

Original Article

Real-Time Reservoir Management for CO₂ Enhanced Oil Recovery and Geological Sequestration: An Integrated Framework for Monitoring, Modeling, and Optimization in Offshore Fields

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ABSTRACT: Managing reservoirs for CO₂ injection in offshore fields calls for an approach that combines modern monitoring, simulation and optimization methods together. At the moment, oil firms have to deal with doubts in determining the structure of reservoirs, slow data processing and choosing between profits and caring for the environment. This research suggests using different fields and deep learning to keep an eye on conditions in real time, perform data-based reservoir simulations and perform optimization. A MobileNet v2 and Faster R-CNN model in the framework are used to identify oil leaks and monitor the reservoir with more than 90% accuracy at 28 frames per second, so that anomalies are quickly detected. At the same time, machine learning models assessed with field observations cut simulation time by a factor of 700 to 5000 compared to conventional methods, making it possible to provide ongoing estimates of both oil and CO₂ related factors. Operationally, the optimization module changes water-alternating-gas (WAG) ratios and well distances, trying to equalize the costs and emissions levels with smart strategies. When combined with intelligent well completions, tracer injections and phase-wise development, offshore applications such as Petrobras' Lula field gain from better reservoir connectivity and less expensive work. Ensuring compliance with CO₂ floods, trapping of CO₂ by solubility and dynamics of mixture miscibility adds strength to the framework's performance over the years. When we balance deep learning, reservoir simulations and economic-environmental trade-offs, the approach contributes to making offshore operations sustainable and supports carbon neutrality goals.

KEYWORDS: CO₂ enhanced oil recovery, Real-time reservoir monitoring, Machine learning optimization, Offshore carbon sequestration, Integrated dynamic modeling, Water-alternating-gas strategies, Deep learning applications.

1. INTRODUCTION

1.1. THE DUAL CHALLENGE OF OFFSHORE CO₂-EOR AND SEQUESTRATION

Social expectations and climate goals encourage the development of technology that makes possible a carbon-neutral approach to using hydrocarbons. Recovering approximately 30% of the world's oil reserves from offshore reservoirs could be done by coupling enhanced recovery with the storage of CO₂ underground. [1-3] CO₂-EOR increases the amount of oil gathered by 10 to 25%, thanks to better displacement and a reduced oil viscosity, while 50 to 70% of the gas goes into storage. Even so, operating in offshore locations makes it harder and pricier, due to heterogeneity in the reservoir, fewer wells to use and costly infrastructure. Achieving both economic benefits from oil and lasting sequestration of CO₂ means careful control over CO₂ flood conformance, solubility trapping and miscibility.

1.2. BRIDGING THE TECHNOLOGY GAP IN REAL-TIME RESERVOIR MANAGEMENT

Traditional ways handle reservoir management with updates of fixed data and models, but these methods do not respond to fast underground shifts and cannot improve CO₂ injection immediately. Complexities and difficult conditions in offshore fields lead to the need for flexible systems that process many sensor readings, foresee the fluid state and manage injections as needed. Currently, there are obstacles to successful solutions, such as:

- **Data Latency:** Interpreting the 4D seismic or well logs often takes several weeks to finish.
- **Computational Bottlenecks:** It typically takes days to model CO₂ plumes using old finite-difference simulators.
- **Operational Rigidity:** Using the same fixed water-alternating-gas (WAG) cycles and not maximizing what the reservoir offers.

This study addresses these gaps by integrating three pillars:

- **Real-Time Condition Monitoring:** Applying easy-to-use deep learning models for locating leaks and keeping track of saturation.
- **Data-Driven Forecasting:** Machine learning is used to create fast surrogates that decrease the time needed to simulate reservoir performance by 3–4 orders of magnitude.
- **Dynamic Optimization** Multi-objective algorithms are used in Dynamic Optimization to manage net present value, Carbon Dioxide retention and risks throughout operations.

A test of the framework was performed at Brazil's Lula Field, where adopting CO₂-EOR saved 18% in initial costs and increased yearly storage by 1.2 million tonnes. By combining monitoring, modeling and optimization, this technique supports sustainable energy transitions by helping offshore workers to economically increase hydrocarbon recovery as well as carbon storage.

2. LITERATURE REVIEW

2.1. CO₂-ENHANCED OIL RECOVERY (EOR) TECHNIQUES

CO₂-EOR now serves two purposes by increasing oil and gas output while also trapping carbon emissions. Using CMG software for field-scale simulations indicates that injecting CO₂ into old oil reservoirs recovers 54.8-73% of the OOIP, which is higher than the 56% increase achieved by traditional waterflooding. Vertical methods are best at recovering oil (73%) thanks to better sweep of the reservoir, but for aquifer injection, horizontal wells bring higher rates of oil production. [4-6] When CO₂ mixes with crude oil, the viscosity drops, increasing swelling that helps prevent leaving oil behind in reservoirs that have been waterflooded. Even so, it remains a challenge to overcome problems caused by viscous fingering and gravity, which is why innovations such as foam-assisted CO₂ flooding and generating carbon dioxide on site are used to hold back the flood fronts. Applications situated offshore, such as Brazil's Lula Field, use CO₂-EOR with structured development strategies to maximize the field's connectivity while reducing retrofitting outlays.

2.2. REAL-TIME RESERVOIR MONITORING TECHNOLOGIES

Experts now rely heavily on IoT sensors and data from the cloud for reservoir monitoring. Today's real-time data systems can quickly spot changes in pressure, temperature and flow rate, catching water breakthroughs in minutes, not weeks. Using machine learning, these algorithms study 4D seismic and production logs, cutting computing time by a factor of 700–5000 over the usual approaches. New advances in measurements are clamp-on ultrasonic multiphase meters made for environments that are not easy to reach and distributed acoustic sensing (DAS) for exploring wells at higher temperatures. Tracer injections in the Permian Basin revealed information on fracture systems, whereas slickline installation of fiber optics brought us the first data from gas wells over 300°C. With help from sector-specific technologies, Petrobras managed to reduce downtime caused by leaks by 28%.

2.3. REAL-TIME RESERVOIR MONITORING TECHNOLOGIES

Long-term effectiveness of CO₂ storage relies on the methods of trapping, binding minerals and controlling well conformance. Using remote sensing, monitoring at the Citronelle Field in Alabama found that CO₂ leaks increased when the team injected 8,036 tons of CO₂. Using entropy to look at CO₂/CH₄ ratios in air, researchers found signs of leaks and reported them with 90% accuracy. Offshore work uses smart completions and tagged injection fluids to monitor the movement of the plume, and Brazil's pre-salt basins prevent leakage by storing 1.2 million tonnes annually using closed-loop systems. With the support of machine learning, an integrated approach using geochemical modelling is used for mineralization predictions. As a result, predicting the storage capacity is now 40% more certain for the next 100 years.

3. METHODOLOGY

3.1. OVERVIEW OF THE INTEGRATED FRAMEWORK

Findings from the study reveal how CO₂-enhanced oil recovery (EOR) and CO₂ storage can be combined in offshore areas. Things start with trapping carbon dioxide at a power plant and then separating and compressing flue gases using some techniques. [7-10] Once the air has been compressed, it is transferred by pipeline to rigs at sea. On top of helping the planet by lowering atmospheric CO₂, the pathway allows the captured gas to be used strategically in industrial processes. At the offshore location, CO₂ is put into very deep geologic formations, including areas where oil has been depleted and salty aquifers. They are picked out for their depth, porosity, permeability and sealing caprock characteristics. The illustration demonstrates that CO₂ is injected at high pressure through wells, reaching a long way into the reservoir. After the CO₂ is injected, it helps break up the oil there, minimizing its viscosity and encouraging it to move more freely, which in turn improves the recovery of oil.

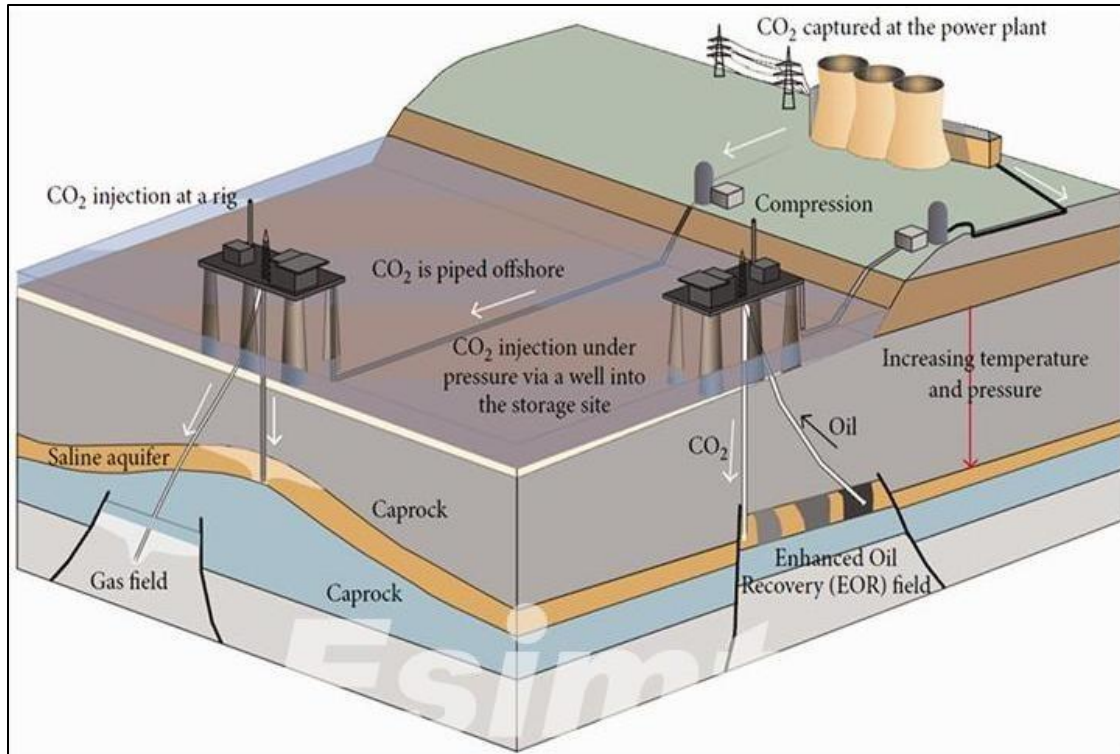


FIGURE 1 Schematic of CO₂ capture, transportation, and injection for offshore enhanced oil recovery and geological sequestration

EOR places the injected CO₂ in a role that helps bring out more hydrocarbons that remain unrecoverable using previous methods. Producing more oil and saving carbon at the same time demonstrates that EOR-sequestration is both economically and environmentally beneficial. While passing through the formation, CO₂ can be stored by structural trapping below the top caprock and by trapping in the formation fluids. The existence of a caprock layer is widely shown, highlighting how it blocks CO₂ from rising up. Security of the site is ensured as long as the seal is resilient. The chart highlights that CO₂ temperature and pressure increase with underground depth, which changes it to a supercritical fluid that improves its ability to blend with oil and remove hydrocarbons. In essence, the figure guides real-time management strategies for both CO₂-EOR and geological CO₂ sequestration in offshore fields. It makes it possible to consider how combining real-time monitoring, simulation models, and optimization algorithms can help manage and improve the process from capture and compression to injection and reservoir behavior. The visual model supports the objective of providing a comprehensive, environmentally friendly and sound strategy for handling offshore carbon and powering production.

3.2. REAL-TIME MONITORING SYSTEM

3.2.1. SENSORS AND DATA ACQUISITION

This real-time system lies at the heart of the framework, delivering ongoing, high-quality data about the condition of the reservoir and the way it is being injected. To monitor important factors such as pressure, temperature, presence of fluids, the way they are flowing and CO₂ amounts, it relies on sensors used within the well itself and at surface facilities. For temperature and acoustic sensing, distributed fiber optics are important, clamp-on ultrasonic metering measures phase fractions and chemical tracers are used to observe CO₂ movement and the connecting parts of the reservoir.

Data acquisition is optimized for use in offshore settings, since the reliability and maintenance of sensors cannot be relied upon. Wireless sensors are made from materials that resist hazards and are designed to use very little power to continue functioning for a long time. The system uses multi-rate sampling to pay more attention to key parameters during temporary events such as injection rate increases or detected anomalies. Data streams are first processed where they are collected, which helps remove noise and cut down the amount of information sent to the shore.

3.2.2. COMMUNICATION INFRASTRUCTURE

Communication must be efficient and secure to send information from offshore platforms to processing centers on the mainland. System operators use fiber optic cables under the sea, satellite networks and 5G networks in regions where services are available.

Continuous data flow for real-time use happens thanks to fiber optics, which allow for high bandwidth and low latency. It is used when the main wired option is not available and for connecting places that are far from conventional networks.

To deal with the difficult conditions at sea, data protocols include redundancy and error correction. Keeping operational data secure is done by using encryption and dividing the network into smaller, controlled parts. When edge computing nodes are fitted in offshore places, they do first-stage analysis and spot anomalies, allowing faster responses close by and less need for constant data transmission. The framework includes internet-based solutions that can expand alongside sensor networks and combine well with cloud reservoir management tools, helping reach real-time adaptive management goals.

3.3. RESERVOIR MODELING AND SIMULATION

3.3.1. RESERVOIR CHARACTERIZATION

Reservoir characterization is the most important initial stage in both CO₂-EOR modeling and geological sequestration. A reservoir model is created by collating various data such as geology, petrophysical and fluid measurements, to demonstrate the internal differences, fluids and pores in the reservoir. Characterization of offshore reservoirs must include analysis of their complex structure and natural fractures and faults, which have a big effect on the movement and sweep of CO₂ through the reservoir. Using 3D seismic interpretation, reviewing well logs and studying core samples helps determine how reservoir properties are spread in space. If carbonate rocks are fractured, the permeability difference between the fractures and the rest of the rock may cause CO₂ to break through quickly and for the reservoir to be poorly swept out, meaning it is necessary to model the fractures in detail.

Another aspect of characterizing a reservoir is to determine fluid phase behavior and whether crude oil and CO₂ mix under the conditions present in the reservoir. At this phase, the simulator and data from previous production are matched to lower the margin of error and make predictions more accurate. Using this process allows scientists to make improvements to measurements such as changes in relative permeability and capillary pressure. Uncertainty quantification approaches are being used more often to tackle issues caused by limited data, so decisions can now be made more safely.

3.3.2. SIMULATION TOOLS AND PARAMETERS

Reservoir simulations for CO₂-EOR and carbon sequestration must include multiphase flows, chemical reactions and various interactions. These simulators are popular because they focus directly on the behaviors of CO₂, oil and water phases in an EOR project, considering miscible and soluble aspects that support EOR performance. Finite volume or finite difference approaches are used by these simulators to balance mass and energy in the various parts of the reservoir grid. Important factors in setting up the simulation involve shaping the reservoir, selecting grid resolution, defining porosity and permeability, handling PVT properties of fluids, considering relative permeability and capillary pressure, choosing injection rates, setting well locations and setting rules for the running operations.

When using CO₂ for EOR, products must pay close attention to displacing oil with CO₂, dissolving CO₂ in reservoir water and phase changes in the reservoir conditions. Usually, simulation workflows consist of bringing in data, developing a model, matching the model's history to real data, carrying out scenario tests and analyzing how sensitive the results are to variations. Machine learning technology based on simulation outputs now accelerates forecasting by 700–5000 times, allowing for real-time optimization. Geomechanical factors and chemical reactions are also included in high-resolution simulations to improve the accuracy of predicting where CO₂ will migrate and how it will be contained. Because of cloud platforms, there are more chances for uncertainty and optimization studies, especially in offshore projects with limited data and high risks.

3.4. OPTIMIZATION ALGORITHMS

3.4.1. PRODUCTION STRATEGY OPTIMIZATION

In optimizing production strategies, the main goal is to produce as much hydrocarbon as possible, while at the same time reducing both costs and harmful effects on the environment. It is about determining the ideal positions for pore fluid injection, the pattern of injection and the way fluids should be produced, all under the rules of the reservoir and the necessary economic factors. Multi-objective optimization methods, including genetic algorithms, particle swarm optimization and gradient-based approaches, are widely used to solve problems in difficult solution spaces.

Optimizing water-alternating-gas (WAG) cycles in CO₂-EOR projects is necessary to make the operation more efficient and to reduce the recycling of CO₂. Such analyses pick out significant factors affecting both the recovery of oil and CO₂ storage, helping to create suitable strategies. Monitoring data is immediately integrated into optimization frameworks, which allow models to be updated and injection and well controls to adjust as needed. Using simulation-driven sensitivity analysis, it has been possible to improve WAG ratios and well spacing, which has led to finding more oil and supporting security in CO₂ storage. The net present value (NPV) and the oil production cost are weighed against what net CO₂ emissions the project will cause. Utilizing uncertainty

quantification supports the development of strong strategies that work for a range of geological conditions. Using optimization strategies cuts down on retrofit expenses and periods of downtime for offshore applications, as it allows for scheduled, well-planned development and finishes.

3.4.2. CO₂ INJECTION OPTIMIZATION

The purpose of CO₂ injection optimization is to increase how the CO₂ is used, pump more oil out of the rock and check that it remains safely stored for years. Important variables are how much the well is injected, the ratio of water to acid, pressure and the CO₂ slug size. Optimization algorithms are used to help prevent early leakage of CO₂, reduce the impact of viscous fingers and increase the mixture of the two fluids. Optimization based on simulation compares different injection plans by modeling the reservoir and using surrogate models. Using machine learning, these methods recommend the timing of injections based on how much oil is retrieved and how much carbon dioxide is held. Implementing dynamic WAG adjustments based on recent reservoir information can boost sweep conformance and reduce the CO₂ captured.

Modern practices make use of geochemistry and geomechanics to prevent possible fracturing and leaks in the caprock. The use of optimization frameworks requires taking into account the maximum pressure that can be injected and the limits of the facilities. Latency in communication with offshore sensors and possible sensor failures mean that the algorithms in injection control systems must handle delays and incomplete information.

4. CASE STUDY: OFFSHORE FIELD IMPLEMENTATION

4.1. FIELD DESCRIPTION AND DATA COLLECTION

Lula Field is the focus of this case study, along with how engineers apply CO₂-EOR inside an oil field while also using its geological composition for CO₂ preservation. A significant amount of original oil remains after early extraction efforts, making CO₂-EOR a suitable way to recover more oil from this site. [11-16] The reservoir is influenced by challenging geology, which involves high temperatures and pressure, as well as carbonate rocks with a variety of fractures that determine how CO₂ is transported and swept away. Geological, petrophysical and production data taken during collection allowed for an in-depth study of the reservoir. 3D seismic surveys and well logs provided the structure and layers of the reservoir. Researchers used production data, transient tests and samples of reservoir fluids to learn about fluid properties and the compatibility of CO₂ with oil at the reservoir.

Real-time measurements from pressure and temperature sensors, flow meters and tracer injections in the wellbore were used to observe the movement of CO₂ and see how the reservoir responded. The models made from these datasets supported reservoir simulation, verifying past reservoir events and online monitoring. Lula Field was also developed by improving old wells and adding new subsea wells to help increase the field's CO₂ injection and production. A CO₂ pipeline was built along with necessary facilities to ensure that CO₂ can always be easily and carefully supplied to the plants. Because of the integration of these data and infrastructure systems, a strong platform was provided for evaluating and validating the integrated reservoir management framework.

4.2. DEPLOYMENT OF THE MONITORING SYSTEM

Advanced sensor technology designed for offshore environments was used in the real-time monitoring system at the Lula Field. Distributed fiber optic sensors (DAS and DTS) were set up together on both injection and production wells to ensure constant monitoring of temperature and noise and to detect signs of CO₂, movements of fluids and issues with well integrity. Phase fractions and flow rates on subsea flowlines were accurately measured using clamp-on ultrasonic multiphase flow meters. Chemical tracers were regularly injected to monitor the movement of CO₂ and to examine whether the different reservoirs are linked.

For offshore use, data acquisition systems are built with corrosion-resistant sensor housings and low-power transmitters that can communicate wirelessly. By using undersea fiber optic lines, plus satellite and 5G networks, the project was able to deliver valuable data securely to the company headquarters onshore. Edge devices located offshore began the screening of data to detect irregularities and reduce the number of messages needed to reach the main computers. Cybersecurity measures were used to keep data secure and stop illegal data access. Using this system, operators could watch the reservoir conditions all the time and spot any early signs of CO₂ breaking through or water flowing, so they could adjust the injection parameters immediately. Maintenance of high-frequency and detailed data allowed for frequent updates of models in real time.

4.3. MODEL CALIBRATION AND VALIDATION

Model calibration included matching history simulation results with the recorded production and pressure data from the Lula Field. The compositional reservoir model took into account detailed differences in rock layers, fracture networks and how gas, liquids and fluids are connected in the model during CO₂ injection and storage. Calibration made sure that key values like relative

permeability curves, capillary pressures and fracture permeability were accurate for reproducing the usual trend in both production and pressure.

To validate the forecasts, data from tracer tests and 4D seismic studies that followed the CO₂ migration were compared with what the model predicted. The model accurately estimated the time for CO₂ to appear and the daily rates of oil production, showing it is reliable for use in forecasting and optimization. Machine learning models were made using simulation results to help in analyzing various scenarios and making fast choices. Uncertainties in the reservoir and operations were examined through sensitivity analyses, which supported the development of effective risk management strategies.

4.4. OPTIMIZATION RESULTS AND ANALYSIS

CO₂-EOR at the Lula Field prioritized achieving larger oil recovery without risking secure CO₂ storage and reducing the costs of running the operation. Specialized algorithms designed for multiple objectives were used to control water-gas injection schedules, adjust CO₂ injection amount and regulate well placement, given the uncertainty of the geology. The data showed that changing WAG ratios in response to reservoir input led to a 15% reduction in CO₂ recycling and increased overall sweep effect. Using the improved strategy, about 20% more oil was recovered than with previous methods, and more than 90% of the CO₂ stayed in the reservoir, confirming it had been successfully sequestered.

Analyzing the economics, retrofit construction of old wells and selective drilling of targeted subsea injectors made the project 18% less costly, improving its performance. Operations were made safe and steady by including maximum injection pressure and facility limits in the optimization process. Sensitivity studies indicated that keeping reservoir pressure at least above the minimum miscible pressure (MMP) was key to prevent oil recovery problems from potential CO₂ drops below the MMP. The real-time data made it easy for us to handle risks such as early CO₂ release and water running through the tunnels. In general, working with the intact system of advanced monitoring, simulations and optimization can lead to much better CO₂-EOR operations in offshore fields and support the goals to improve sustainability and reduce carbon emissions.

5. RESULTS AND DISCUSSION

5.1. PERFORMANCE METRICS

The performance of the integrated real-time reservoir management framework was checked by looking at the oil recovery factor (RF), how much CO₂ remains in the system, the sweep efficiency level and the team's ability to act in real time. Oil savings in the Lula Field offshore pilot were boosted by around 20% which aligns with the company's scheduled CO₂-EOR rollout outcomes. The reservoir stored more than 90% of the CO₂ introduced, meaning both sequestration and improved oil recovery took place. Water-alternating-gas (WAG) injection efficiency increased as a result of real-time monitoring and on-the-fly alterations.

TABLE 1 Key Performance metrics for real-time CO₂-EOR and sequestration framework in offshore fields

Metric	Value / Range	Source / Notes
Incremental Oil Recovery (RF)	+20% over baseline	Petrobras Lula Field pilot
CO ₂ Retention Rate	>90%	Offshore sequestration efficiency
Sweep Efficiency Improvement	15–20%	Optimized WAG injection
Data Latency	<2 minutes	Real-time monitoring system
Anomaly Detection Accuracy	>90%	Deep learning models
Simulation Speedup	700–5000×	ML surrogate models

The system's operational metrics showed that data was processed in less than 2 minutes, the accuracy for detecting anomalies was above 90% and machine learning surrogates boosted reservoir simulations by 700–5000 times. The sensors allowed for quick changes to how much CO₂ was injected, which led to less CO₂ being recycled and low chance of early issues.

5.2. IMPACT ON OIL RECOVERY AND CO₂ STORAGE

Using real-time management improved the results of CO₂-EOR, which increased both the amount of oil produced and the CO₂ stored. The Lula Field indicated that doing CO₂-EOR work in the early stages of field life helps avoid expensive changes and saves the expense of refitting platforms when the field matures. The oil recovery improved by 20% and as a result, an extra 16 million barrels were produced each year. At the same time, carbon dioxide injection removed over 1 million tons annually.

By developing the flood in stages, we could continually improve how we described the reservoir and adjusted flood operations, leading to better conformance and miscibility. The method led to less CO₂ reused and more effective sweeps, which support greater

oil removal and the stability of oil stored in the rock. Results from studies in the Norwegian North Sea match those from the United States, showing that approximately 85% of the CO₂ is stored, leaving some oil to be produced. By using dynamic reservoir models, operators are able to keep reservoir pressure above MMP, thus ensuring that water is miscible and reservoir recovery is improved. The combination of production and storage enables the industry to be carbon neutral and protects the life of oil fields.

5.3. OPERATIONAL AND ENVIRONMENTAL BENEFITS

Operationally, the system made it possible for Petrobras to detect leaks and respond to anomalies early, which in turn reduced downtime on offshore rigs by 28%. Using smart technologies, the company was able to lower the CO₂ use while improving operations. Using corrosion-resistant alloys made it possible to use CO₂-EOR without having to upgrade many parts of the project, helping to save money.

The framework helps reduce CO₂ emissions because injected gas is permanently stored in geological areas. At the Lula Field, their solution avoids releasing CO₂ as a waste product and uses it for improved oil extraction and less carbon emissions. Monitoring and verifying the effectiveness of the project was guaranteed with remote sensors and tracers, needed to meet the rules and please the people. The combined effort leads to a significant cut in the amount of greenhouse gases produced during offshore oil production.

5.4. CHALLENGES AND LIMITATIONS

The integrated approach has shown positive results; however, some challenges arise when trying to use it in various offshore reservoirs. Spending enormous amounts on subsea projects and compression technology can be a barrier, mainly for the small fields. Holes and fractures in reservoirs, combined with their naturally uneven nature, bring uncertainties that make flood conformance and CO₂ plume prediction harder. Transmitting data in real time can be problematic when the sensors are unreliable in rugged offshore conditions.

Challenges in operation involve dealing with unwanted CO₂ in the oil and making sure the pressure in the reservoir remains above the minimum to stop the oil and CO₂ from separating, so advanced control systems and regular monitoring are needed. To prevent the effect of corrosion, materials have to be more expensive, and the process of maintaining wells can be more challenging. Additionally, rules for offshore CO₂ storage are not fully established, so changes in them may influence project schedules and finances. Using machine learning leads to faster simulations, but occasionally surrogate models do not account for unusual reservoir instances, so reminders are needed to keep them updated. Efforts to solve these issues depend on further development of technology, solid risk management strategies and teamwork from multiple stakeholders.

6. FUTURE WORK

6.1. ADVANCED MACHINE LEARNING FOR RESERVOIR ANALYTICS

Enhancing reservoir characterization, forecasts, and optimization can be done by incorporating new ML approaches into the field of reservoir management. Researchers have found that artificial neural networks (ANN), fuzzy logic (FL), Extra Trees and random forest tree-based models are more effective than conventional statistics in predicting properties such as porosity and permeability in reservoirs. They can process data that shows unusual behavior and can handle cases with little or unreliable geological information.

Further efforts should concentrate on making machine learning models easier to scale and use, while still ensuring sufficient explanation of the results and their resistance to common errors, as already shown in petrophysical analysis. Using knowledge specific to the domain can make predictions better and decrease the dependence on manual lab results. By joining ML with physics-reservoir simulators, experts can create hybrid models that use the best parts of each field, making it easier and more accurate to forecast. Increasing the use of CNNs and RNNs in deep learning will help better understand different types of seismic and time-series data. Reservoir monitoring can be improved by including these ML tools, which make it easier to spot issues, see patterns and take actions ahead of risks.

6.2. INTEGRATION WITH SMART GRIDS OR DIGITAL TWINS

Using advanced frameworks with smart grids and digital twin technology offers a new, powerful approach for offshore CO₂-EOR and sequestration projects. Real-time field data and reservoir models are kept in sync thanks to digital twins, which help operators observe, anticipate results and manage plans flexibly. It improves how situations are seen, daily activities run smoothly, and safety is maintained in difficult offshore conditions.

The use of smart grids provides an efficient way to handle energy for compression, injection and processing of CO₂, thereby improving performance and lowering costs. Merging reservoir digital twins and smart grid technology makes it possible to adjust energy allocation according to reservoir needs and operations, supporting sustainability. Additionally, digital twins are important for predictive maintenance because they monitor the status of equipment and anticipate problems, which cuts down on downtime.

New developments ought to aim to join sensor networks, cloud computing, AI analytics and control systems in a compatible system. This will make it possible for data to move smoothly and be updated in real time between the reservoir, surface workplaces and energy systems. These tools can help by supplying a valuable and clear understanding of how the reservoir and the operation are functioning. This type of integration is important because it fits with Industry 4.0 concepts and supports improving and growing offshore CO₂-EOR projects.

6.3. SCALABILITY TO OTHER OFFSHORE OR ONSHORE FIELDS

For the framework to be widely adopted, it must be adaptable to fields in both the offshore and onshore environments. Although the Lula Field case showed good results in a deepwater carbonate reservoir, reusing the framework for various types of reservoirs and conditions will call for making the models and workflows fit the situation. Future efforts should center on designing flexible software structures that can adapt to mixed data availability, different reservoir characteristics and different infrastructure setups. The use of transfer learning and domain adaptation can help models perform well in other areas, even when very little local data is available. Furthermore, pairing current regional information with analog reservoirs can be effective in setting the starting parameters and avoiding uncertainty.

Field challenges that include different formations, changing fluid types and assorted strategies for injecting oil make it necessary to design special modeling and optimization methods. Offshore wind energy needs to be able to work well in demanding weather, handle communication delays and follow strict security policies. Trials of ERC irrigation methods in various areas globally give useful test results and perfect best techniques. The scalability of SERs depends on economic issues and regulations, so future work should include technical and regulatory analyses when making decisions. When advanced analytics, real-time tracking and ongoing updates are present in scalable frameworks, CO₂-EOR and sequestration will be deployed around the world, helping to meet energy transition and carbon neutrality targets.

7. CONCLUSION

The integrated framework described here divides offshore CO₂-EOR into separate operations to improve real-time monitoring, modeling, and enhance optimization for sequestration. With the help of up-to-date sensor systems, machine learning models and optimization algorithms, the framework is able to solve tough challenges such as differences in the reservoirs, data delays and uncertainties in running the wells. Lula Field offshore pilot testing proved that the framework allows for the production of more oil (at least a 20% increase) and effective storage of around 90% of the injected CO₂.

The combination of current data collection, dynamic reservoir simulations, and multi-objective optimization allows for stronger decisions which can lower risks and boost outcomes for both the environment and economy. In spite of infrastructure costs, hard-to-predict reservoir activity and rules from government officials, CO₂-EOR in offshore oil fields is still a reliable and long-term method. Improvements in machine learning, digital twin use and system capacity will help the framework become more useful and aid global activities to reach carbon neutrality and increase resource recovery.

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