

# Quantifying Ecosystem Health and Carbon Capture of Coastal Restoration Using Drones and Machine Learning

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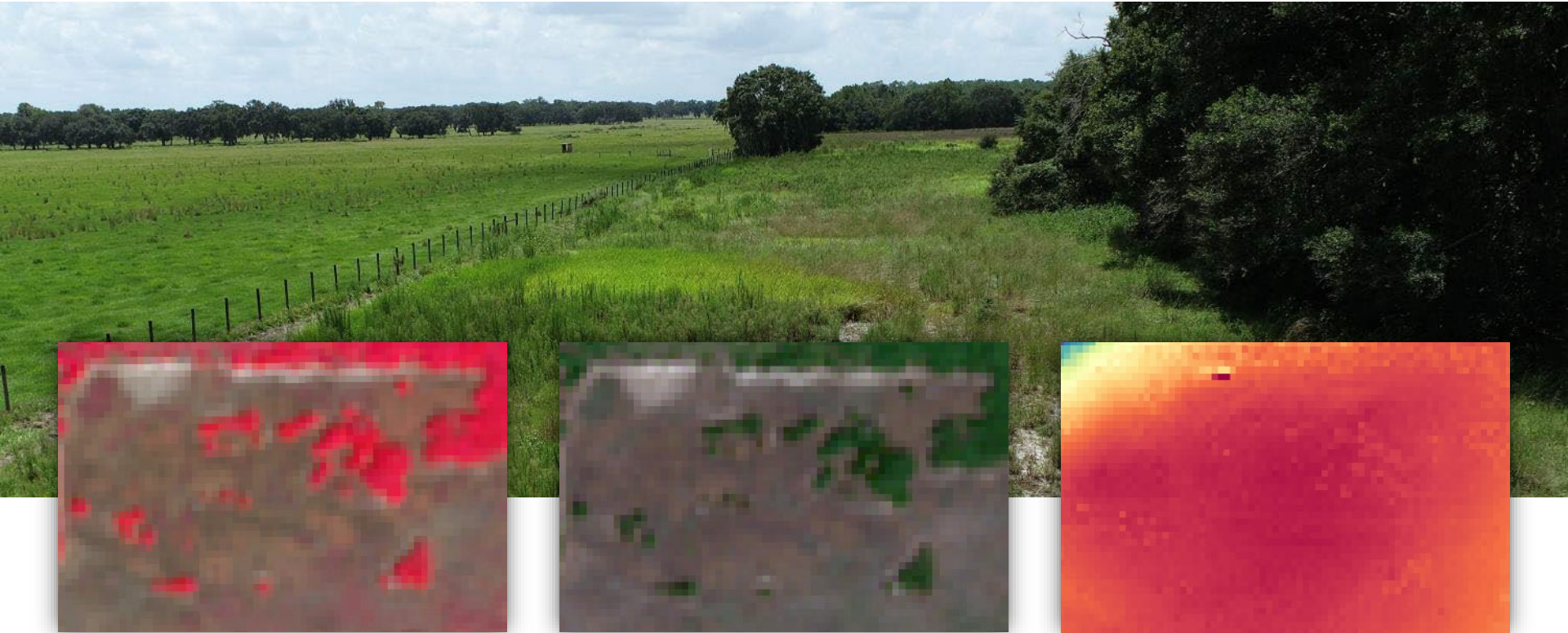
 sky wave™ at 

# Field work is an invaluable but limiting factor.

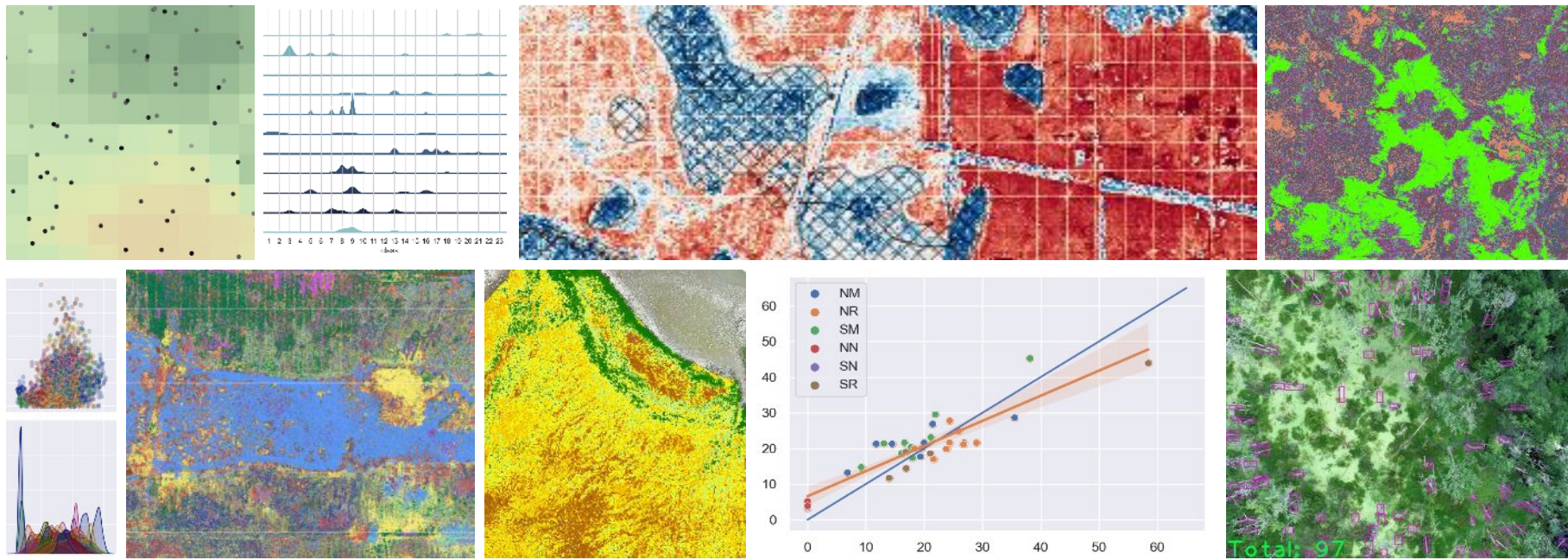




Satellite/plane data is widely available but low spatial or temporal resolution.

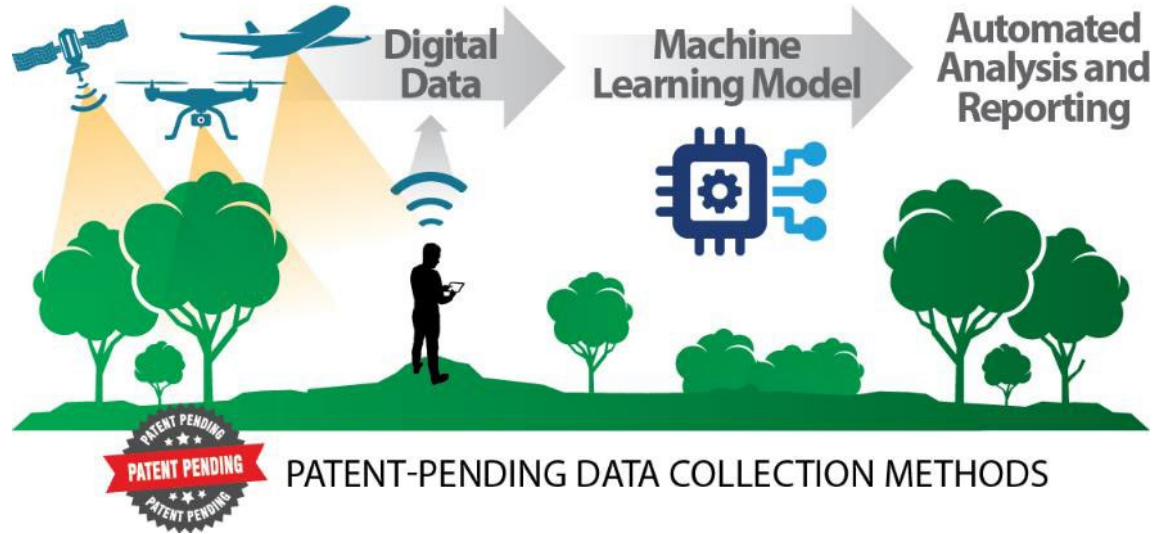


We are finally seeing the promise of machine learning being delivered, but environmental applications are lagging.



# An expert-centered digital pipeline empowers better decisions.

sky wave™

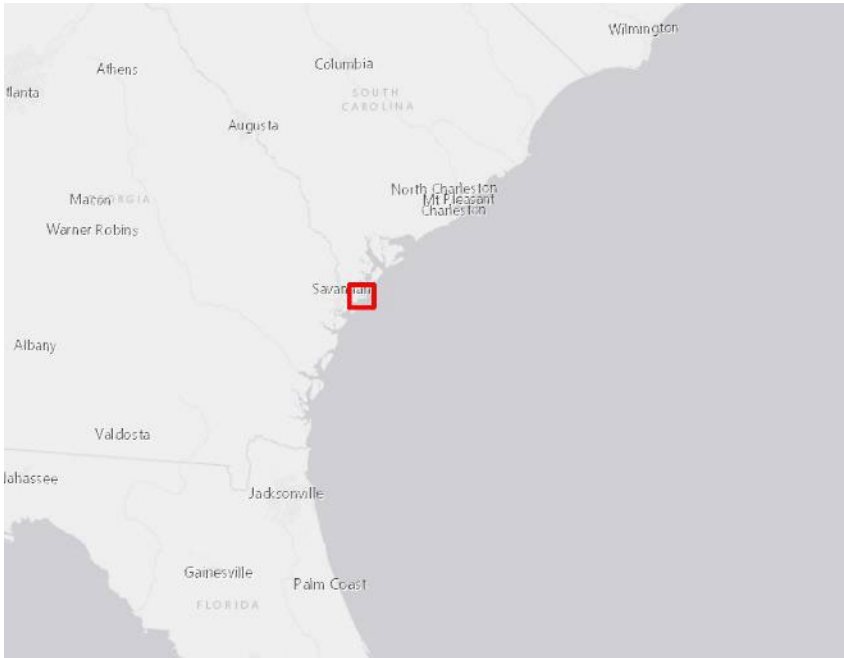


- Surveyors
- Engineers
- Geologists
- Scientists
- FAA-certified drone pilots
- Remote sensing
- Machine learning

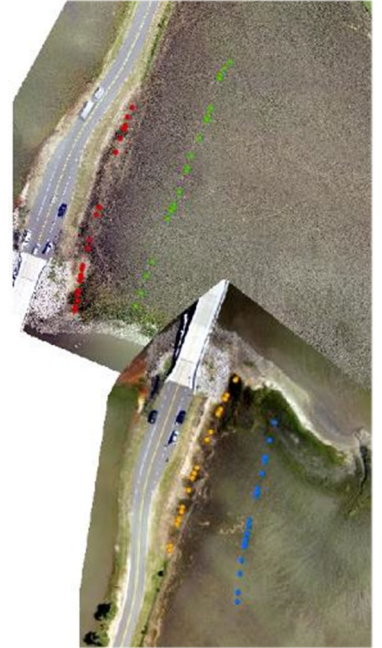
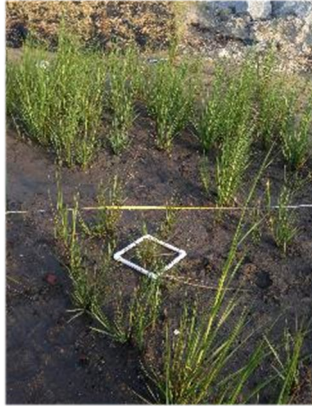


# Restoration: Tidal marsh biomass assessment

- How do we assess restoration success after remediation or construction?



# Established approach for tidal marsh biomass



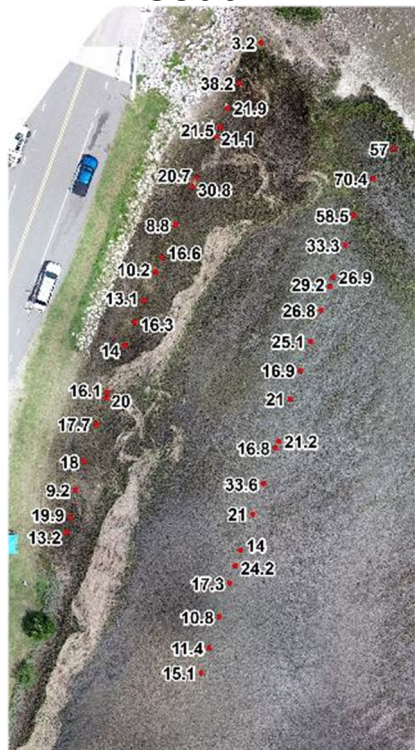
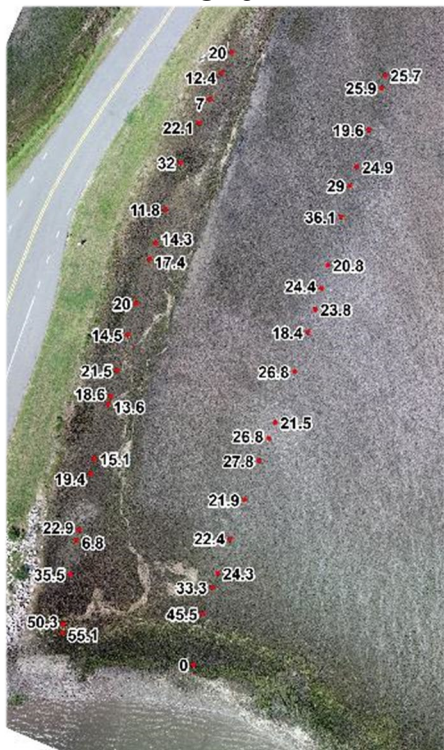


# Field data

North

2021

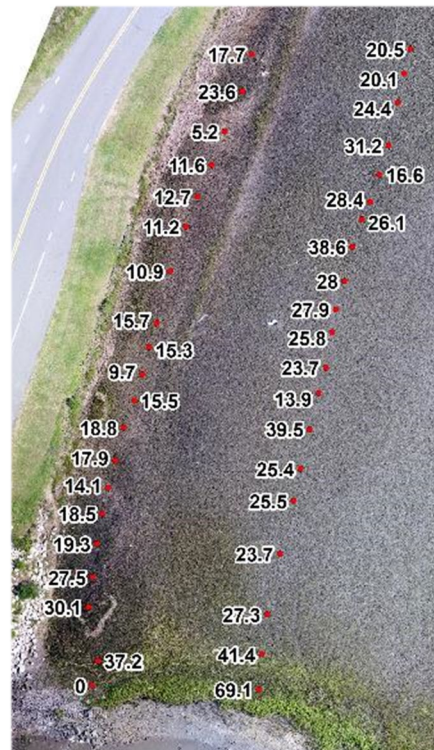
South



North

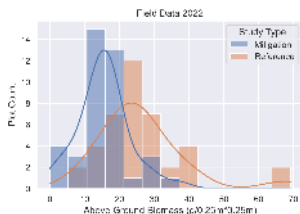
2022

South

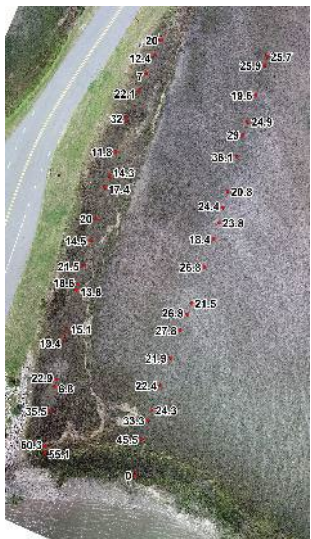
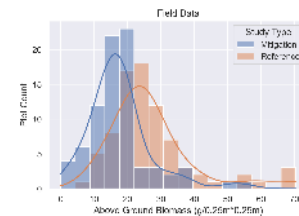
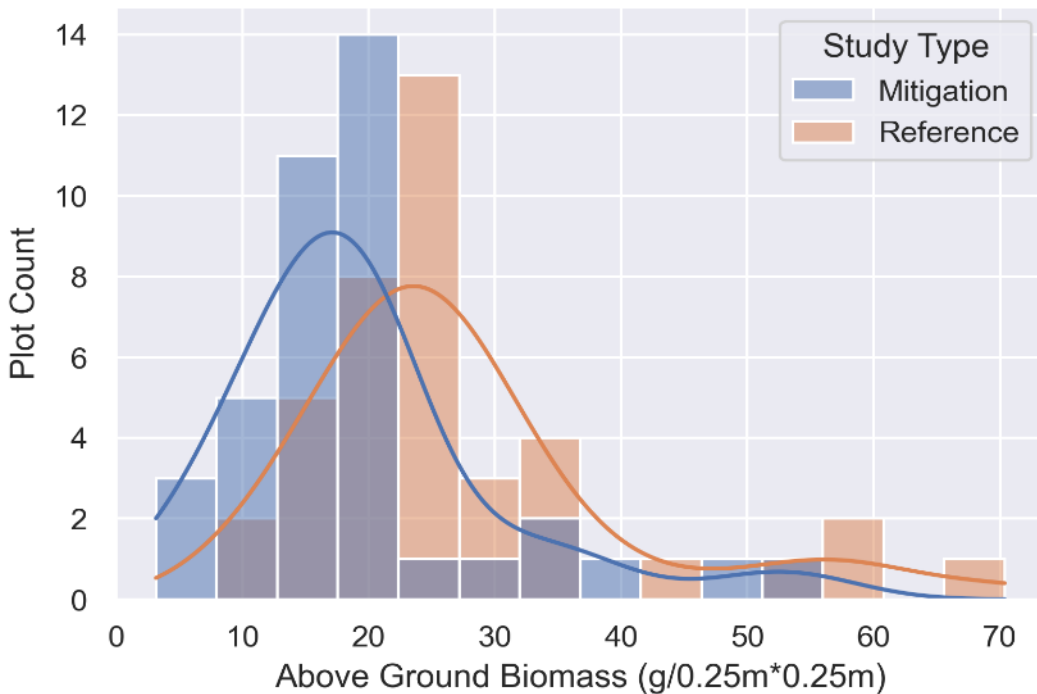




# Traditional Field Collection



Field Data 21



# Multispectral Indices

Normalized Difference Vegetation Index (NDVI)

$$\frac{\text{NIR} - \text{Red}}{\text{NIR} + \text{Red}}$$

Fractional Vegetation Coverage (FVC)

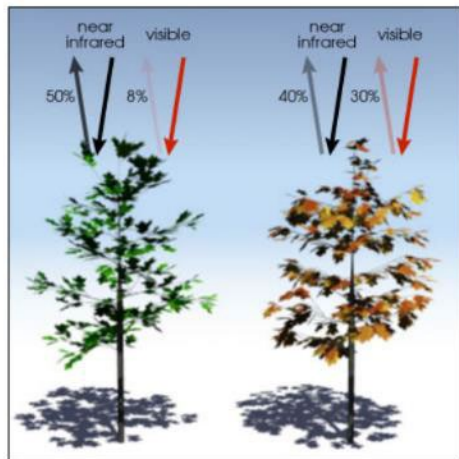
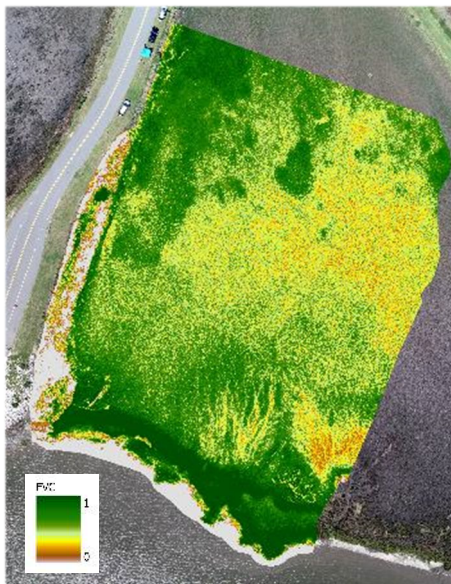
$$\frac{\text{NDVI} - \text{NDVI}_{\text{soil}}}{\text{NDVI}_{\text{veg}} - \text{NDVI}_{\text{soil}}}$$

Normalized Difference Red Edge (NDRE)

$$\frac{\text{NIR} - \text{Red Edge}}{\text{NIR} + \text{Red Edge}}$$

Normalized Difference Water Index (NDWI)

$$\frac{\text{Green} - \text{NIR}}{\text{Green} + \text{NIR}}$$



$$\frac{(0.50 - 0.08)}{(0.50 + 0.08)} = 0.72$$

$$\frac{(0.4 - 0.30)}{(0.4 + 0.30)} = 0.14$$

NASA

FVC:

Estimating *Spartina alterniflora* fractional vegetation cover and aboveground biomass in a coastal wetland using SPOT6 satellite and UAV data  
Zaiming Zhou, Yanming Yang, Benqing Chen

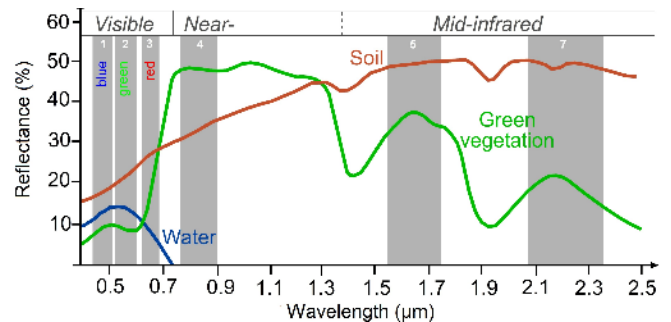
FVC



$\text{NDVI}_{\text{Target}}$

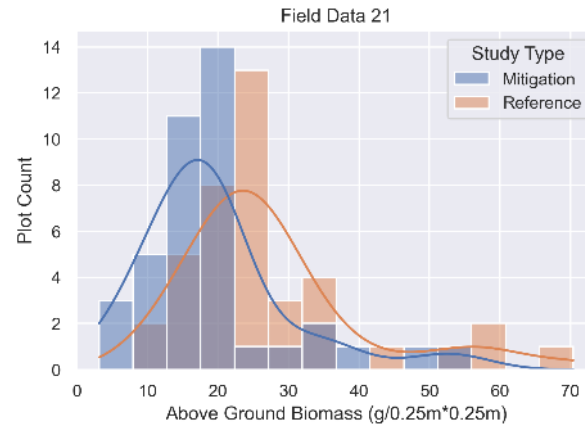
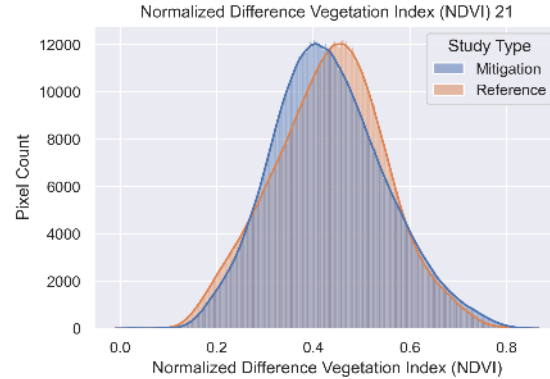
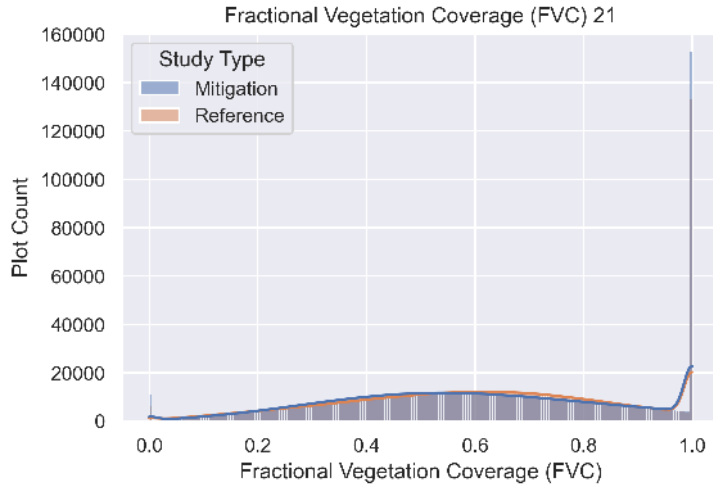
$\text{NDVI}_{\text{veg}}$   
(100%)

$\text{NDVI}_{\text{soil}}$   
(100%)



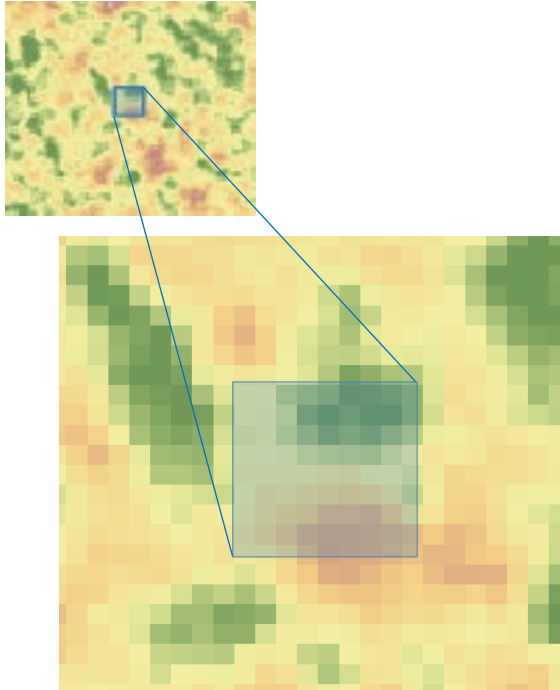


# Fractional Vegetation Coverage (FVC)

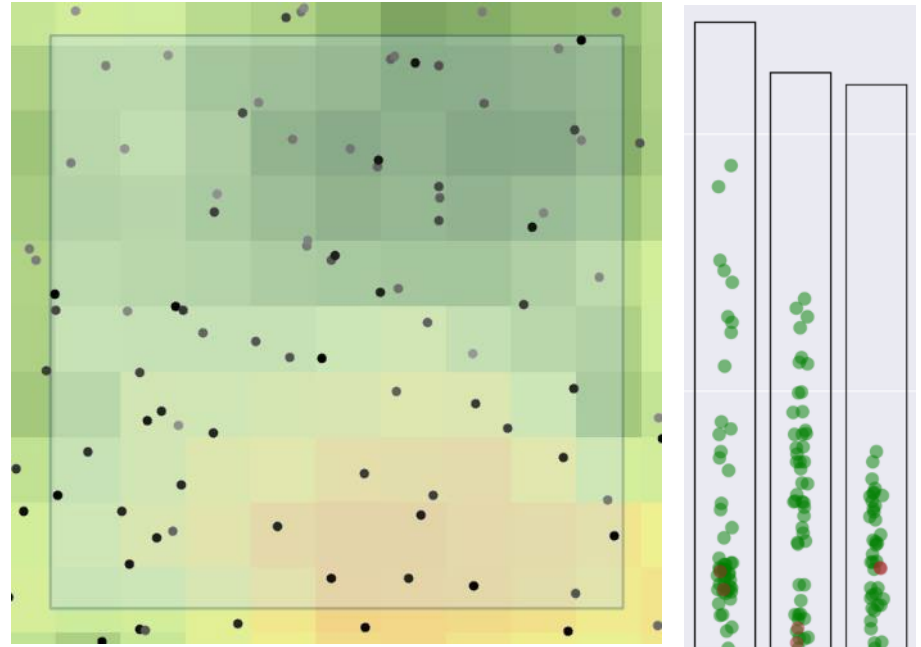


# Features to predict biomass

— 3 multispectral indices

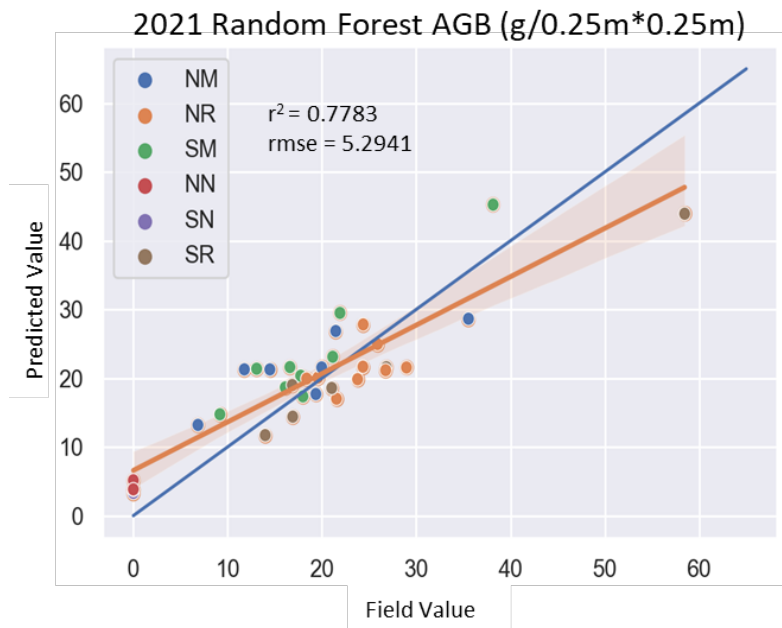


— Elevations from surface model

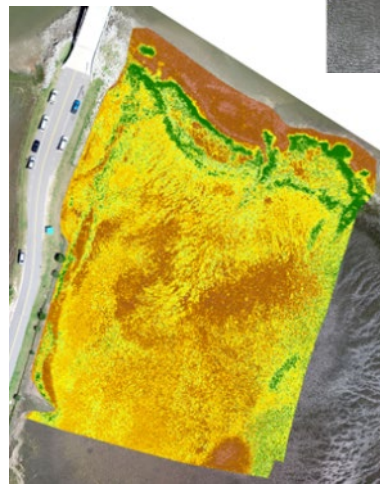
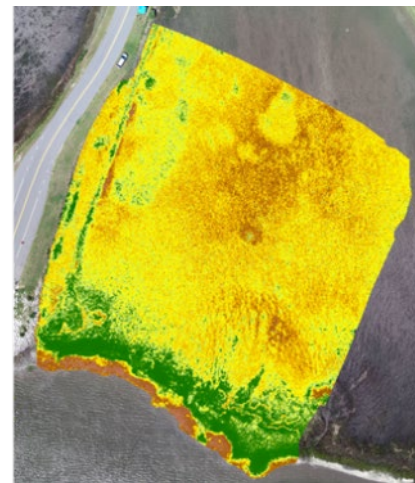
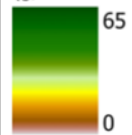




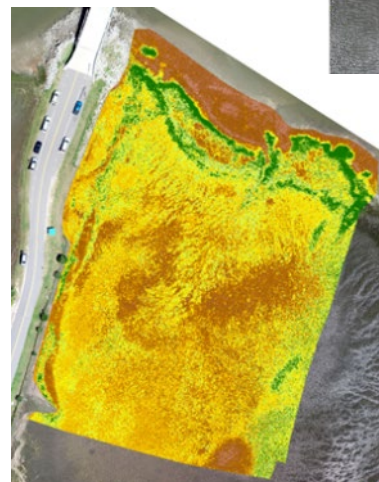
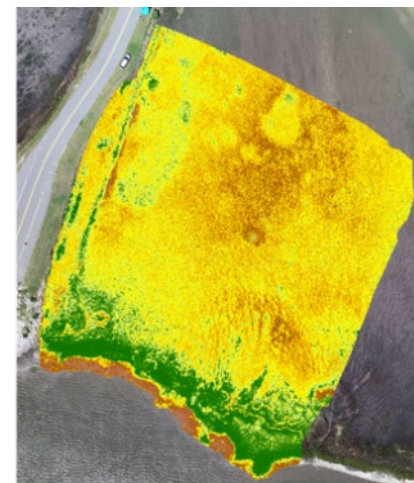
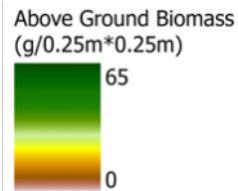
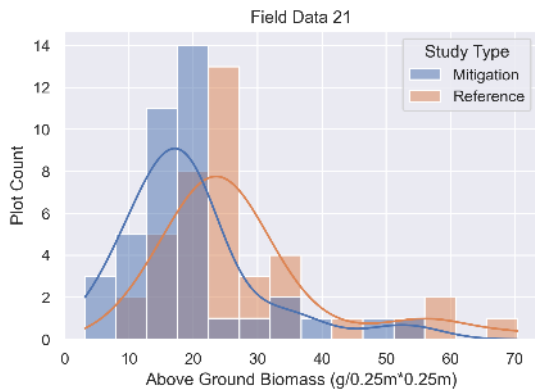
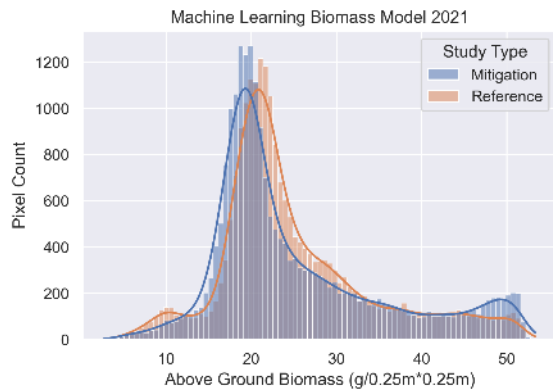
# Biomass model results



Above Ground Biomass  
(g/0.25m\*0.25m)



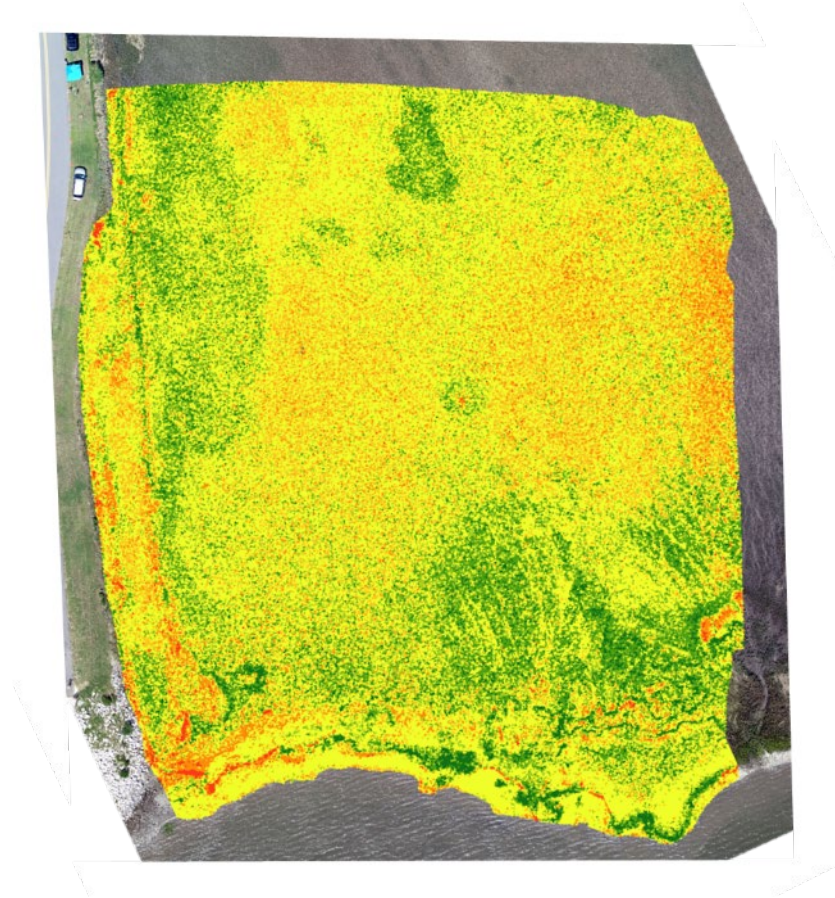
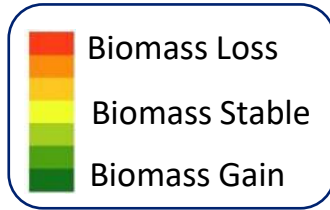
# Biomass distributions



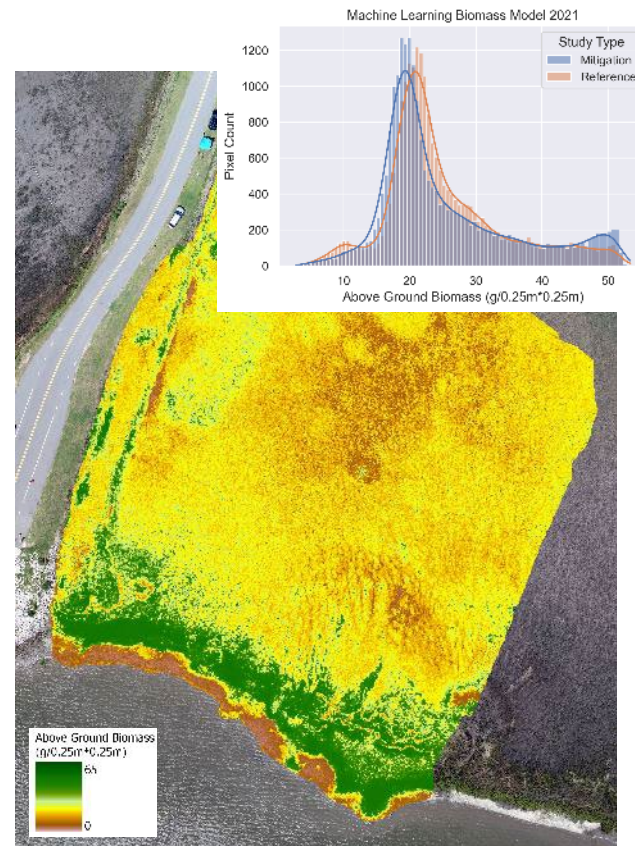
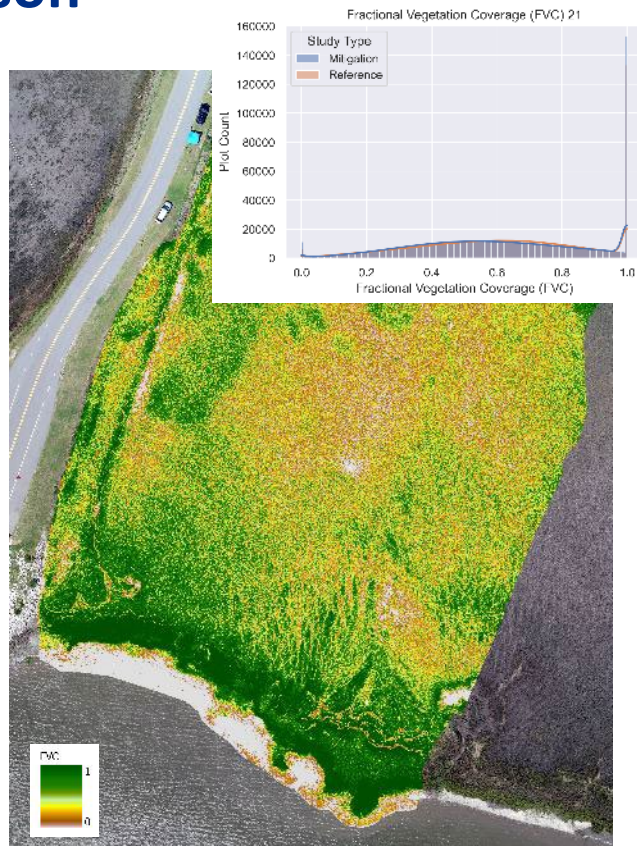
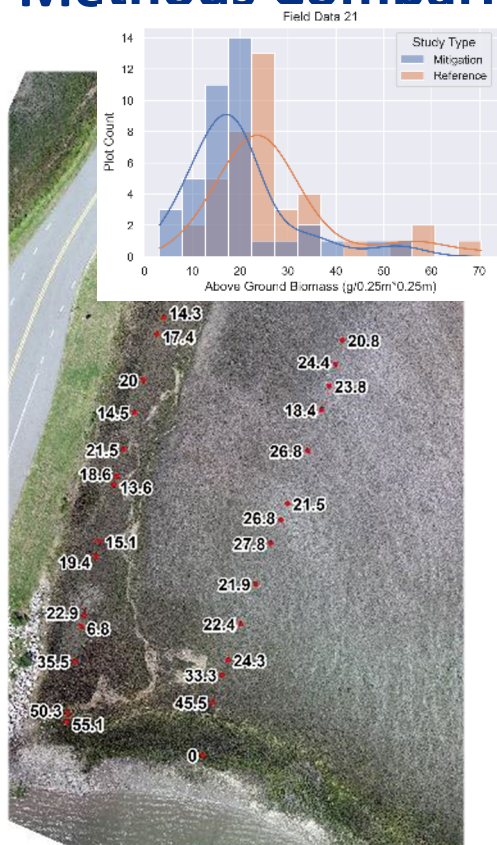


# Biomass change over time

2022 - 2021



# Methods Comparison





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at **CDM  
Smith**

