

Using Machine Learning and Fluid Flow Modeling to Predict the Response of Marine Sediments around the Cascadia Margin to Gas Formation and Hydrate Dissociation

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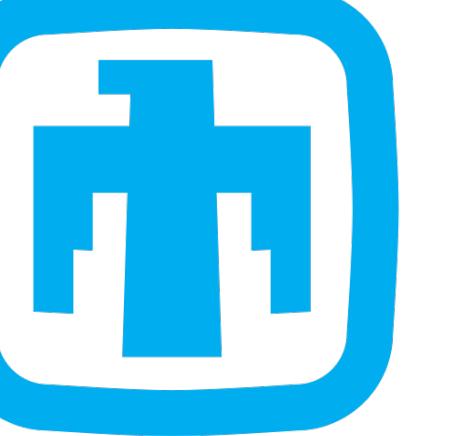
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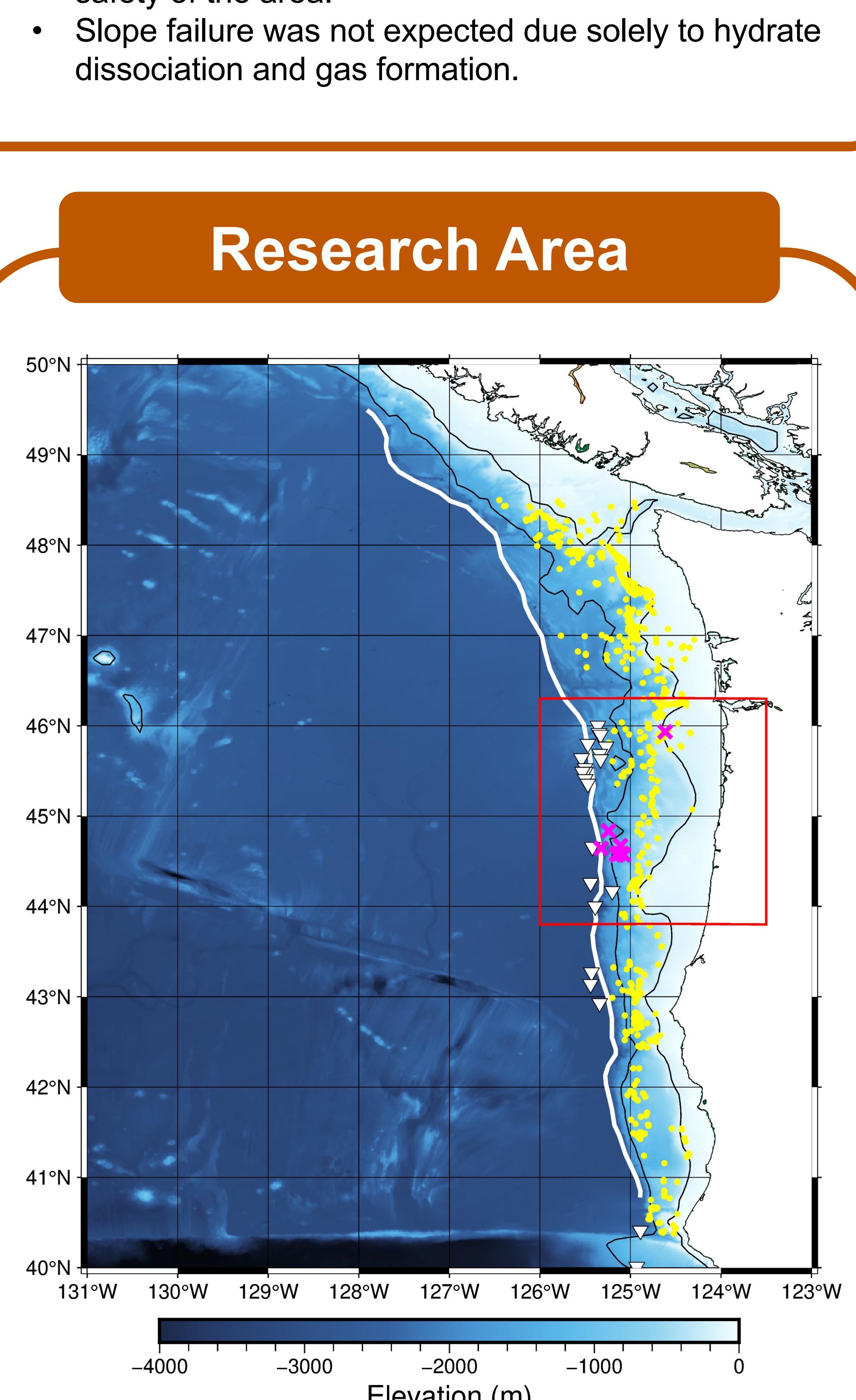
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Key Points

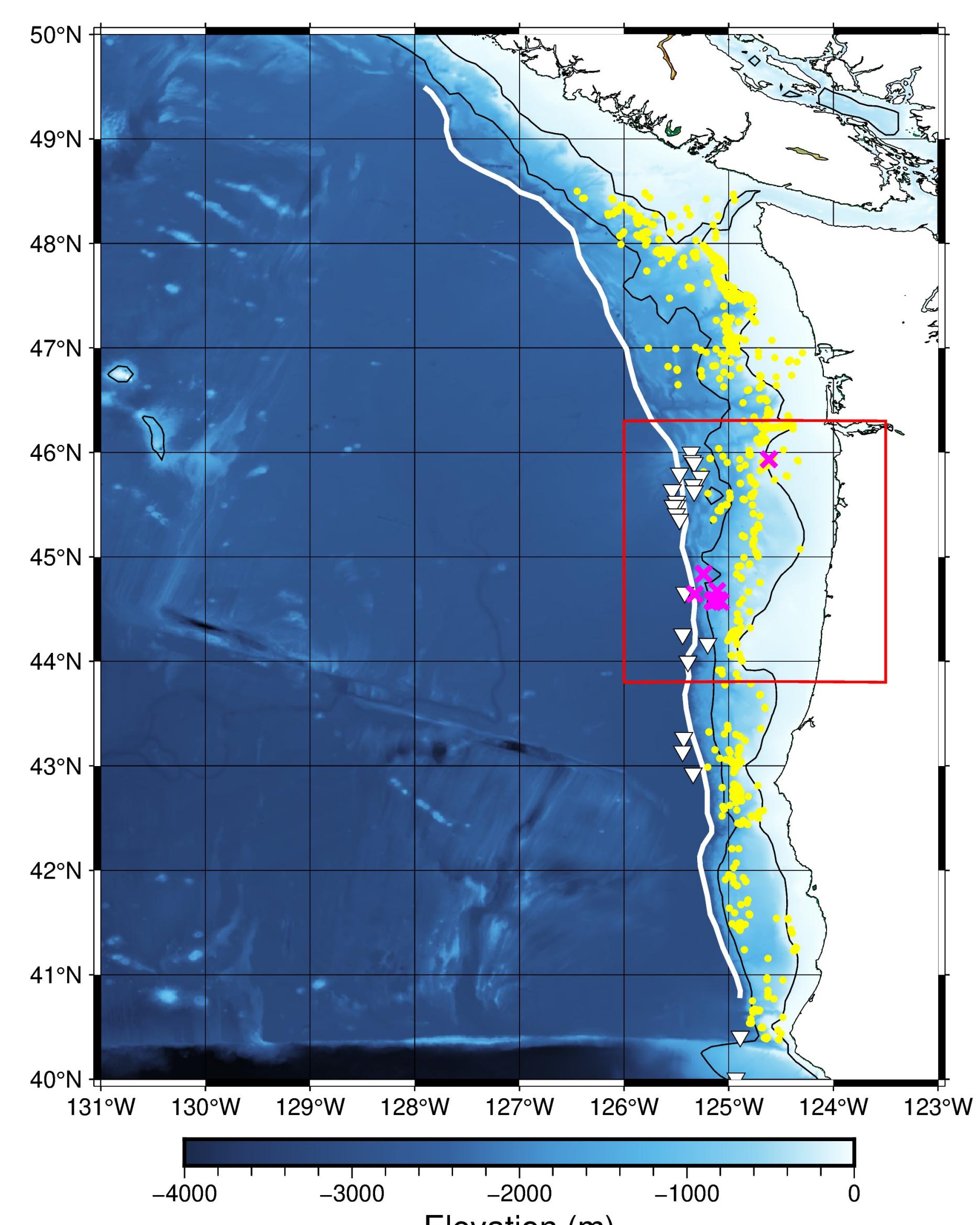
- Cascadia Margin is an active margin with present day gas seeps and a history of slope failure.
- Geospatial machine learning (k-nearest neighbors) was used to predict seafloor properties in this region.
- 1-D sedimentation burial model was used to estimate gas and hydrate development over time.
- Outputs of model were used to calculate factor of safety of the area.
- Slope failure was not expected due solely to hydrate dissociation and gas formation.

kNN Prediction

- Seafloor TOC and porosity predictions were made using k-nearest neighbor algorithms.
- We used grids of seafloor variables compiled by Phrampus et al., 2020 for these predictions. These contained known values of geological, geographic, biological attributes.
- Within the region: 30 known values of seafloor TOC (Seiter et al., 2004)



Research Area



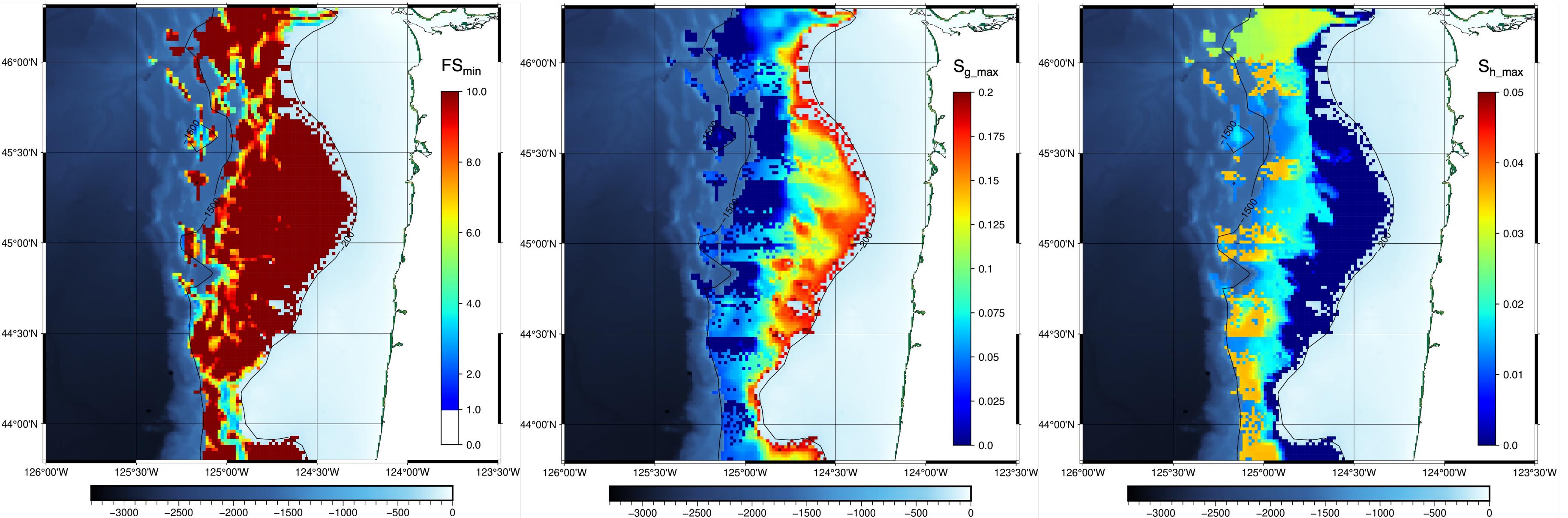
- Yellow dots: gas seeps have been identified near the feather edge of hydrate stability (Merle et al., 2021)
- White triangles: historic slope failures in this region (McAdoo et al., 2000)
- Pink X: ODP and DSDP sites in our area of focus
- Contours at 200 and 1500 mbsl are noted as well as the approximate location of the deformation front (White Line) noted by Phrampus et al., 2017.

Acknowledgments

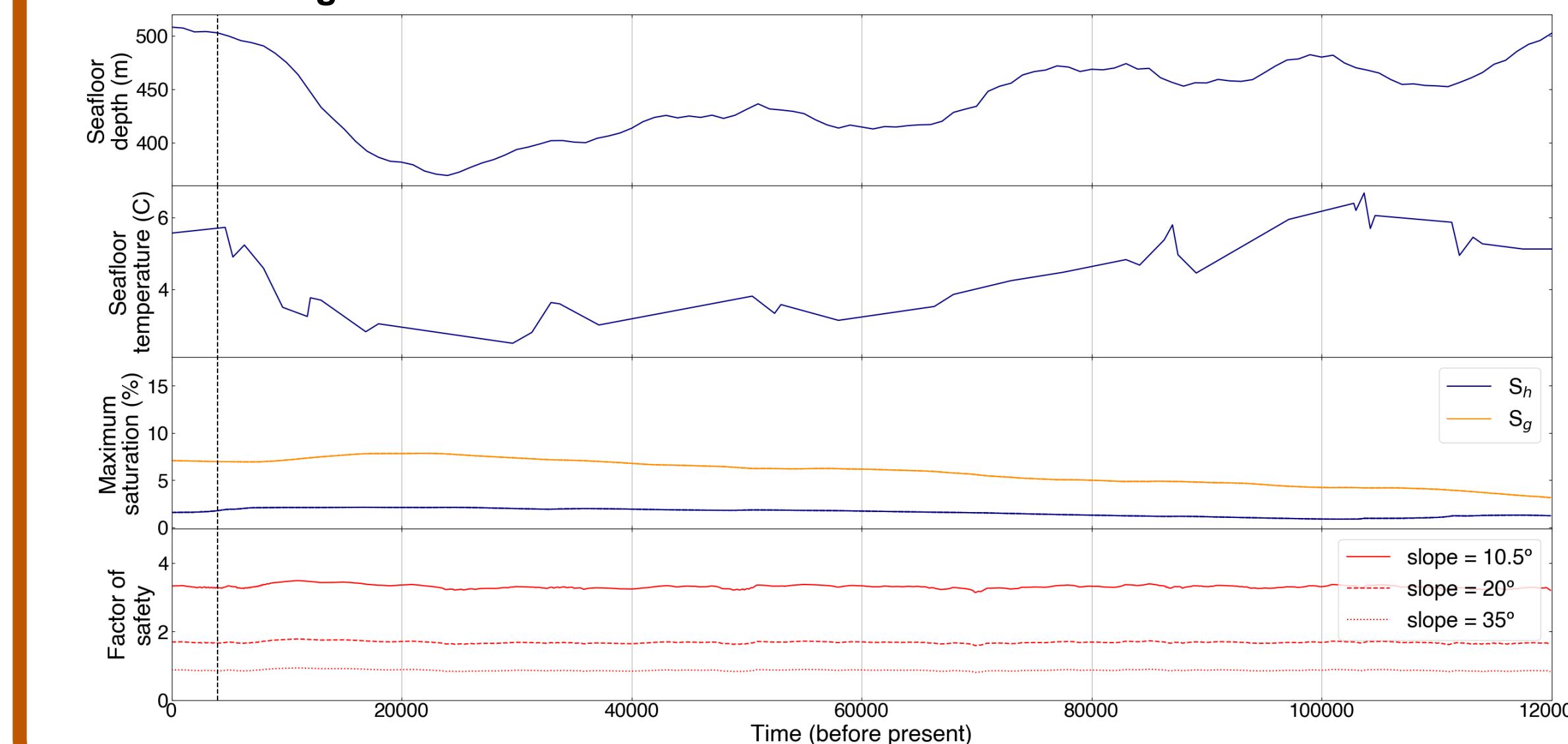
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Saturations and Factor of Safety

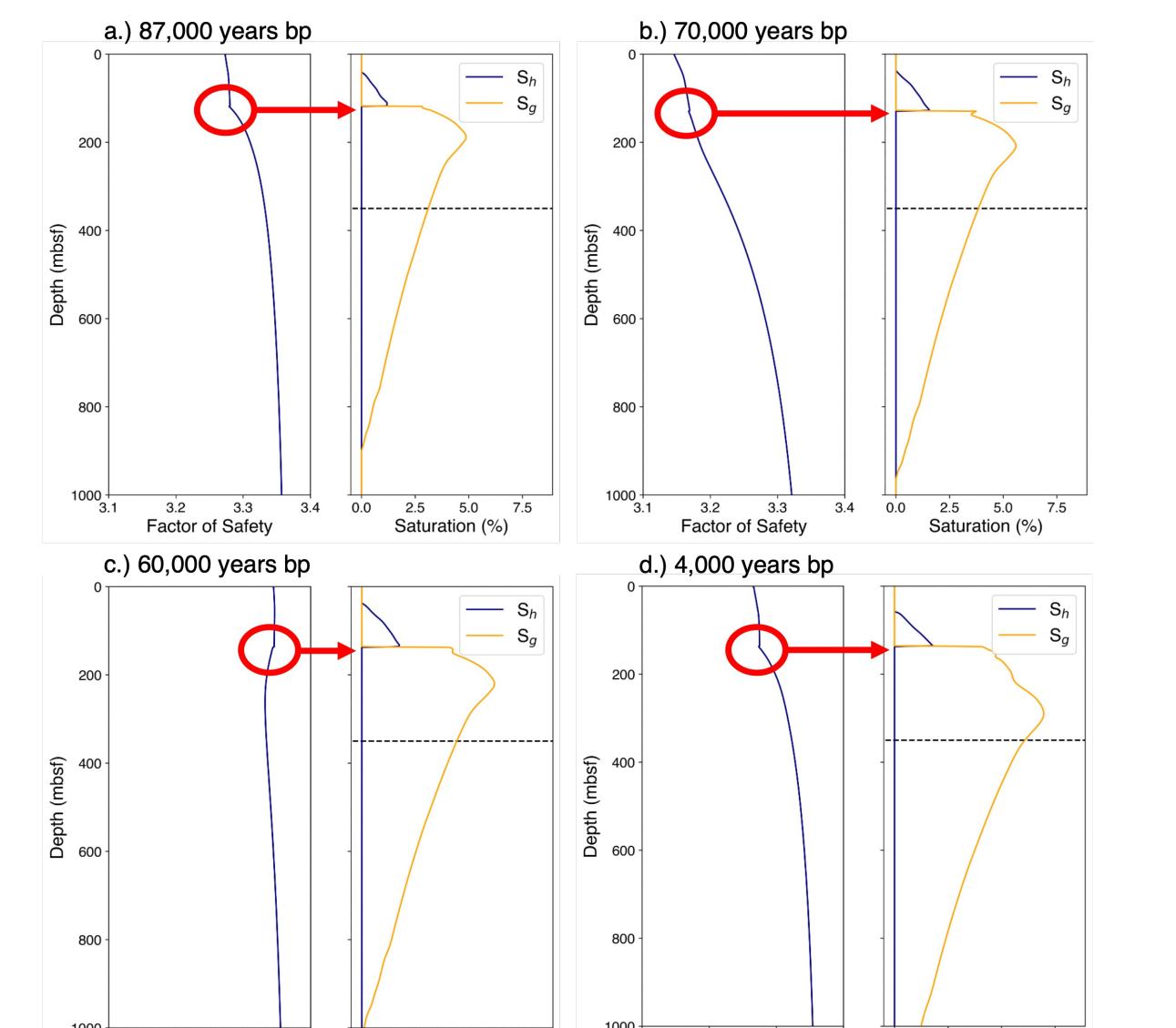
- Between 200 and 1500 mbsl gas and hydrate formation was modeled with a hydrological model (PFLOTRAN).
- FS was calculated from outputs from this model (Stigall and Dugan, 2010): $FS = \frac{c + [(\sigma'_{vh} \cos^2 \theta) - P^*] \tan \phi_f}{\sigma'_{vh} \cos \theta \sin \theta}$



FS, S_g, and S_h trends over time



Looking at different timesteps



Conclusion

- Lowest factor of safety calculations correspond with areas of highest seafloor slope.
- Even in these areas, hydrate dissociation and gas generation alone were not enough to cause slope failure.
- Thus, some other force would be needed to initiate slope failure and landslides in the area.
- As this is an active margin, earthquakes could likely be this instigating factor.
- At the base of hydrate stability, FS decreases, but values along the sediment column are relatively consistent.

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