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Abstract

A global Latin Hypercube sensitivity analysis is carried out to identify **gravitational trapping in marine sediments** exhibiting heterogeneous permeability and variable thicknesses. Based on geostatistical models populated with sediment data from 4 sites in the U.S. Gulf of Mexico, the sensitivity analysis varies: *sediment thickness, mean permeability and porosity, permeability anisotropy, log permeability variance, log permeability integral scales, water depth, CO₂ injection rate, seafloor temperature, and geothermal gradient*. Key parameters, their correlations, and their rankings in influencing CO₂ sub-seafloor injectivity and leakage are identified. Results indicate that *permeability heterogeneity and anisotropy, sea water depth, and sediment thickness can significantly impact CO₂ flow and trapping in marine sediments*. Strong permeability/porosity heterogeneity can enhance gravitational trapping, which acts to deter CO₂ upward migration and leakage through seafloor. When log permeability variance is high, gravitational trapping can be achieved at a water depth of 1.2 km, significantly extending previously identified self-sealing conditions requiring water depth > 2.7 km. Results suggest a far greater areal extent for relatively safe offshore CO₂ storage than previously proposed, with a likely reduction in overall costs associated with shallower emplacement targets.

Gravitationally Stable Storage

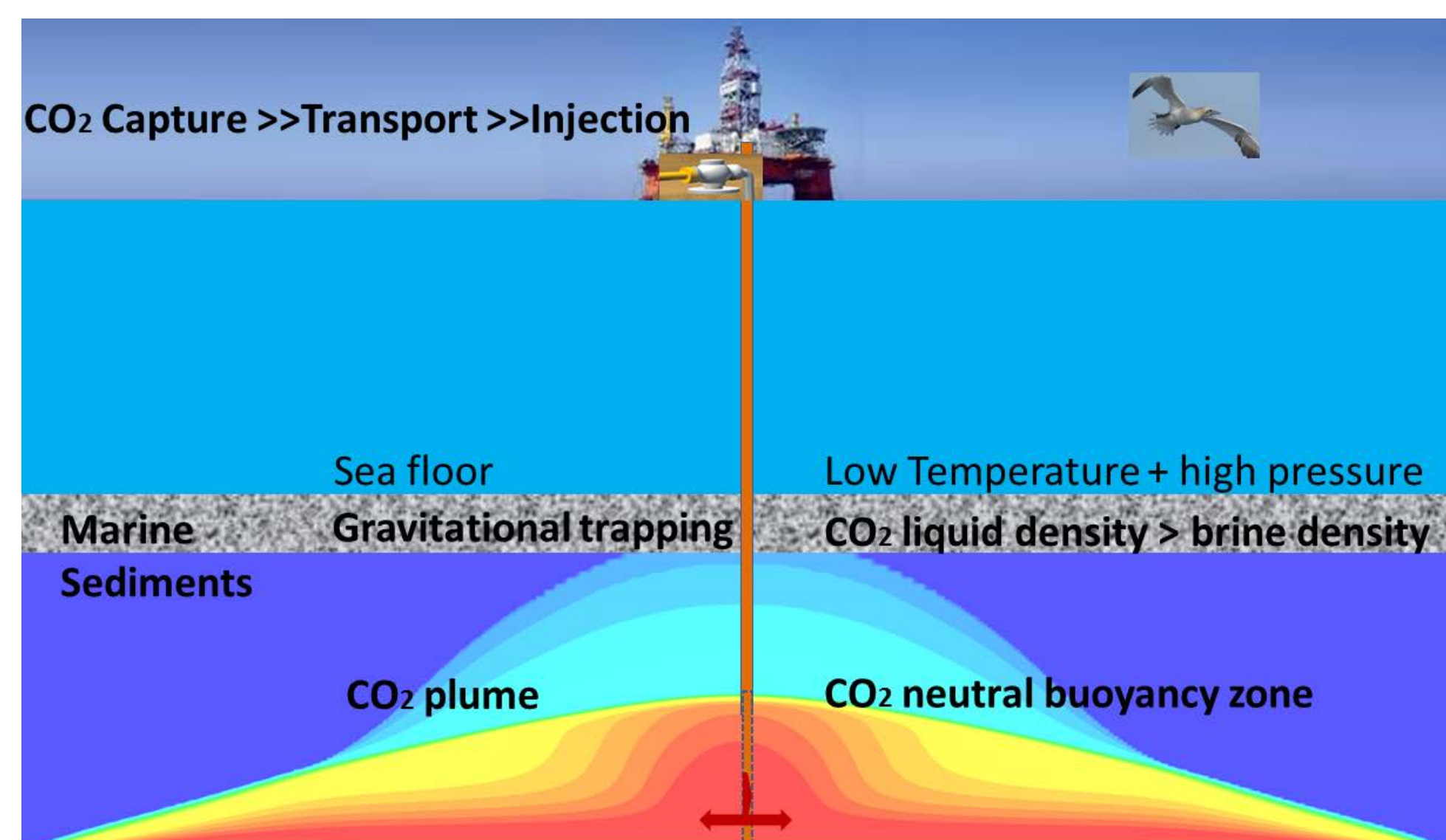


Figure 1. Schematic of gravitational trapping in marine sediments. Under suitable TP conditions, CO₂ density can exceed pore water density, thus the injected CO₂ will move downward until it becomes gravitationally stable.

Gravitational trapping: By injecting CO₂ into sediments beneath the seafloor under suitable temperature and pressure conditions, CO₂ density can exceed pore water density and will sink until it is gravitationally neutral (**Figure 1**). The Gulf of Mexico (GOM) is identified as a potential gravitational trapping site with subsurface data, existing pipeline network, and boreholes. Using fluid flow and sediment data collected from 4 GOM sites (Alminos Canyon, Bullwinkle, Ursa Basin, and Eugene Island; **Figure 2**), this study investigates conditions and key parameters that contribute to gravitational trapping. At these sites, sediments of sufficient thickness, porosity, and permeability exist (**Figure 3**), providing potential reservoirs for sub-seafloor storage.



Figure 2. Select sites from the GOM where sediment data are used to populate models.

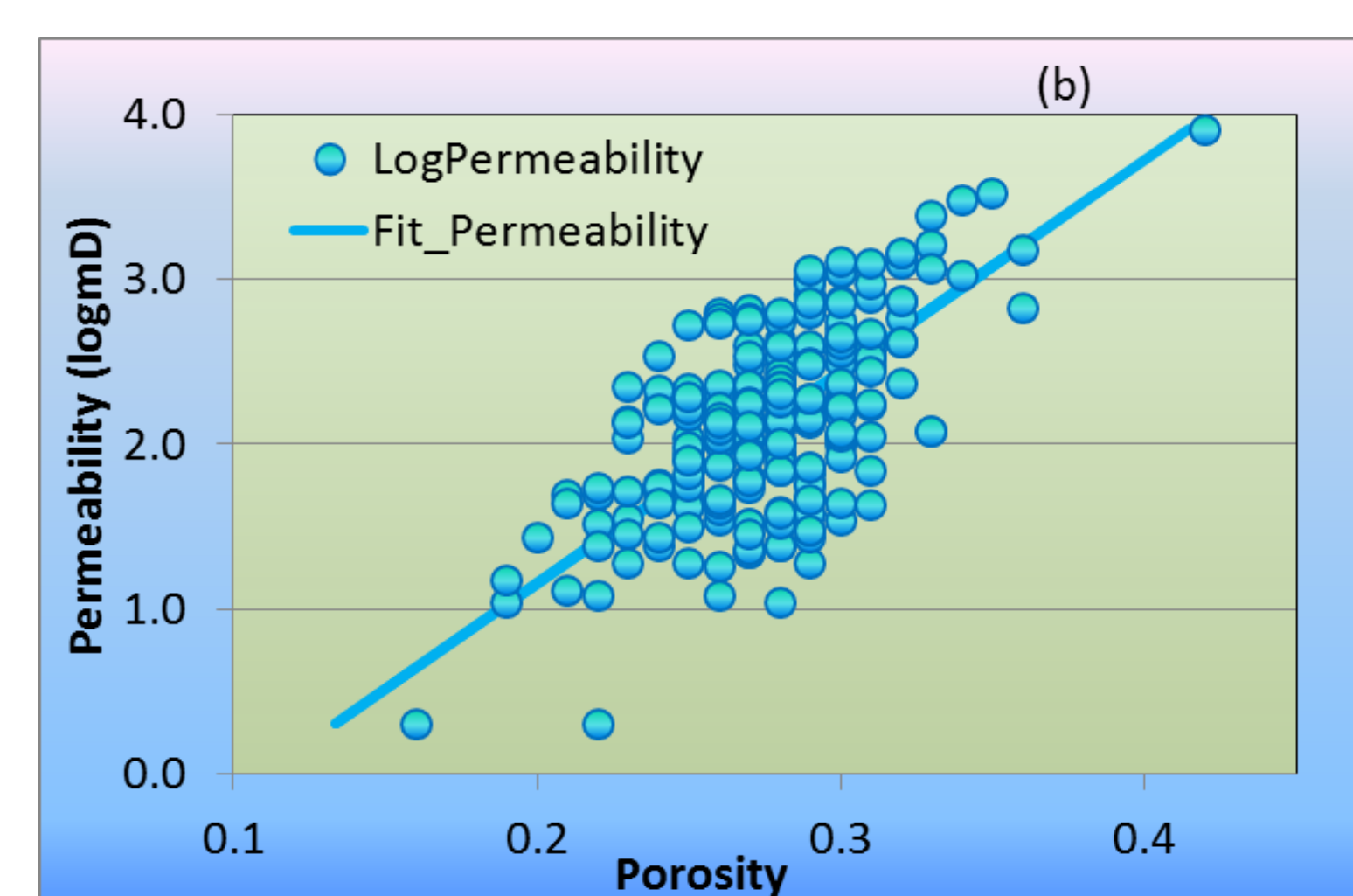


Figure 3. Permeability (k) and porosity (ϕ) of sediments from the 4 GOM sites. A linear regression relation is fitted ($\phi = a + b \log_{10}k$), for which $a = 0.102$ and $b = 0.078$.

Global Sensitivity Analysis

This study conducts a global sensitivity analysis simulating CO₂ injection into marine sediments². Sediment heterogeneity and anisotropy were incorporated at the reservoir scale, while solubility, heterogeneity, and gravitational trapping processes were modeled. Given variable reservoir conditions (i.e., thickness, T , P) and uncertainty in the fluid flow parameters, a statistical framework for identifying & ranking key parameters that influence CO₂ gravitational trapping was developed. Parameters varied include: *sediment thickness, mean permeability and porosity, permeability anisotropy, log permeability variance, log permeability integral scales, water depth, CO₂ injection rate, seafloor temperature, and geothermal gradient* (Table 1). Uncertainty in CO₂ storage and leakage was quantified.

Global Sensitivity Analysis: A computationally efficient technique based on multivariate adaptive regression spline (MARS) with normalized indices was applied to investigating the sensitivities of an output variable (e.g., CO₂ leakage) to variation of an input parameter^{3,4}. MARS is based on computing the variance of conditional expectation (VCE) of an output variable (Y):

		Min.	Max.	Base case	Distribution	
Sediment Property	Sediment thickness (km)	0.005	0.9	500	Uniform	
	Mean permeability (D)	0.001	8	1.0	Log uniform	
	Permeability anisotropy factor	0.01	0.5	0.1	Uniform	
	Permeability variance	0.0	5.0	0/1.0	Uniform	
	Horizontal integral scale (km)	0.5	5.0	1.0	Uniform	
	Mean porosity	0.1	0.42	0.2	Correlated to perm	
	Physical Parameter	Water depth (km)	0.1	4.4	2.5	Uniform
		CO ₂ injection rate (kg/s)	0.002	2.0	0.3	Correlated to depth
		Seafloor temperature (°C)	1	20	2	Correlated to depth
Geothermal gradient (°C/km)		5	50	20	Correlated to depth	

Table 1: Parameter distribution for MC simulations of CO₂ storage in GOM sediments.

$$VCE(X_i) = \frac{100}{s} \sum_{j=1}^s (\bar{Y}_j - \bar{Y})^2 - \frac{1}{sr^2} \sum_{j=1}^s \sum_{k=1}^s (Y_{jk} - \bar{Y}_j)^2$$

where VCE quantifies the variability in the conditional expected values of Y when an uncertain input parameter (X_i) varies in its parameter space. For X_i , s is the number of distinct values sampled from its distribution, and r is the number of replications. $N = sr$ is sample size. Using Eqn. (1), sensitivities of Y to a number of input parameters can be quantified and ranked, representing the relative importance of each input parameter to the prediction of Y . Using the MARS response surface functions, the suite of VCE is then evaluated to generate a prediction envelop of Y given the uncertain input parameters.

Base Case Simulations (Homogeneous vs. Heterogeneous Reservoirs)

Two base cases were simulated using representative parameters from GOM (reservoir thickness = 500 m, length = 5 km). For **base case A**, sediments are assumed homogeneous with a horizontal permeability of 1D; for **base case B**, heterogeneous horizontal permeability distribution is generated with SGS (mean $k = 1D$, $\log_{10}k$ variance = 1.0, horizontal $\log_{10}k$ integral scale = 1.0 km). Porosity in this model is computed from the horizontal k (Figure 3). The remaining parameters of the two base cases are identical. A uniform CO₂ injection rate (0.3 kg/s) is assigned at the bottom-center of the model for 10 years. After injection ceases, CO₂ migration is modeled until 200 years. Results of the two base case simulations are shown in **Figures 4 & 5**. Gravitationally stable storage is accomplished in both cases, although **B** has a more complex plume geometry. The importance of the parameters is then ranked using Monte Carlo simulations of CO₂ injection based on several sets of geostatistical reservoir models populated with GOM reservoir parameters (**Figures 6 & 7**).

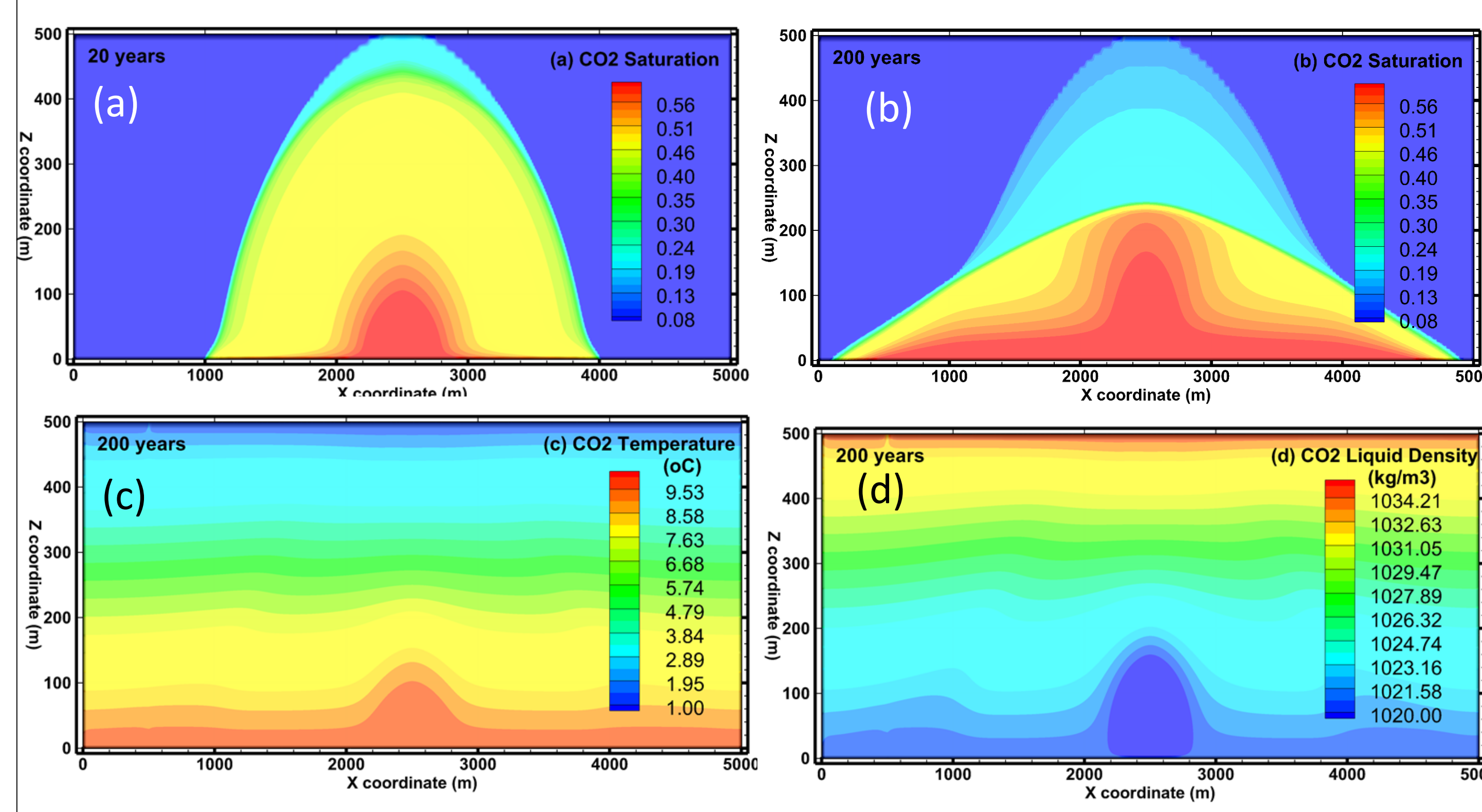


Figure 4. Simulated liquid CO₂ saturation at 20 years (a) and 200 years (b), reservoir temperature distribution (c), and CO₂ liquid density (d) for base case A.

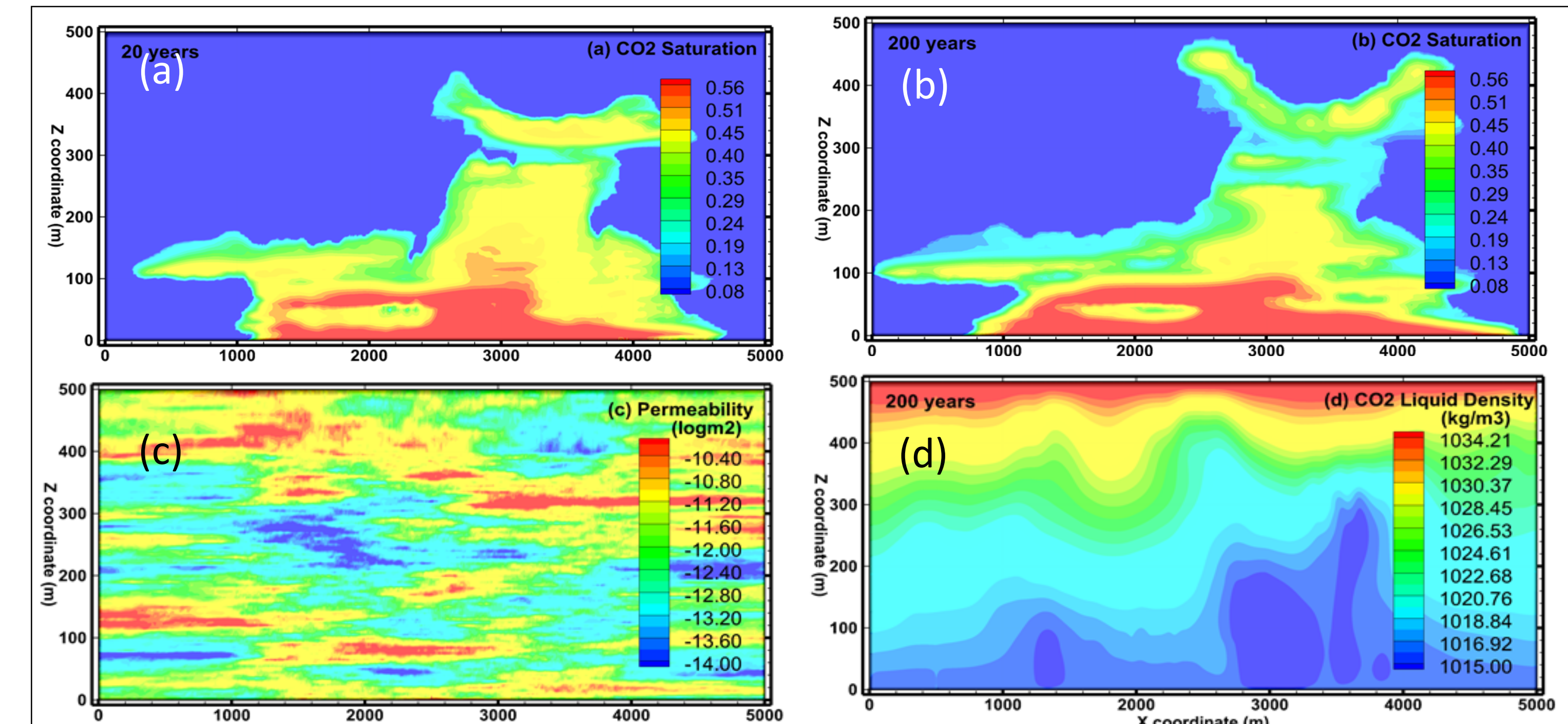


Figure 5. Simulated liquid CO₂ saturation at 20 years (a) and 200 years (b), reservoir horizontal k (c), and CO₂ liquid density (d) for base case B.

Significance Ranking

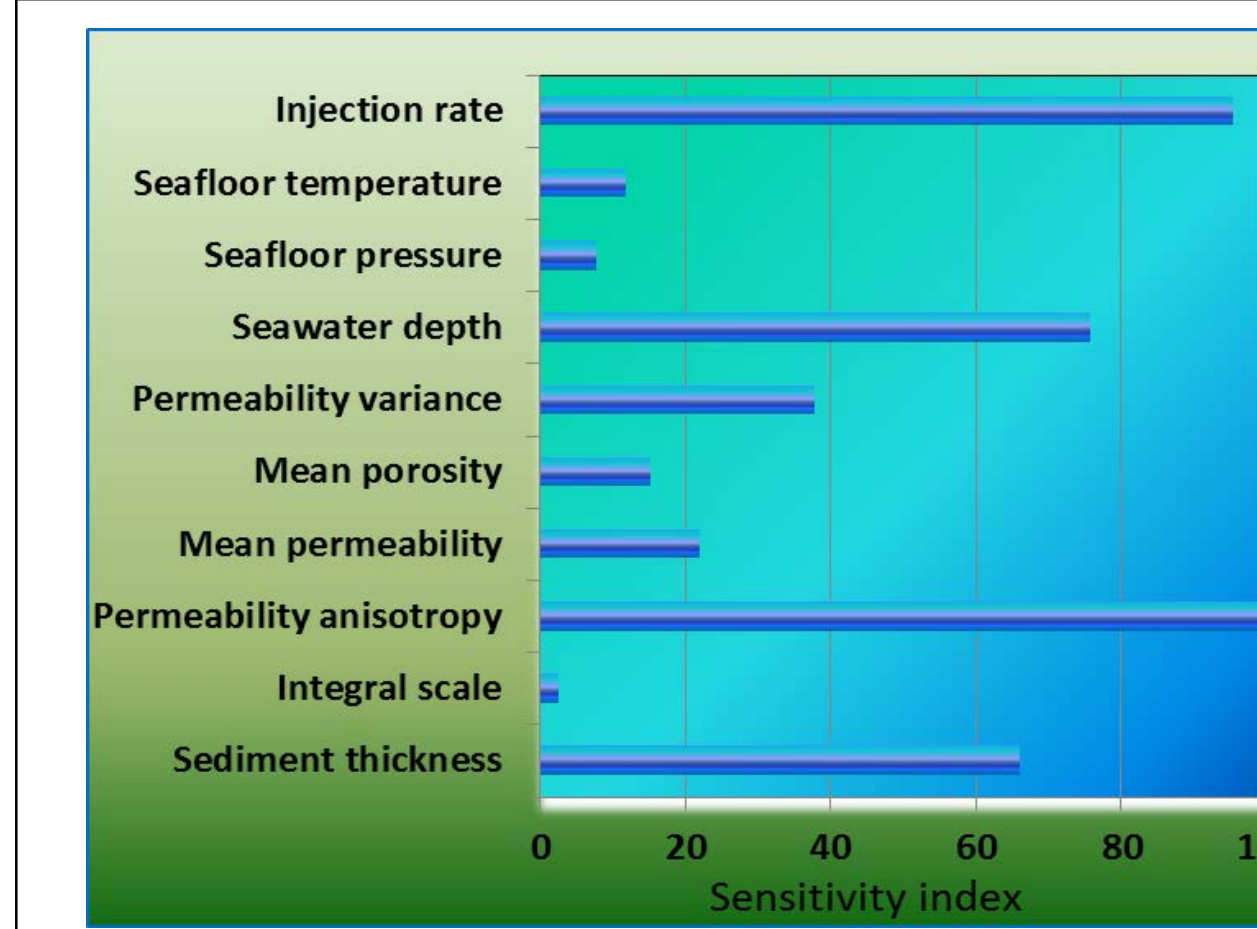
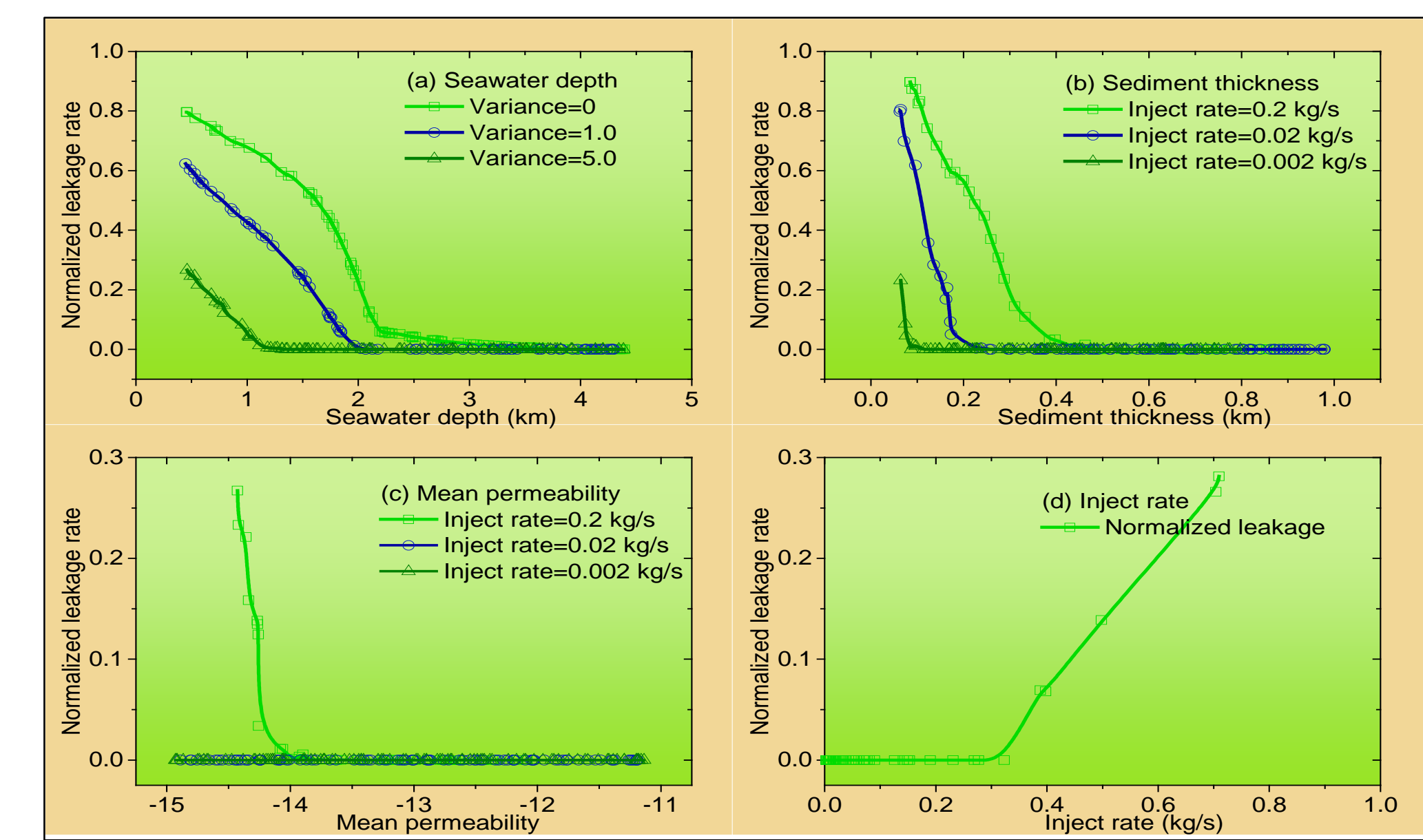


Figure 6. Computed sensitivity index of the output variable (percent CO₂ leakage from reservoir top) to each uncertain input parameter.

Figure 7. Impact of water depth (a), sediment thickness (b), mean permeability (c), and injection rate (d) on the predicted CO₂ leakage onto the seafloor.



Conclusions

This study conducts an uncertainty analysis of CO₂ gravitational trapping in GOM sediments. Uncertain reservoir input parameters are defined based on data from 4 GOM sites. Under conditions representative of such reservoirs, gravitationally stable storage can be accomplished.

- When reservoir is homogeneous ($\log_{10}k$ variance = 0), an approximate water depth ≥ 2.5 km is identified as a threshold for gravitational trapping to occur; when permeability (and porosity) are heterogeneous ($\log_{10}k$ variance = 1.0), water depth ≥ 2.0 km is identified as a threshold; when log permeability variance increases to 5.0, water depth ≥ 1.2 km. This extends the previously identified self-sealing condition requiring water depth be greater than 2.7 km.
- Under increasing injection rate, thicker sediment is required to help deter CO₂ upward migration and leakage onto the seafloor. On the other hand, larger mean permeability and porosity can help sequester more CO₂ safely in the sediments under gravitational trapping.
- Safe storage could be accommodated in GOM sediments with a large thickness, high mean permeability and porosity, and using a relatively low injection rate.

References

- House, K. Z., D. P. Schrag, C. F. Harvey, and K. S. Lackner. Permanent carbon dioxide storage in deep-sea sediments., Proc. Natl. Acad. Sci. U. S. A. 2006, 103, 12291–12295. Li et al. (2013), *Application of a health, safety, and environmental screening and ranking framework to the Shenhua CCS project*, IJGGC.
- <https://fehmlanl.gov/>
- Tong, C., PSAUDE User's Manual (Version 1.2.0), LLNL-SM-407882, Lawrence Livermore National Laboratory, Livermore, CA 94551-0808, May, 2011.
- Friedman, J. H., Multivariate adaptive regression splines. The Annals of Statistics 1991, 19: 1. doi:10.1214/aos/1176347963.

Acknowledgement

This project was funded by the Department of Energy, Office of Fossil Energy, under DE-FE-0009238. The 2nd author acknowledges the support by EES-16 of Los Alamos National Laboratory for her sabbatical in Spring 2015, which made some of the work reported here possible.