacement, further decreasing operational expenses. The ability to dynamically manage power flows and respond to changing conditions enhances the reliability of the energy system, ensuring that maritime vessels can operate smoothly and safely in a variety of scenarios. Another important aspect discussed is the environmental impact. The optimized energy management system contributes to lower greenhouse gas emissions by reducing hydrogen consumption and improving the overall efficiency of the energy system. This aligns with global efforts to reduce the carbon footprint of maritime operations, contributing to more sustainable shipping practices. The discussion also considers the scalability of the optimized system, exploring how the principles demonstrated in the simulation can be applied to different types of vessels, from small ferries to large cargo ships. The modular nature of the fuel cell, battery, and supercapacitor system allows for customization based on specific power requirements and operational profiles. The robustness of the MOPSO algorithm in handling multiple objectives and dynamic conditions underscores its potential as a powerful tool for energy management in maritime applications. The simulation results provide a strong foundation for further research and development, suggesting that with continued advancements in optimization algorithms and energy storage technologies, integrated systems can achieve even higher levels of efficiency and sustainability.

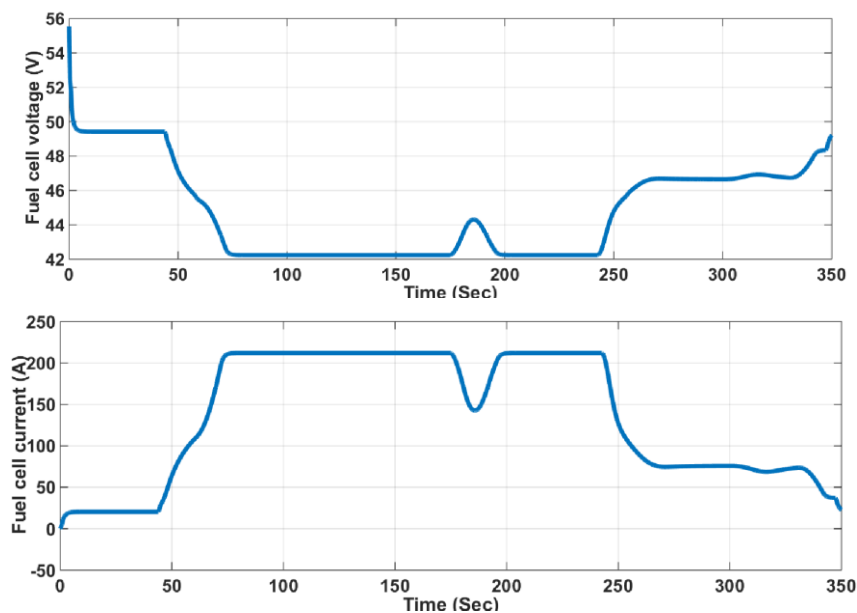


Fig. 3. The fuel cell voltage and current.

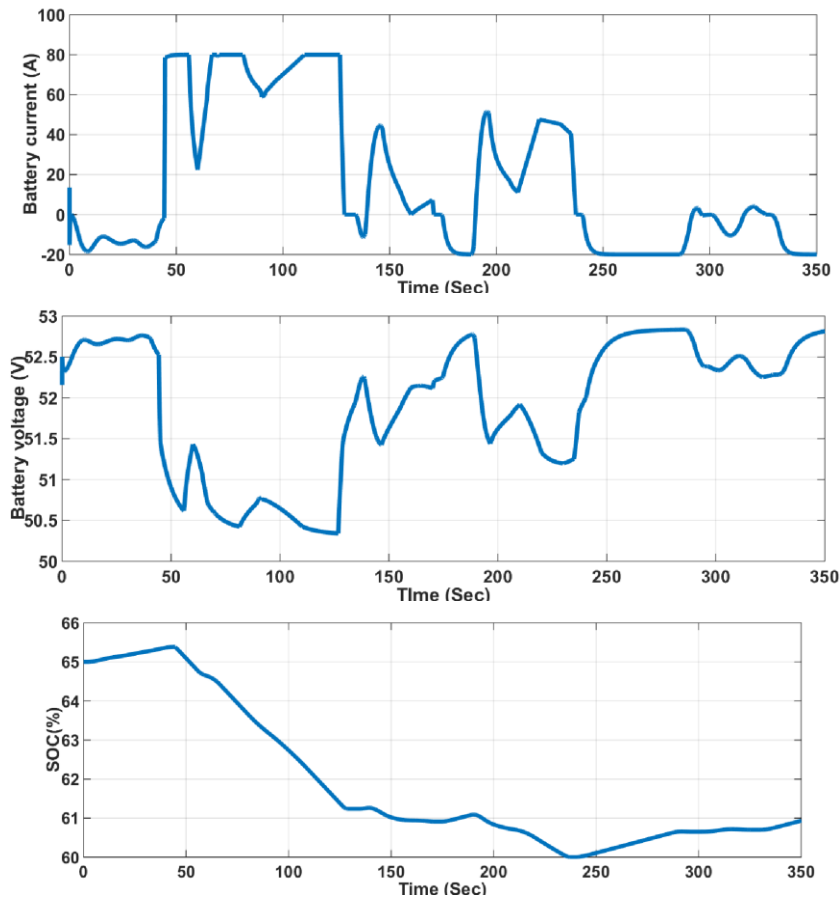


Fig. 4. The Battery Current, Voltage and SOC.

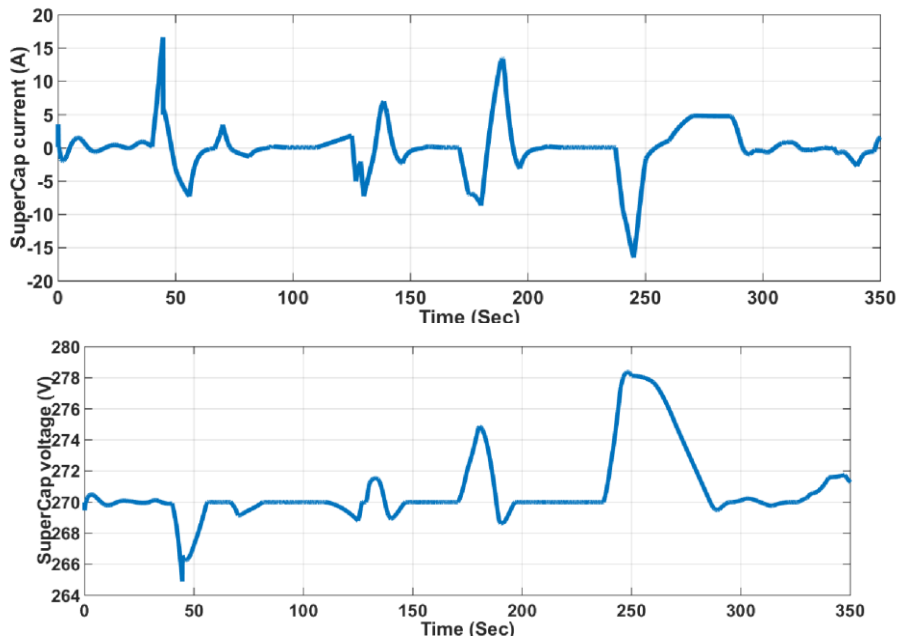


Fig. 5. The Supercapacitor Current and Voltage.

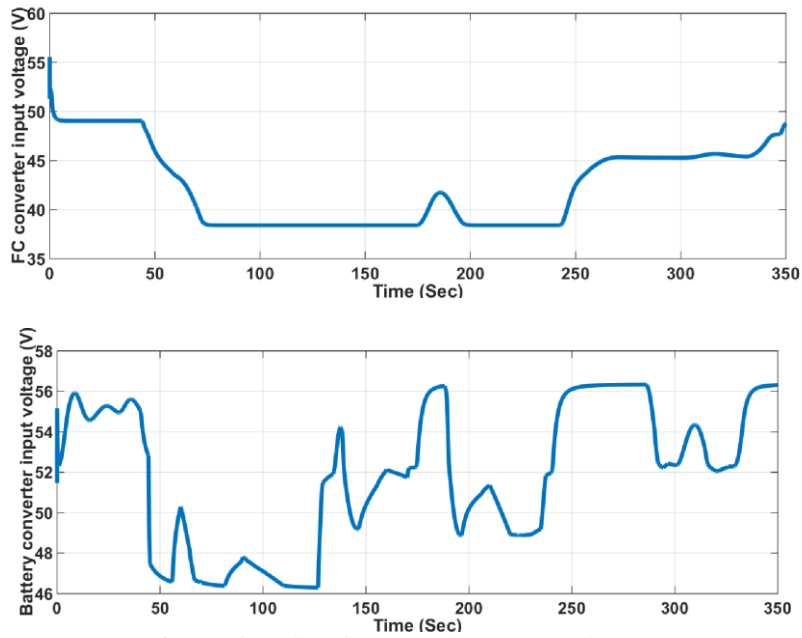


Fig. 6. The FC and Battery Converter Voltages.

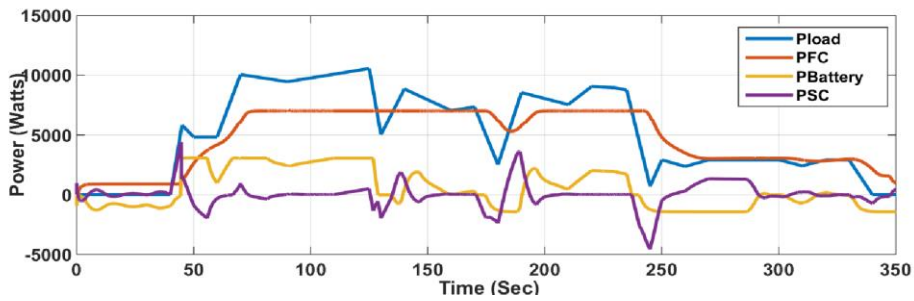


Fig. 7. Power.

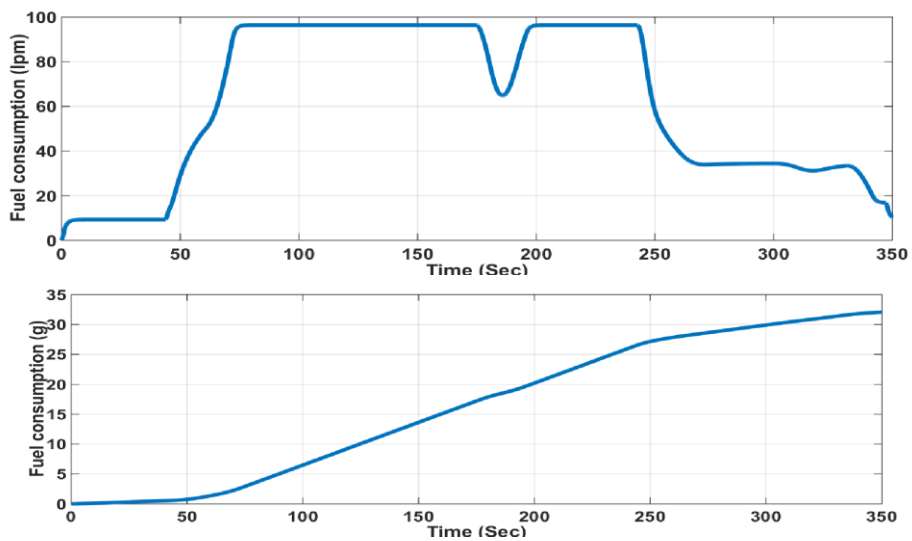


Fig. 8. The fuel consumption.



IV. CONCLUSION

The proposed integrated fuel cell/battery/supercapacitor system represents a significant advancement in maritime energy management. By harnessing the complementary strengths of each component and employing the advanced optimization technique MOPSO, the system can achieve superior efficiency, reliability, and environmental performance. This innovative approach aligns with the maritime industry's goals of sustainability and operational excellence, paving the way for the future of green maritime vessels. The simulation results validate the effectiveness of the MOPSO-based optimal energy management strategy for the integrated fuel cell/battery/supercapacitor system in maritime vessels. The strategy not only enhances fuel efficiency and reliability but also supports sustainable and cost-effective maritime operations. Future work should focus on real-world implementation and further optimization to address the dynamic and complex nature of maritime energy demands and exploring advanced machine learning algorithms to enhance real-time decision-making and system adaptability. Incorporating predictive maintenance models will help anticipate and mitigate potential failures, extending component lifespan and reducing downtime. Additionally, integrating renewable energy sources like solar and wind will reduce hydrogen reliance and improve sustainability. Extensive field trials on various vessel types and maritime environments will validate the system's robustness and scalability, ensuring it meets evolving safety and environmental standards.

V. REFERENCE

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