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# Evaluation of caprock integrity for underground storage of CO2 in depleted oil and gas reservoirs using machine learning approaches.

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EVALUATION OF CAPROCK INTEGRITY FOR UNDERGROUND STORAGE OF CO2 IN DEPLETED OIL AND GAS RESERVOIRS USING MACHINE LEARNING APPROACH Student Name: Efenwengbe Nicholas Aminaho Student Number: 1600684 Email: e.aminaho@rgu.ac.uk ROBERT GORDON

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# **Background to the Study**

CO<sub>2</sub> geosequestration represents one of the most promising options for reducing atmospheric emissions of CO<sub>2</sub>. Caprock integrity ascertained based on the petrophysical and geomechanical properties of caprock is vital to ensure safe and sustainable storage of  $CO_2$  (Liu et al., 2020).

Shale and carbonate rocks are typical caprock for CO<sub>2</sub> geological storage, but their failure behaviour have not been fully understood due to their severe heterogeneity and anisotropy (Liu et al., 2020). So, it is vital to apply machine learning techniques in understanding caprock behaviour under several conditions.

So far, no study has focused on caprock integrity, using machine learning approach to select best depleted petroleum reservoirs for CO<sub>2</sub> storage using caprock mechanical and petrophysical properties. Therefore, the aim of this research is to evaluate caprock integrity under cyclic stress loadings based on variation in pressure and  $CO_2$  injection temperature.

## **Problem Statement**



Figure 1: Capillary pressure effect in caprock integrity (Source: Espinoza and Santamarina, 2017)

# **Research Methodology**

The research design is based on numerical simulations and machine learning. Machine learning techniques (traditional decision tree and random forest models) were adopted to evaluate effect of pressure variation on caprock integrity. The results are validated with experiments performed by other scholars.

The numerical simulation is based on the experimental results and the idea that upstream pressure develops from CO<sub>2</sub> injection, and water pressure acting in the opposite direction to counterbalance the effect of  $CO_2$  injection pressure.





Figure 3: Data from capillary pressure experiment (Source: Minardi et al., 2021)

# **Numerical Simulation**

The numerical simulation is based on coupled thermal and structural simulation on ANSYS Workbench using results from the experiment.

## **Results Axial Displacement Versus Time**



Figure 4: Effect of pressure variation in caprock on axial displacement during CO<sub>2</sub> injection.

Max Rel Error of 0.2953 (MAPE= 15.6%; MdMRE=12.6%) in Exp & simulation

#### **Axial Displacement Versus Time**



Figure 5: Effect of pressure variation in caprock on axial displacement during CO<sub>2</sub> injection over extended numerical simulation. MAPE= 13.2%; MdMRE=10.8% DTM || MAPE= 12.9%; MdMRE=9.6%







Figure 7: Effect of CO<sub>2</sub> injection temperature variation on axial displacement.



Figure 8: Stress-Strain relationship under varying CO<sub>2</sub> injection temperature Stress concentration (barrier) develops as temperature increases.

# Appreciation

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## References

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### Slide 1. Evaluation of Caprock Integrity for Underground Storage of CO<sub>2</sub> in Depleted Oil and Gas Reservoirs Using Machine Learning Approach . Efenwengbe Nicholas Aminaho

**Further Results**