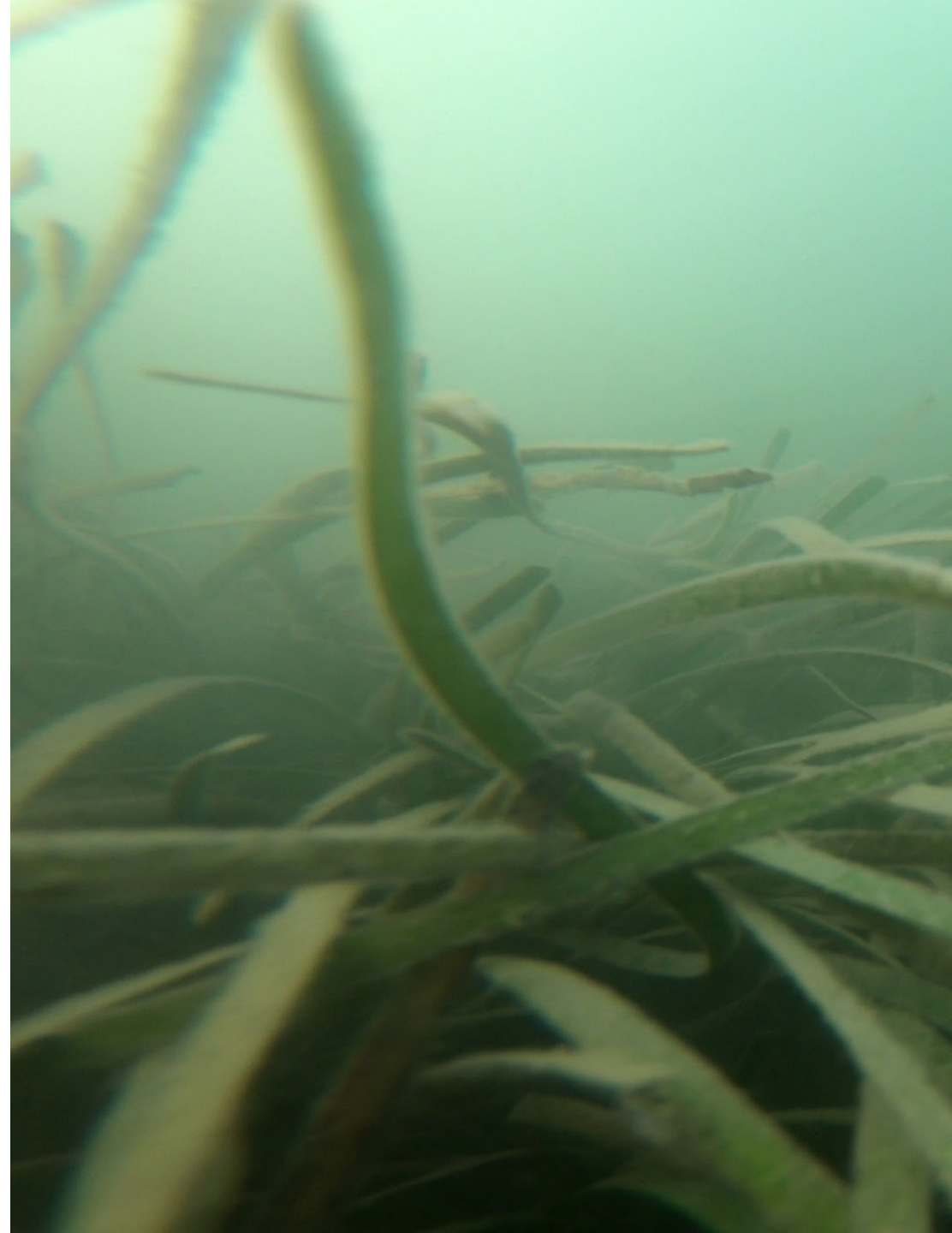


Using daily PlanetScope imagery to estimate seagrass density and blue carbon.

Victoria Hill, Richard Zimmerman

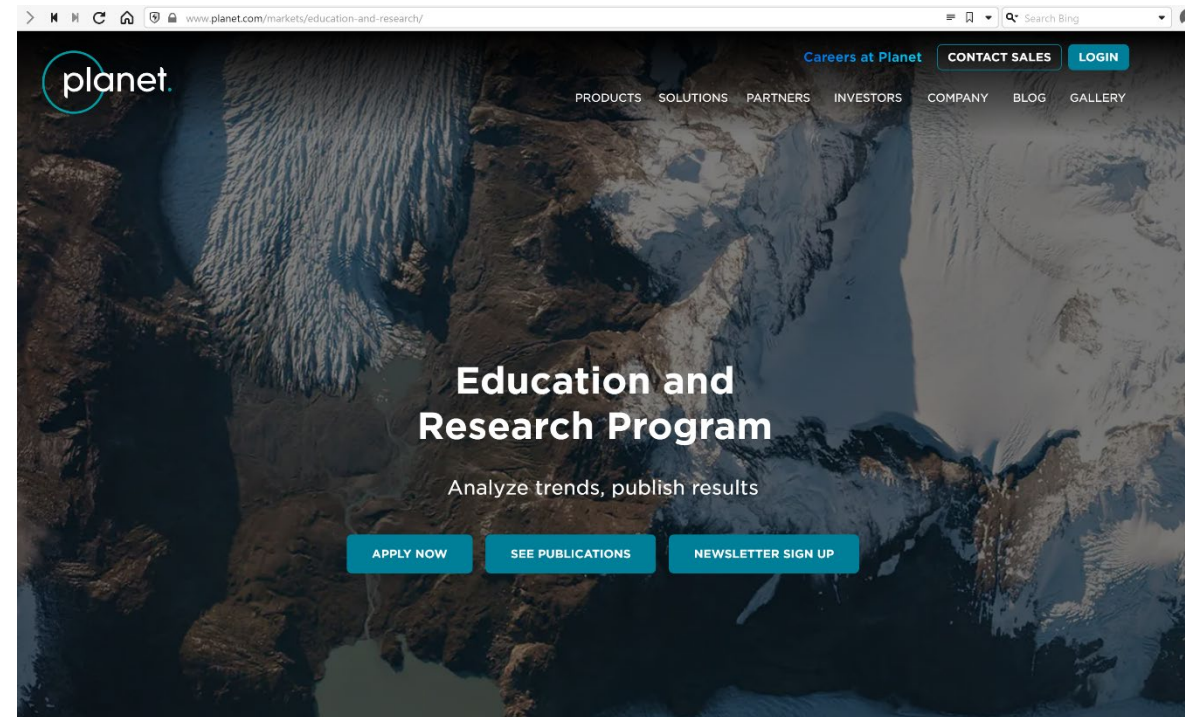
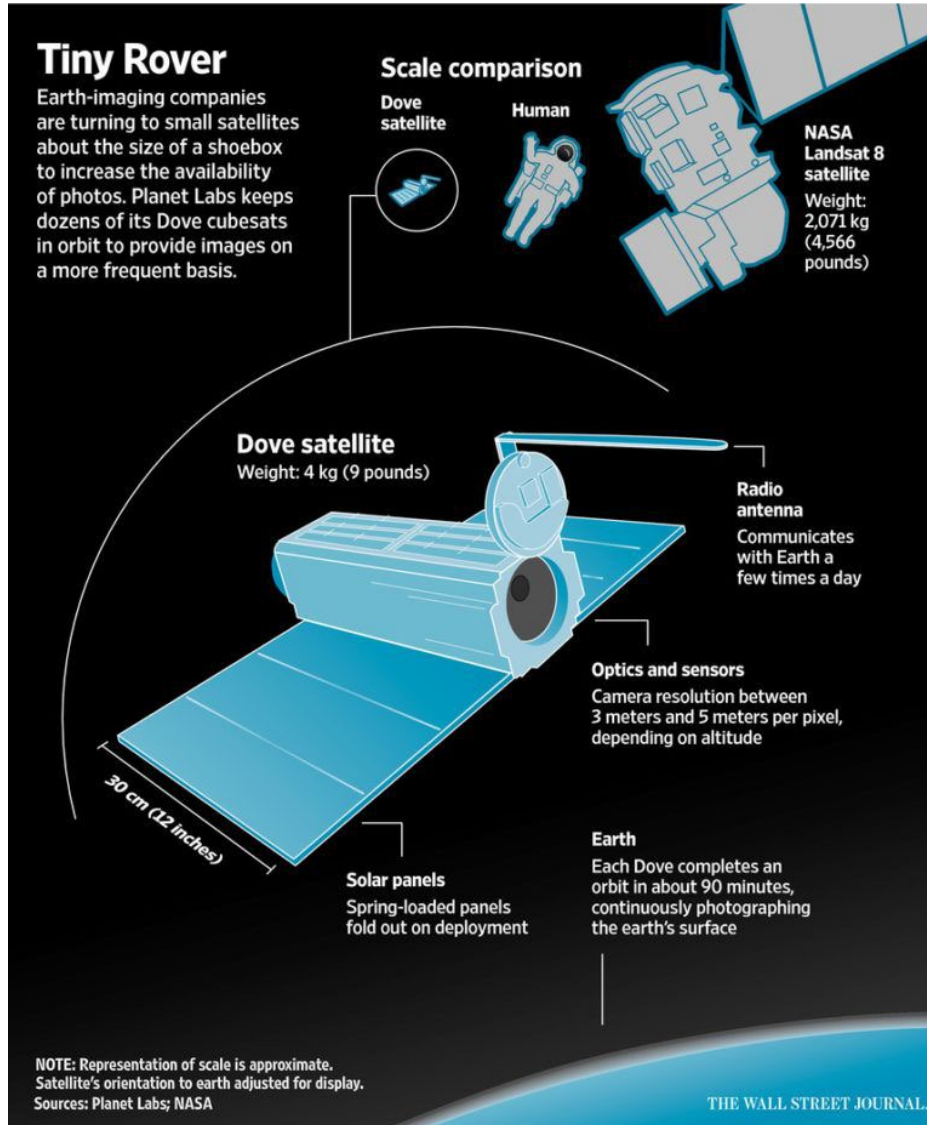
Department of Ocean and Earth Sciences.

Old Dominion University, Norfolk. Virginia. USA



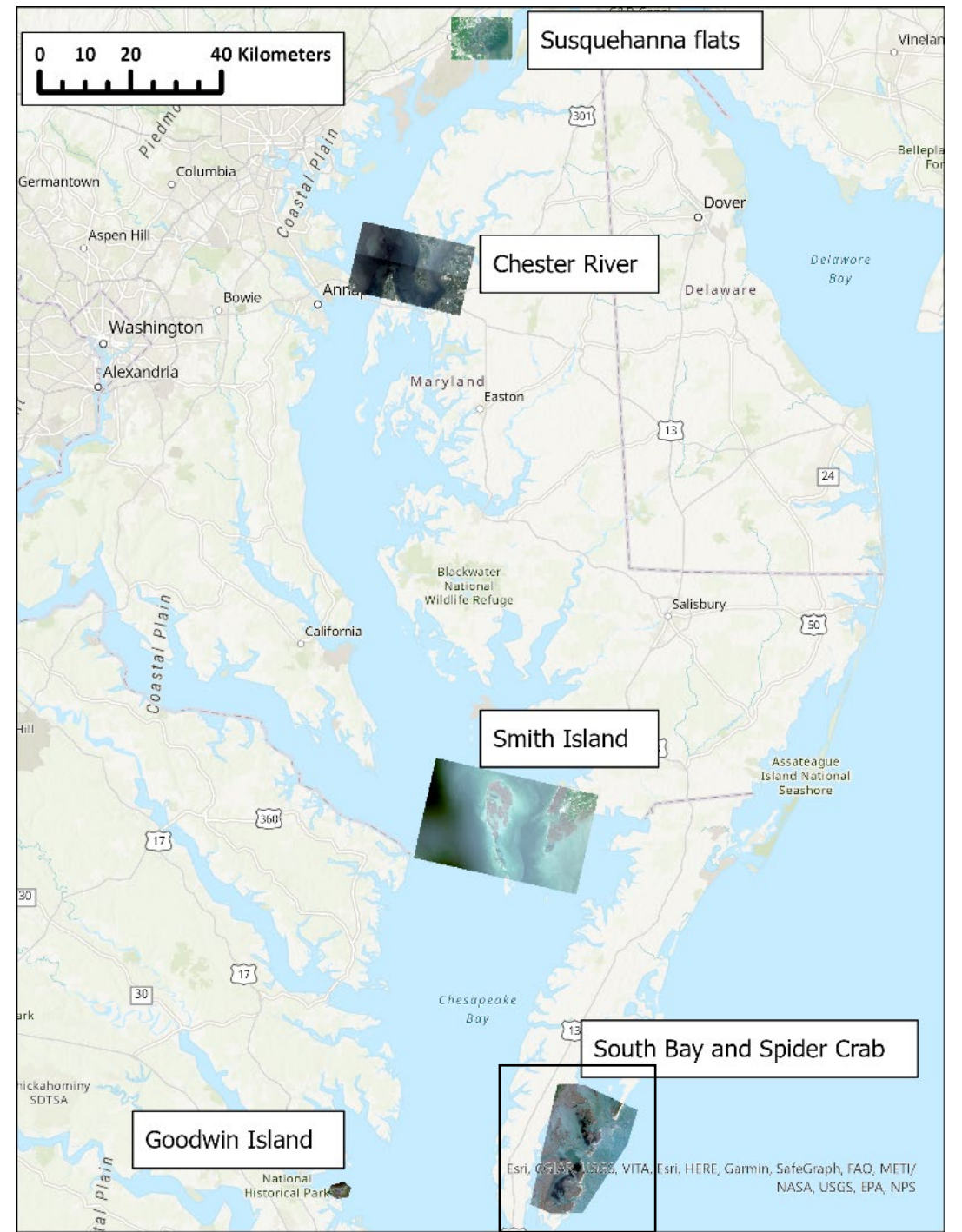
PlanetScope

- Multispectral, high spatial resolution
 - 4 m - 3, 4 & 8 band multispectral
 - 1 m - multispectral (skysat)
 - Almost daily coverage (Over 100 satellites)



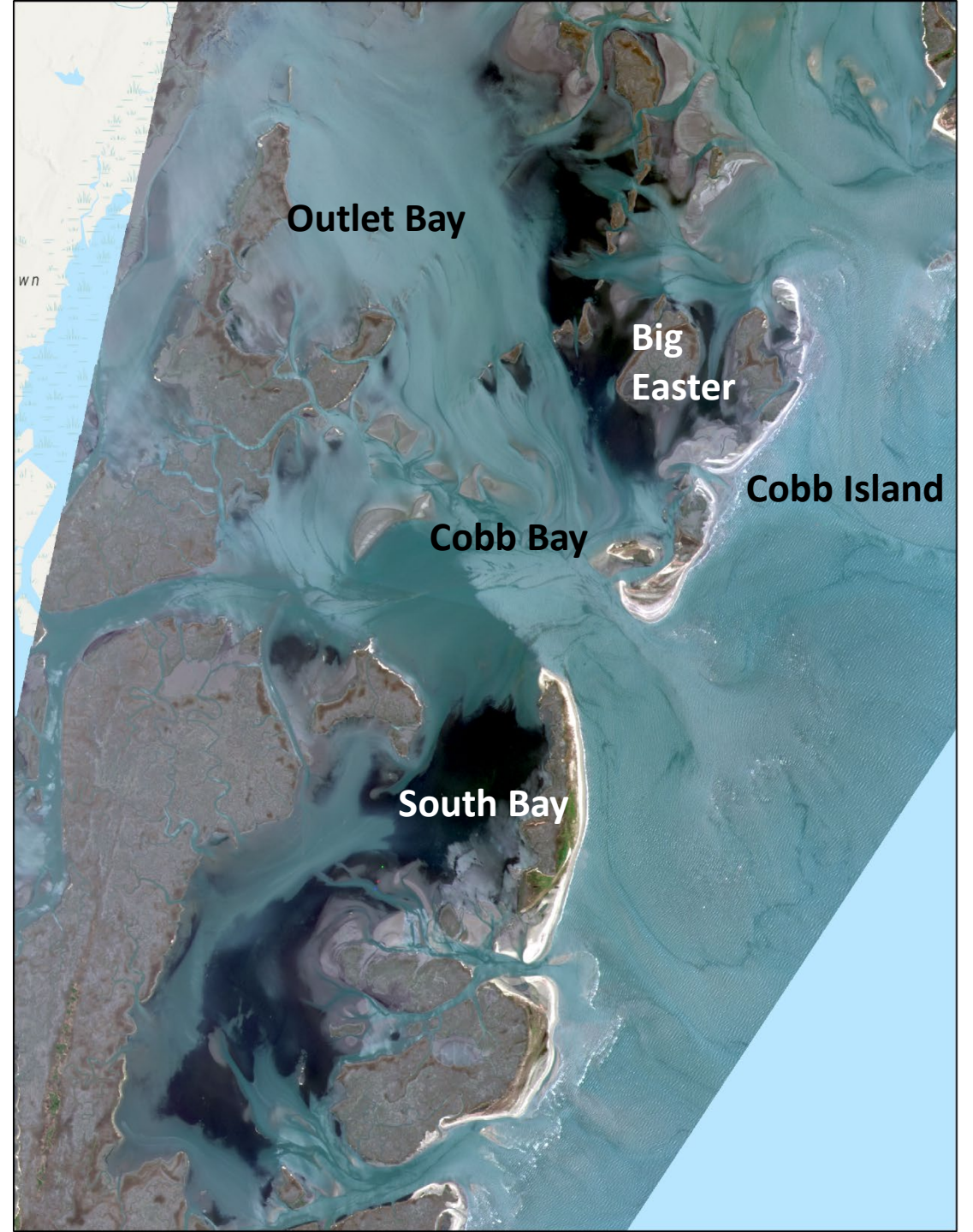
Chesapeake Bay sites of interest.

- 5 sites
- Ranging from saline to fresh



South Bay & Spider Crab

- Planet passes every day, often multiple passes from different sensors.
- Images good for seagrass identification.
 - Low tide
 - Low turbidity
 - Low cloud cover.



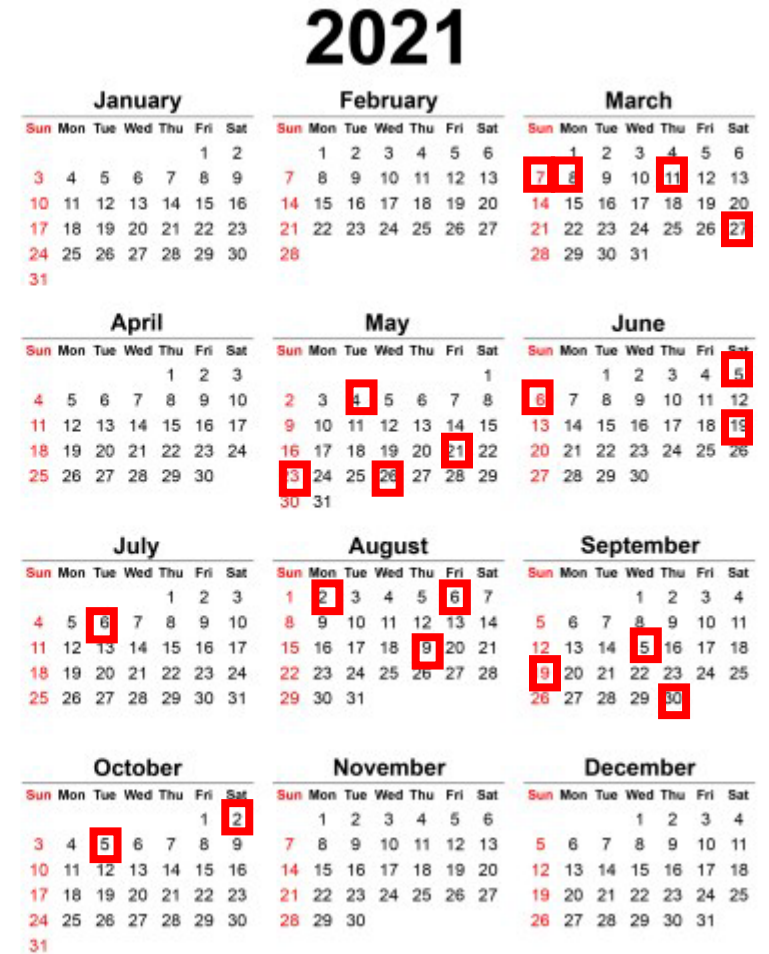
South Bay & Spider Crab



Designed by 123Fr



Designed by 123FreeVectors.com

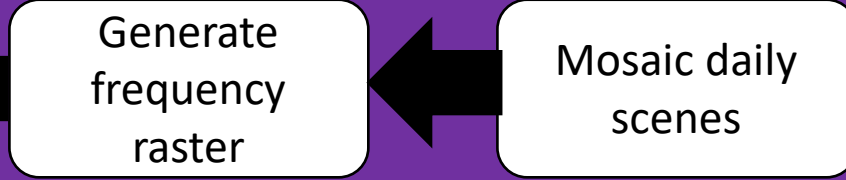
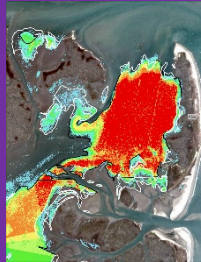


Processing workflow

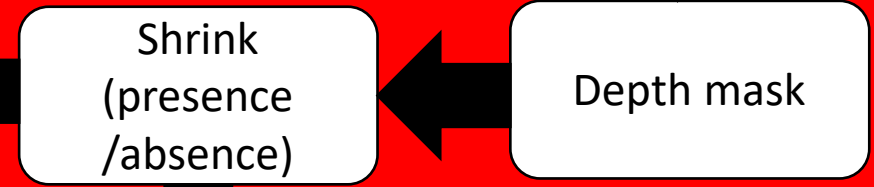
Classifying



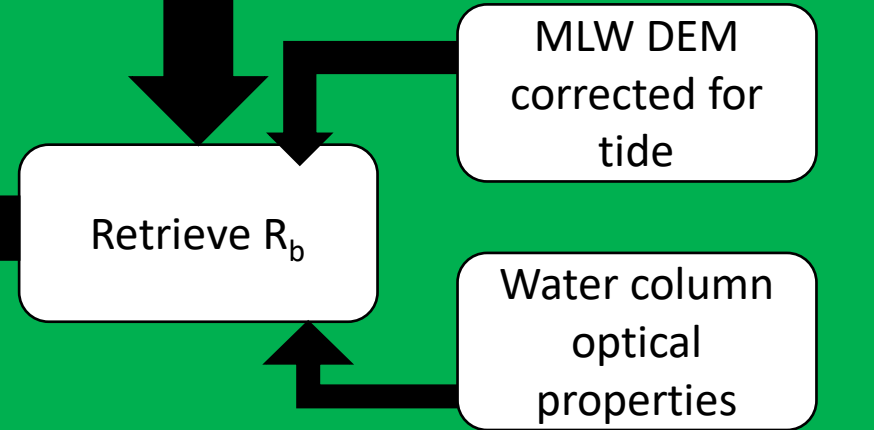
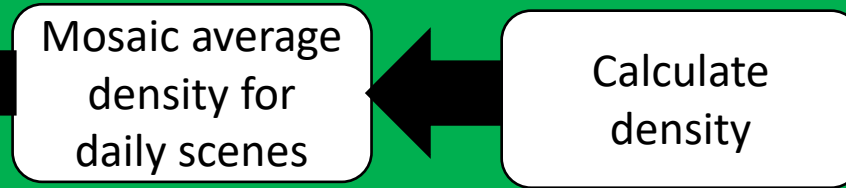
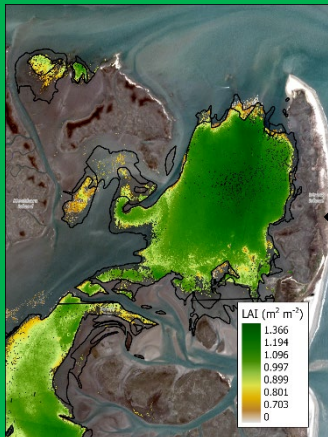
Presence



Refining



Density

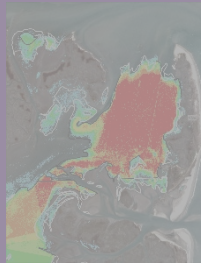


Processing workflow

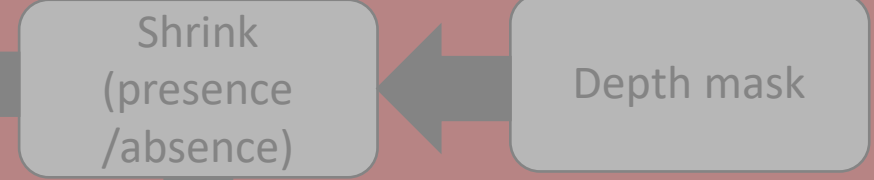
Classifying



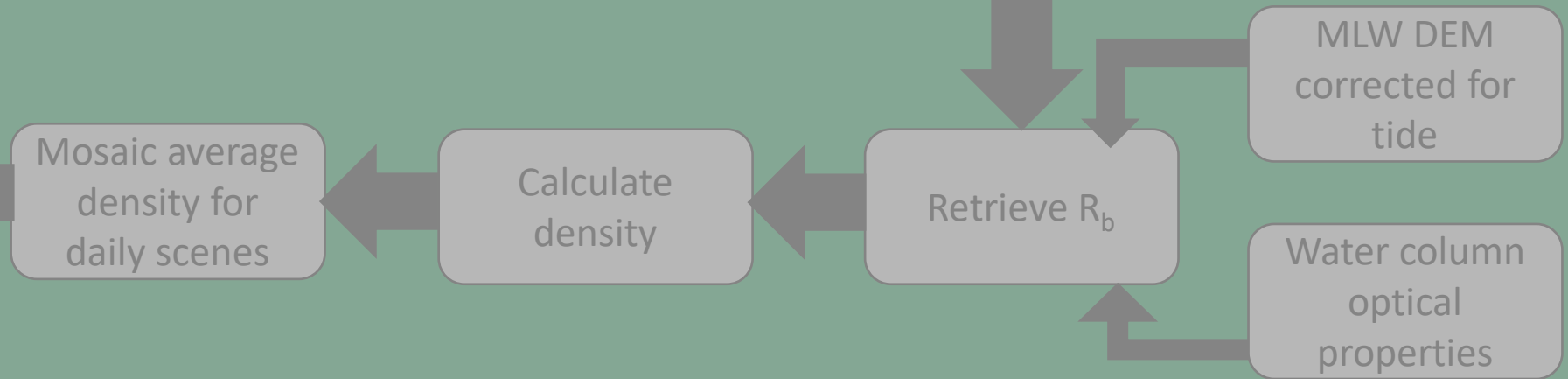
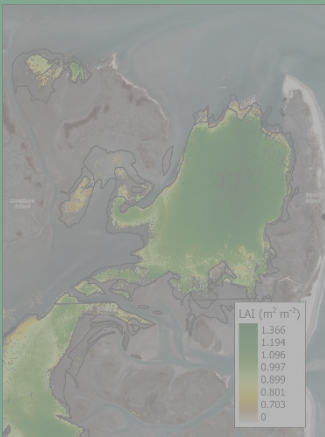
Presence



Refining



Density

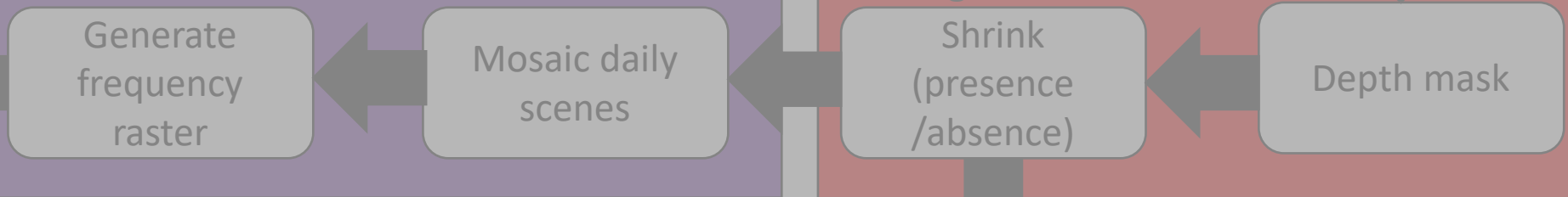
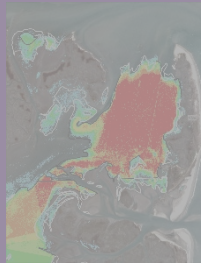


Processing workflow

Classifying

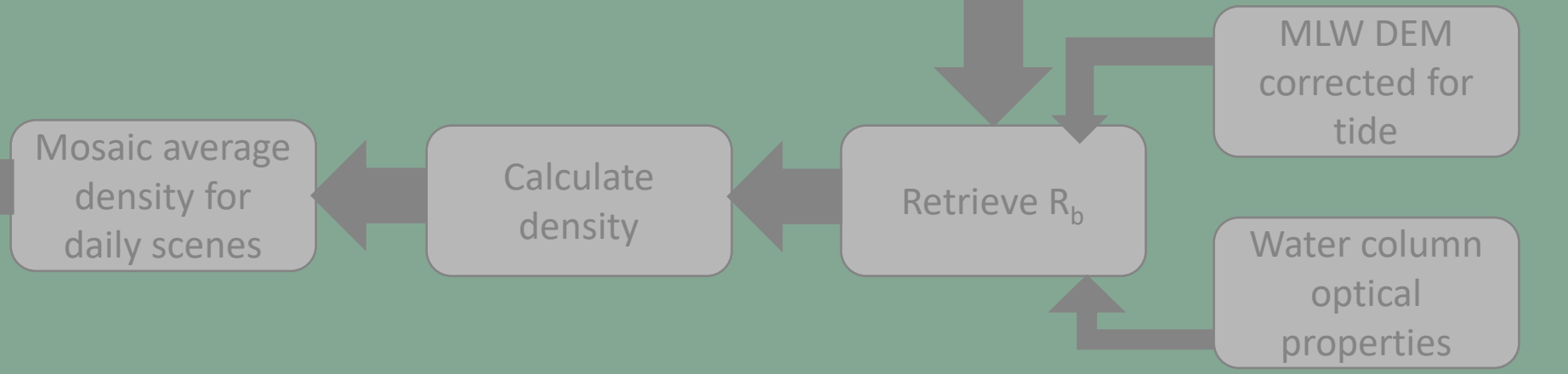
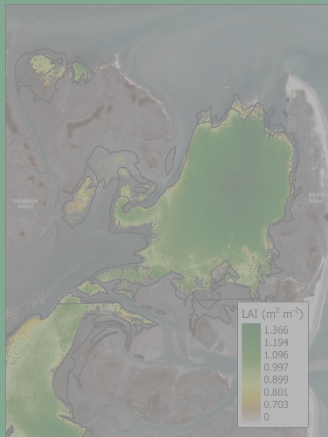


Presence



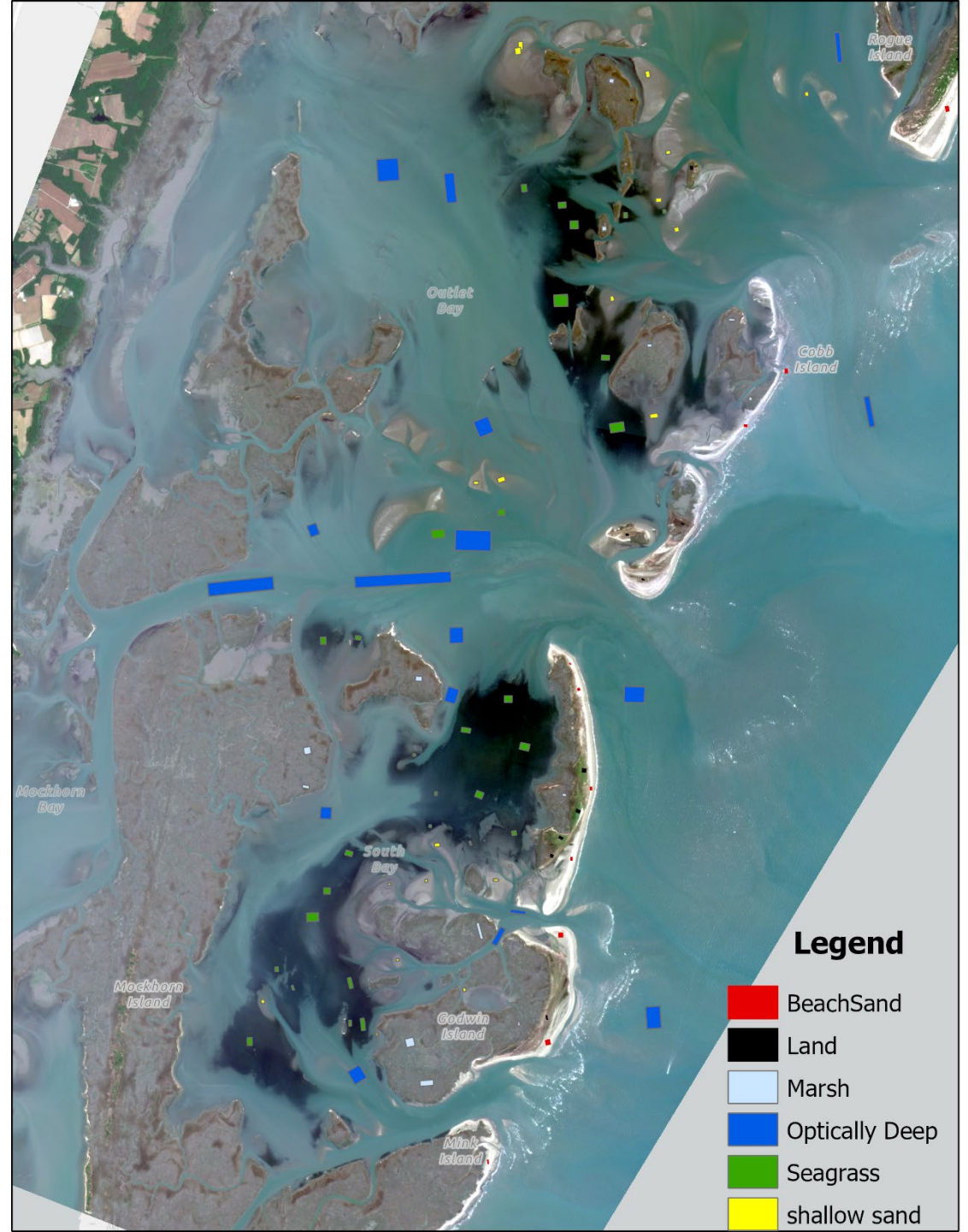
Refining

Density



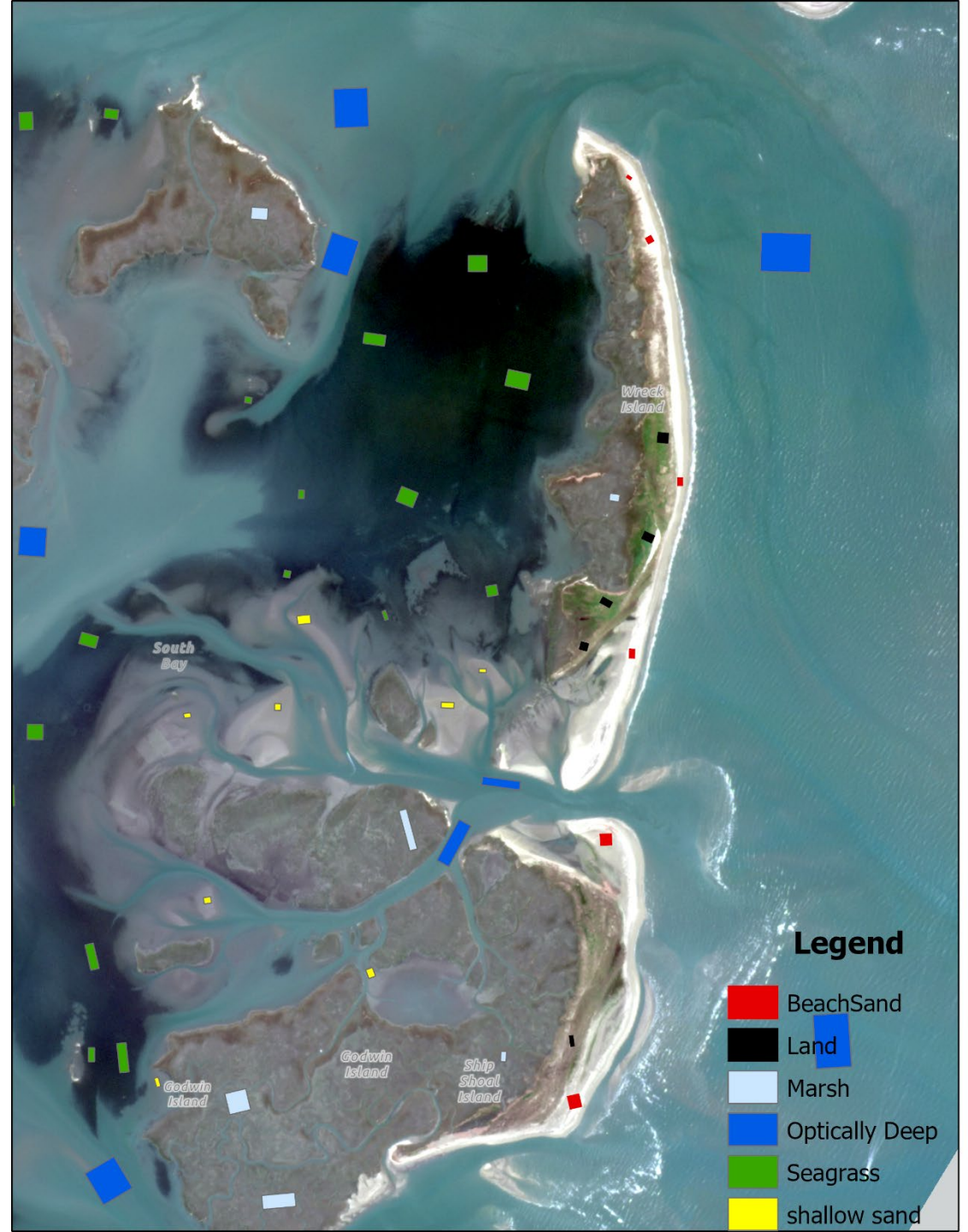
Classification

- Generate training patches for each target
 - Beach
 - Land
 - Marsh
 - Optically deep
 - Seagrass
 - Shallow sand

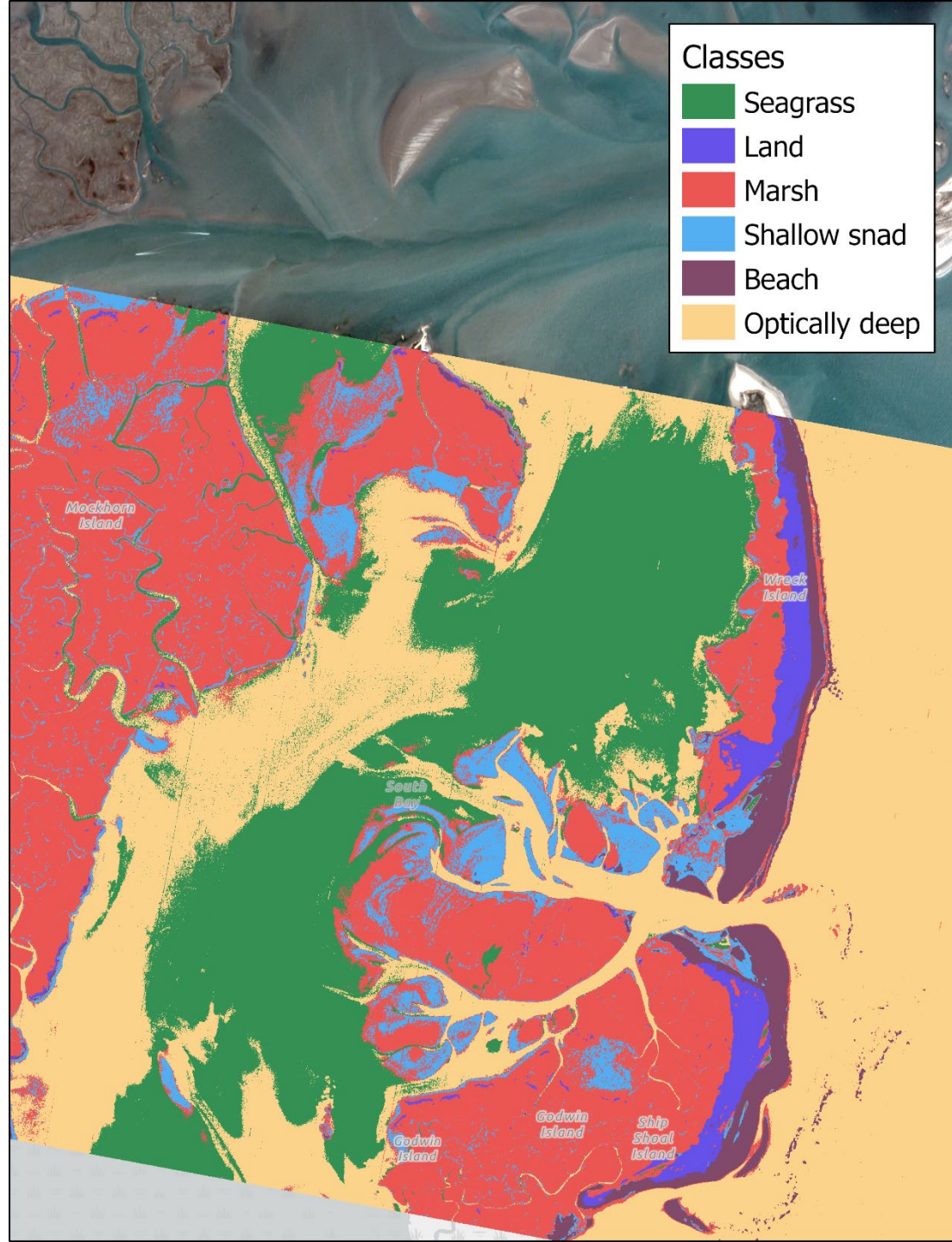


Classification

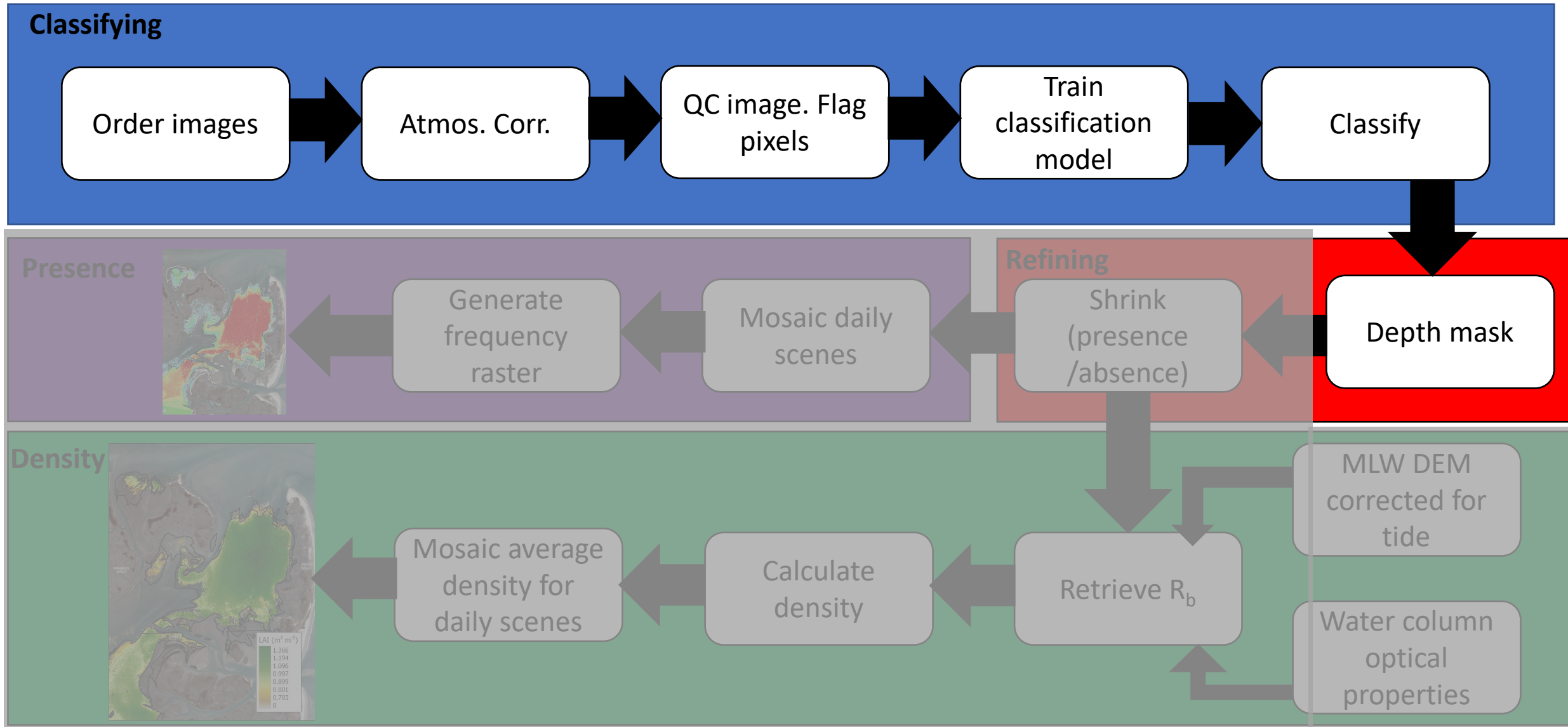
- Generate training patches for each target
 - Beach
 - Land
 - Marsh
 - Optically deep
 - Seagrass
 - Shallow sand
- Training patches for each image, or select areas that are consistent over time.
- Classification is run on all images using the same patch locations.
- Each individual image is trained and classified.



Classification

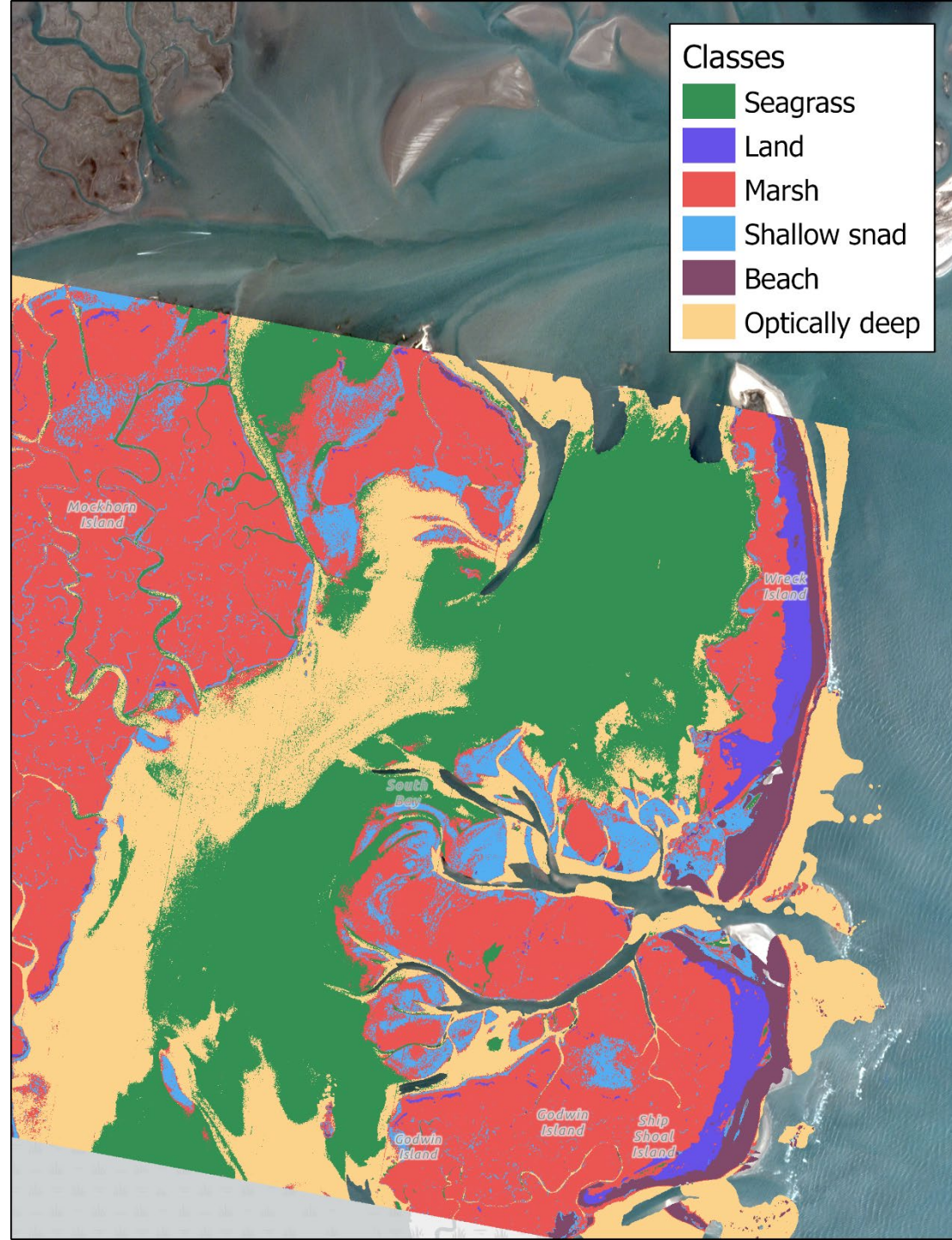


Processing workflow



Classification

Depth mask removes
green optically deep
water.

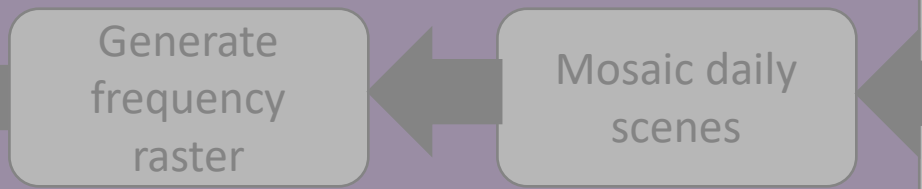
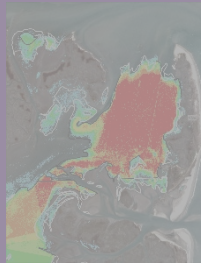


Processing workflow

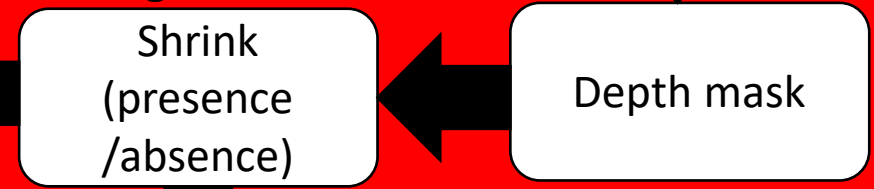
Classifying



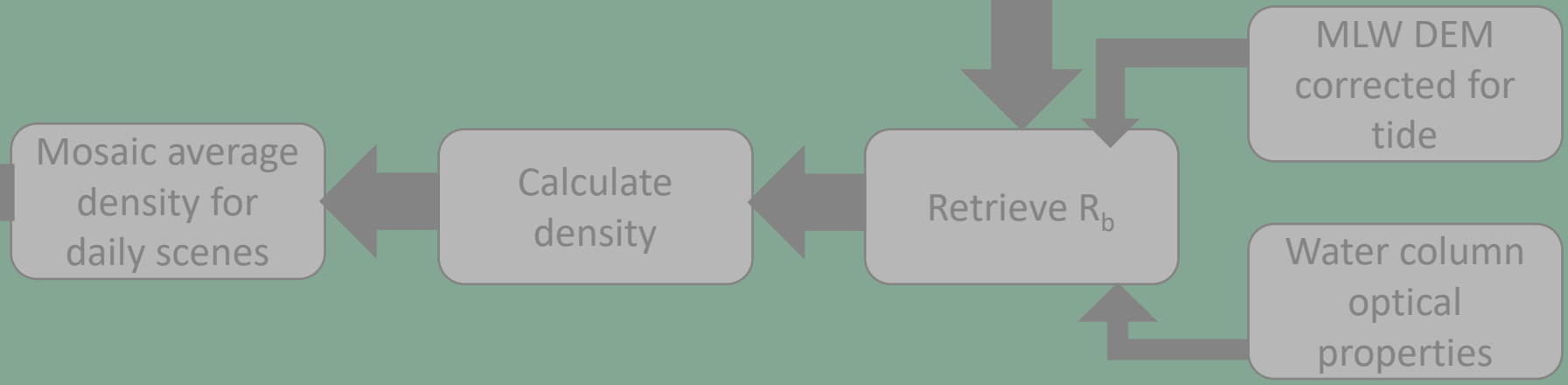
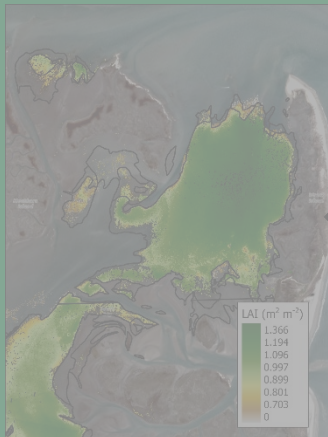
Presence



Refining



Density



Shrink

Removes single
seagrass pixels with no
neighboring pixels



Shrink

Removes single
seagrass pixels with no
neighboring pixels

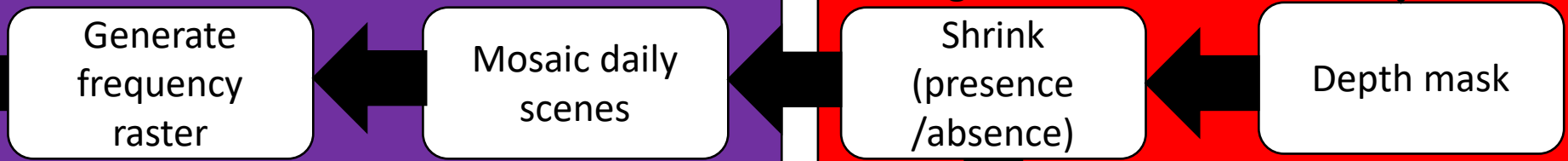
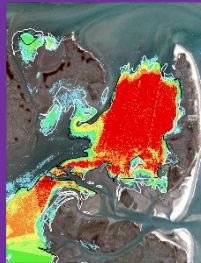


Processing workflow

Classifying

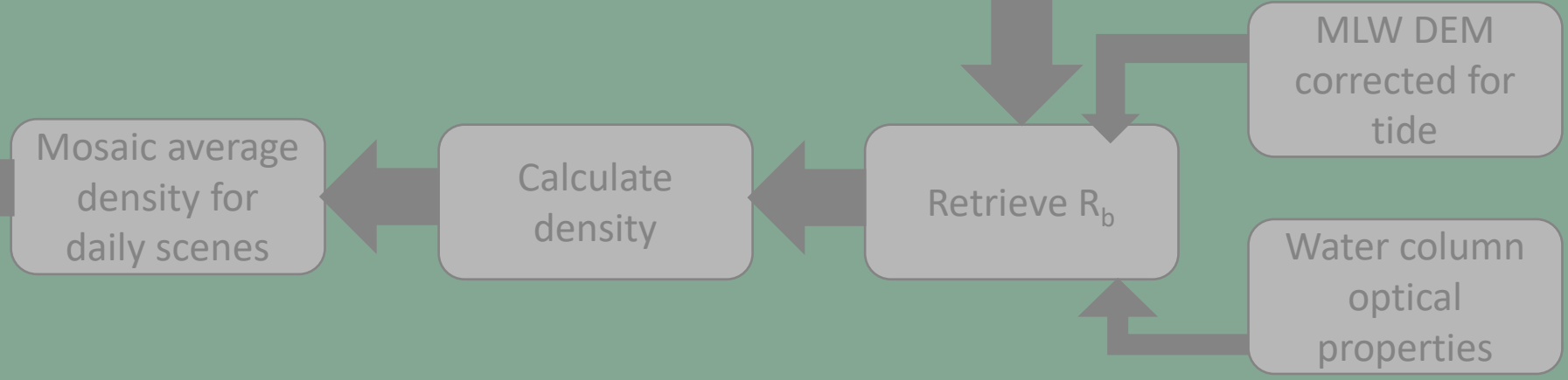
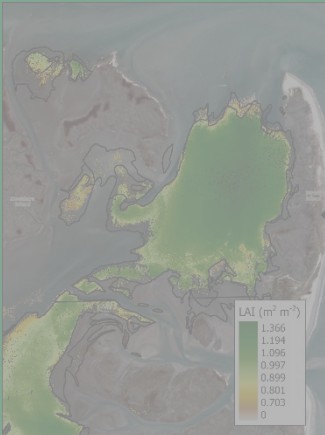


Presence



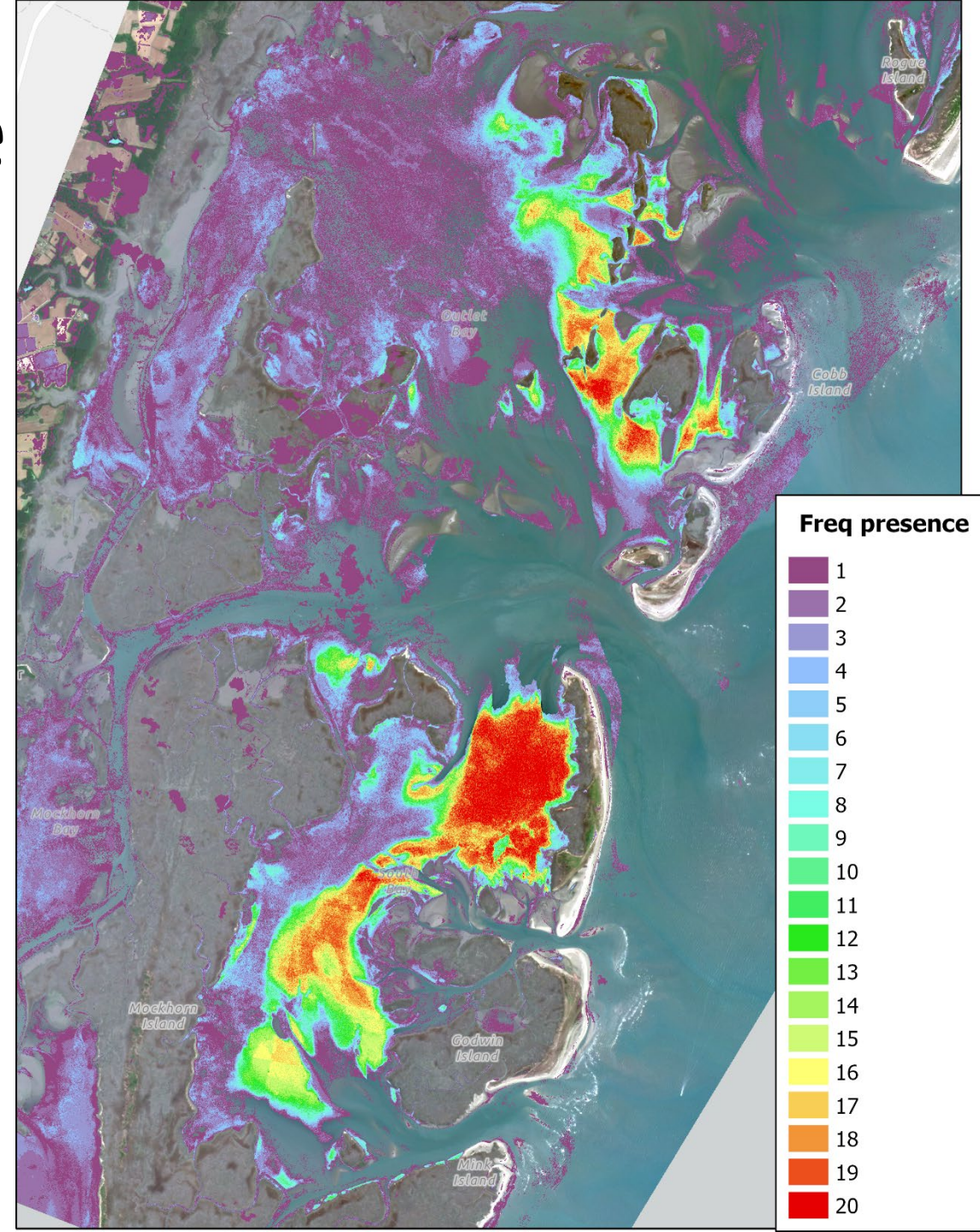
Refining

Density

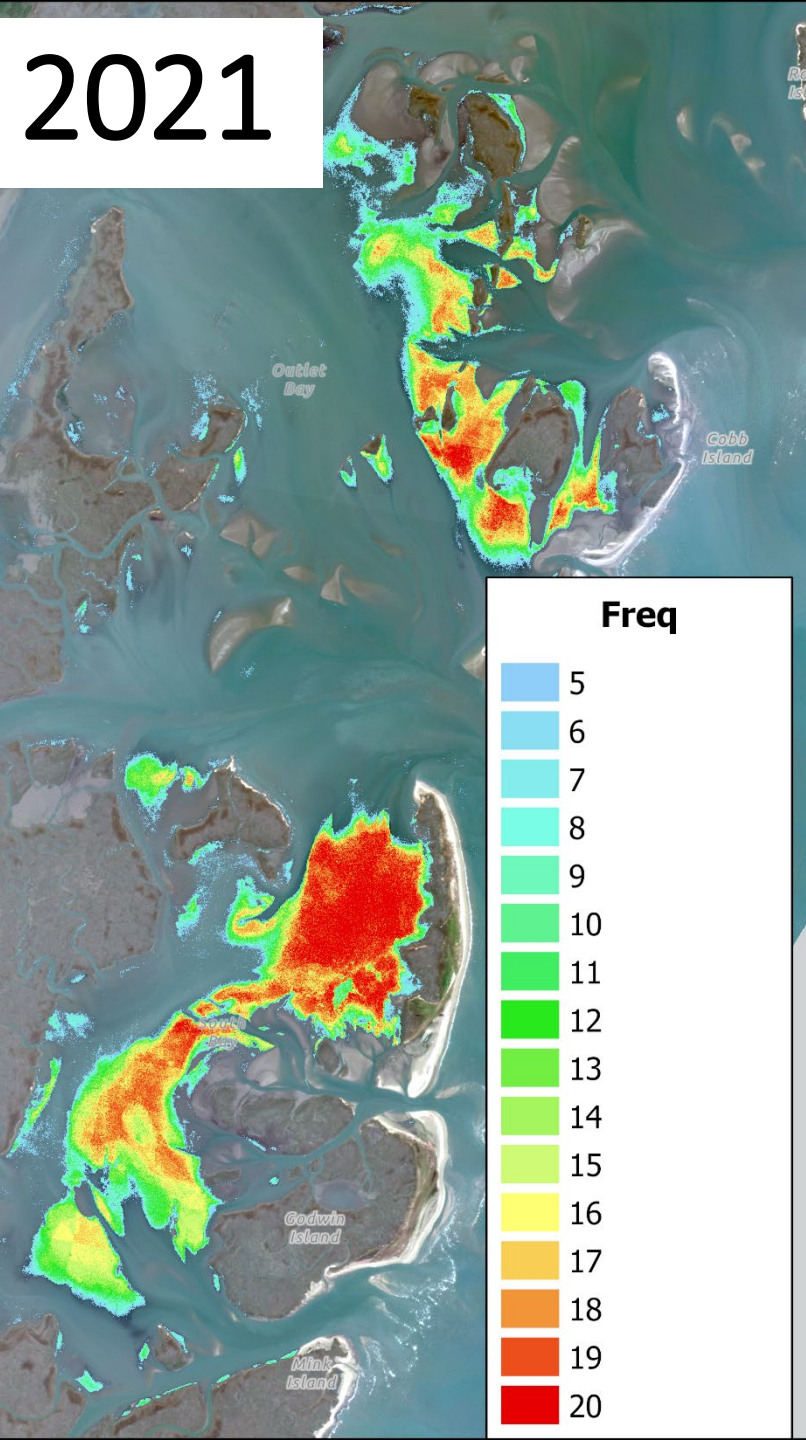


2021 – frequency presence

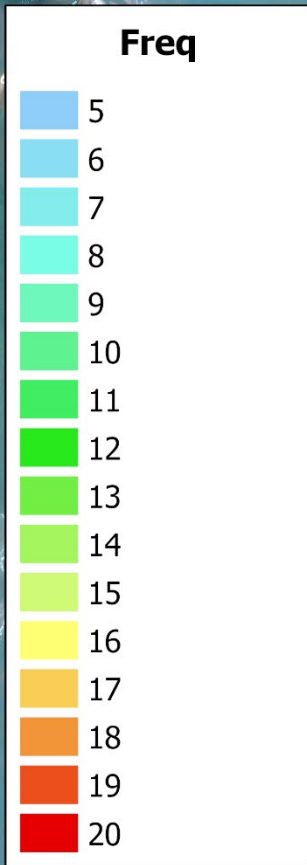
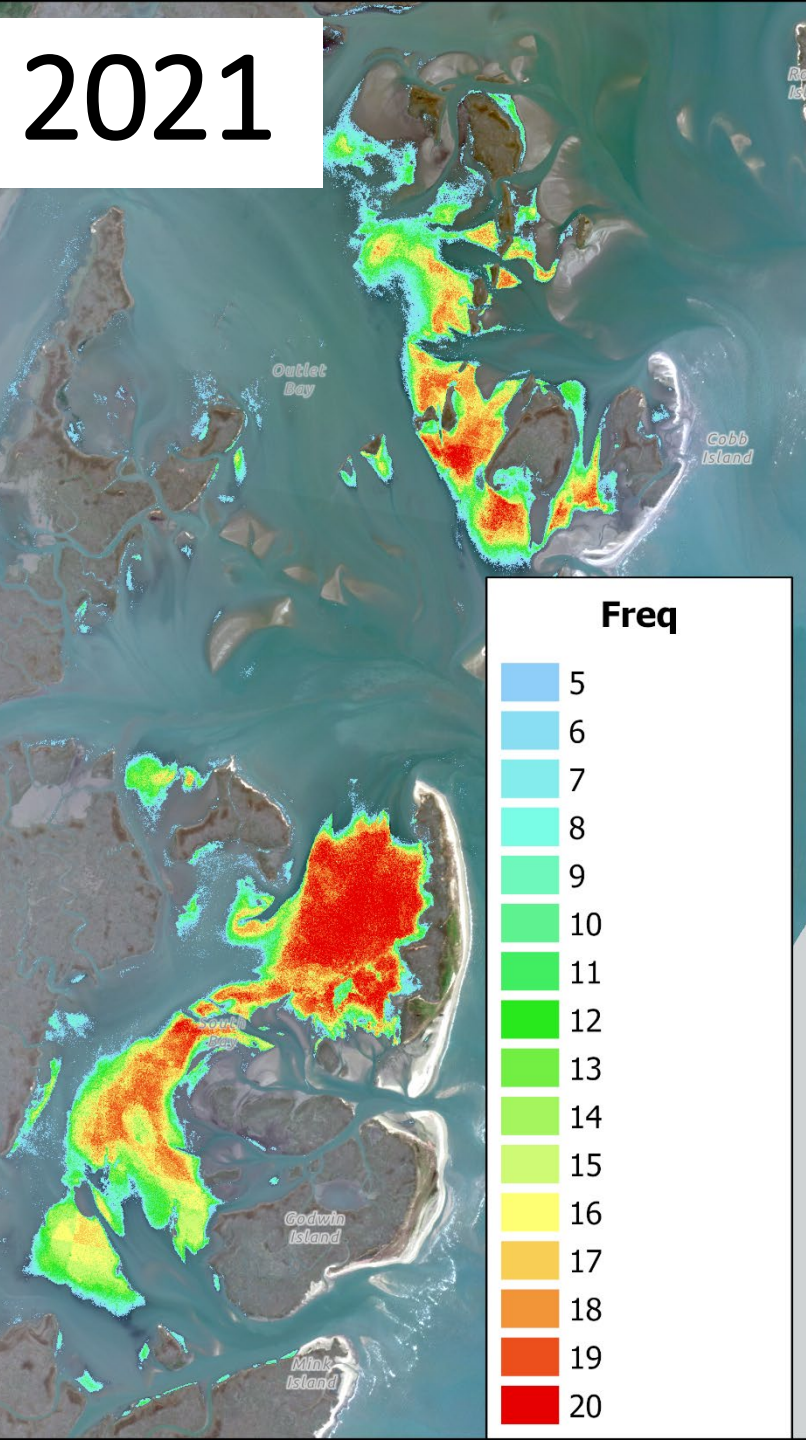
- Some areas have very low frequency of seagrass presence.
- These are images with increased turbidity close to land.
 - Are they misclassifications?
 - Generate mask for these areas?
 - Generate seagrass habitat areas and use to mask
 - Not use those images – BUT they produce good classification in the seagrass meadows.
- Set a threshold for frequency presence.
 - Pixels with frequency less than 6 are set to null.



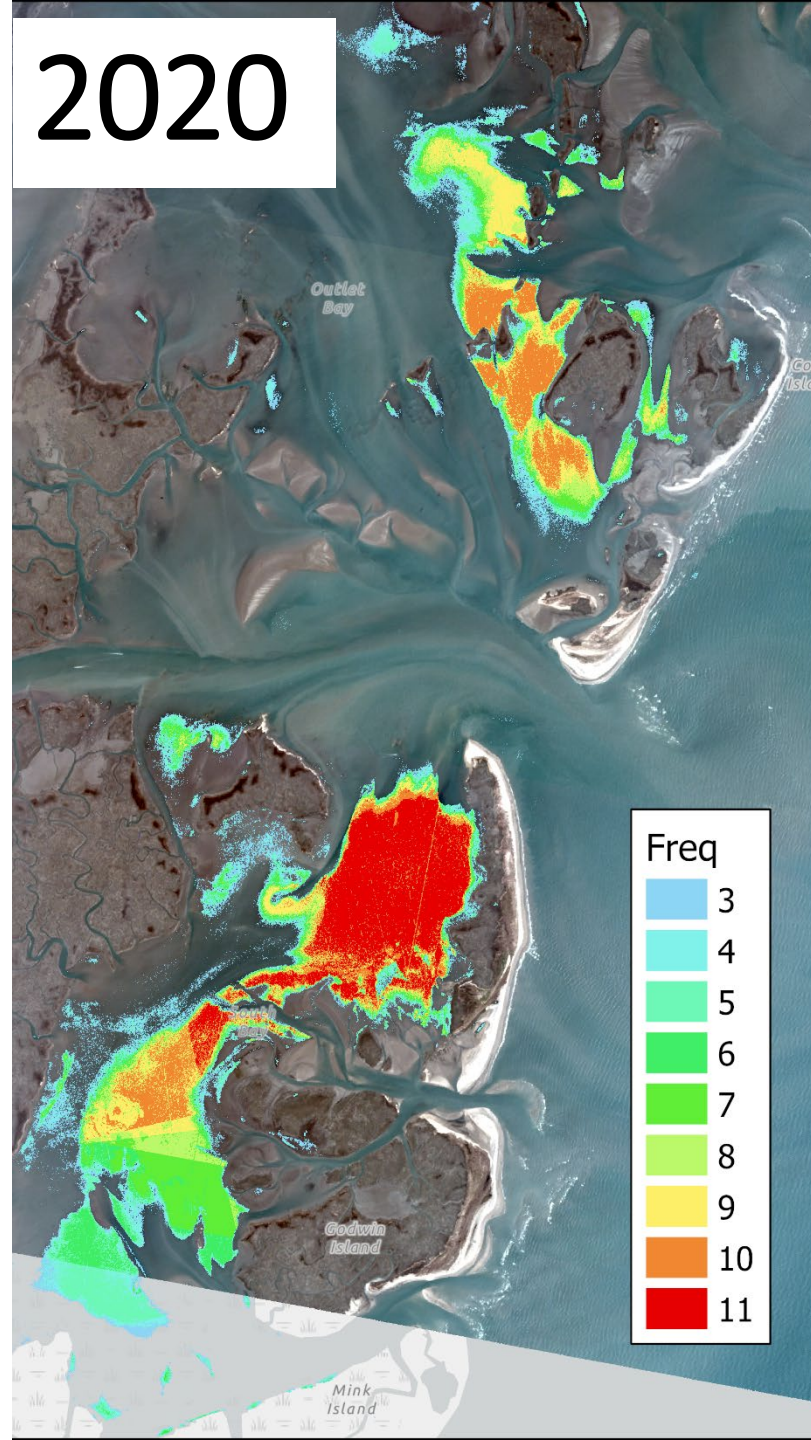
2021



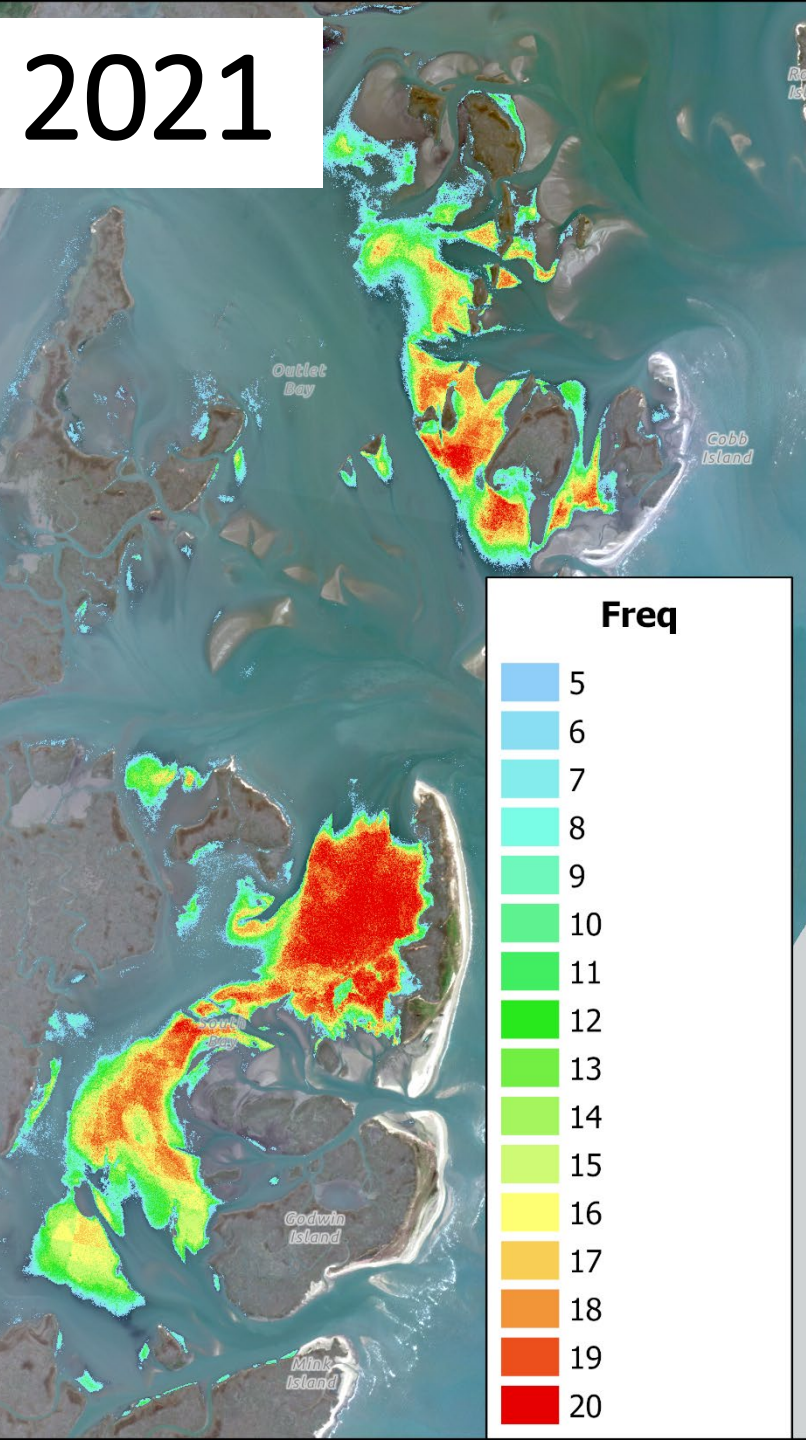
2021



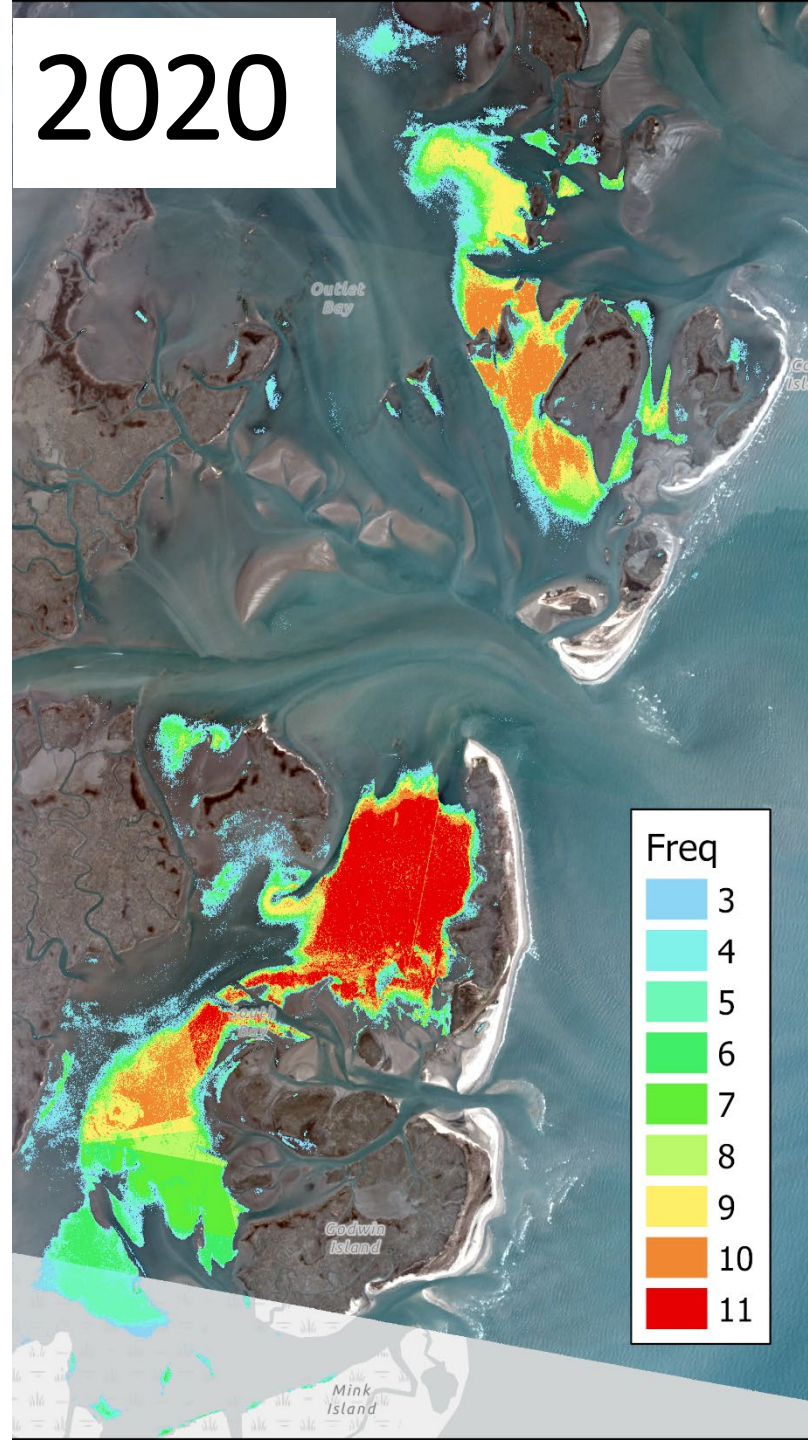
2020



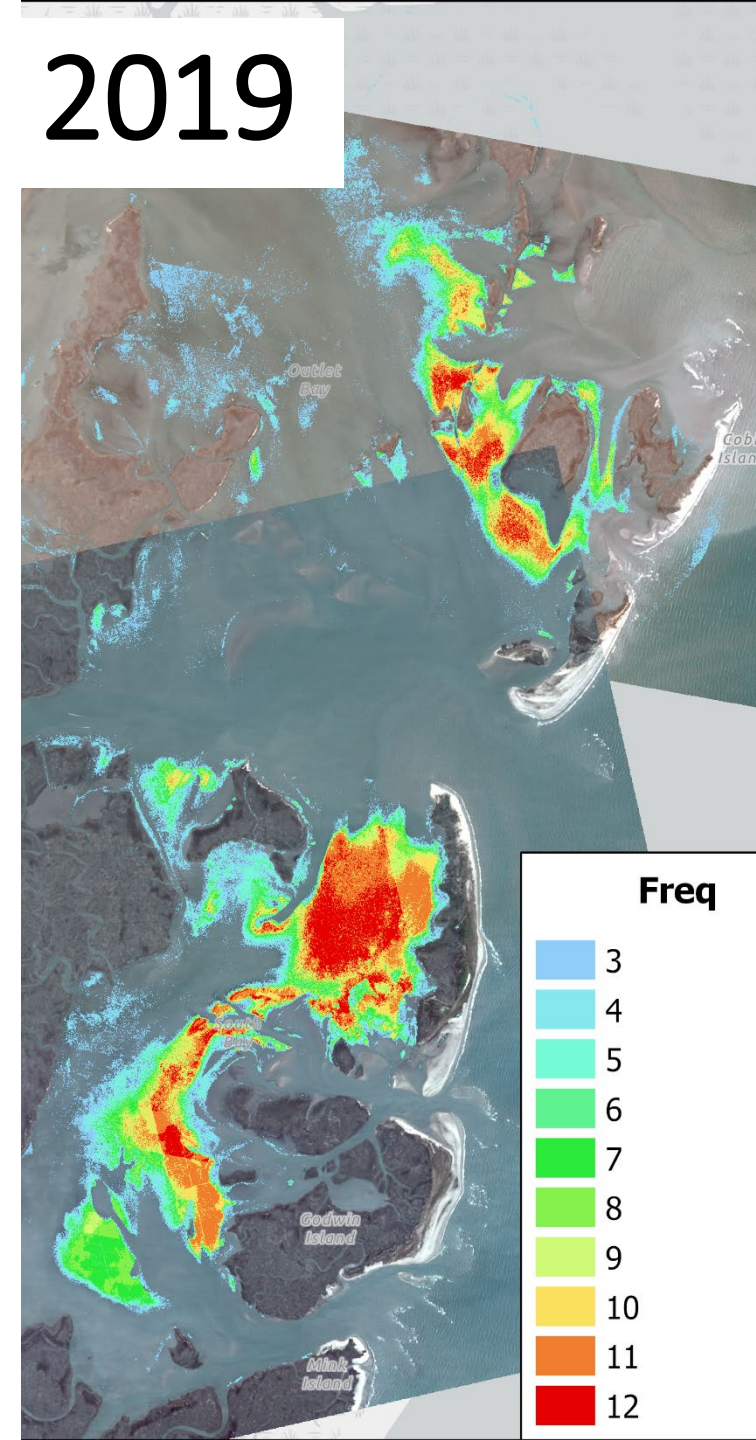
2021



2020



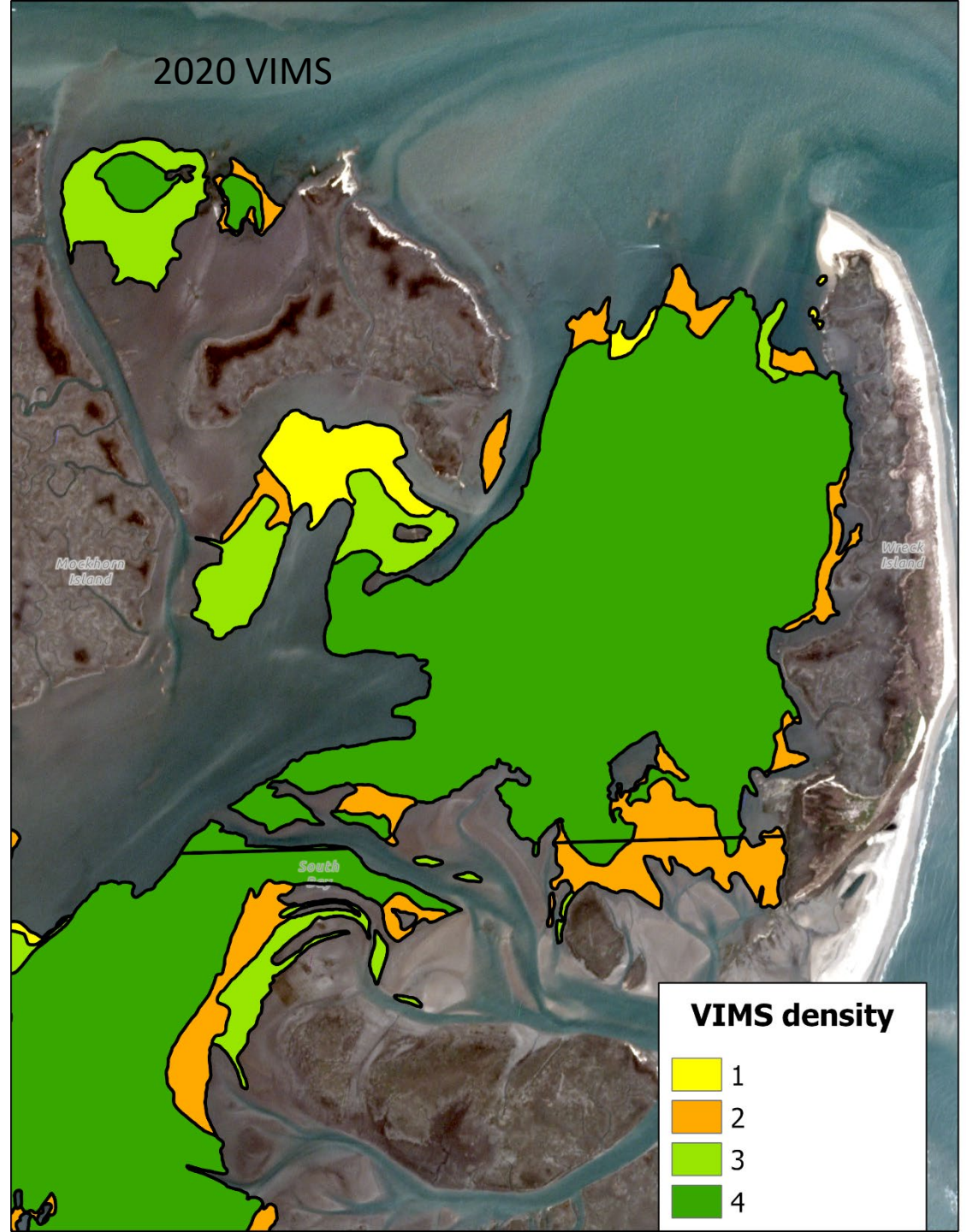
2019



May 2020

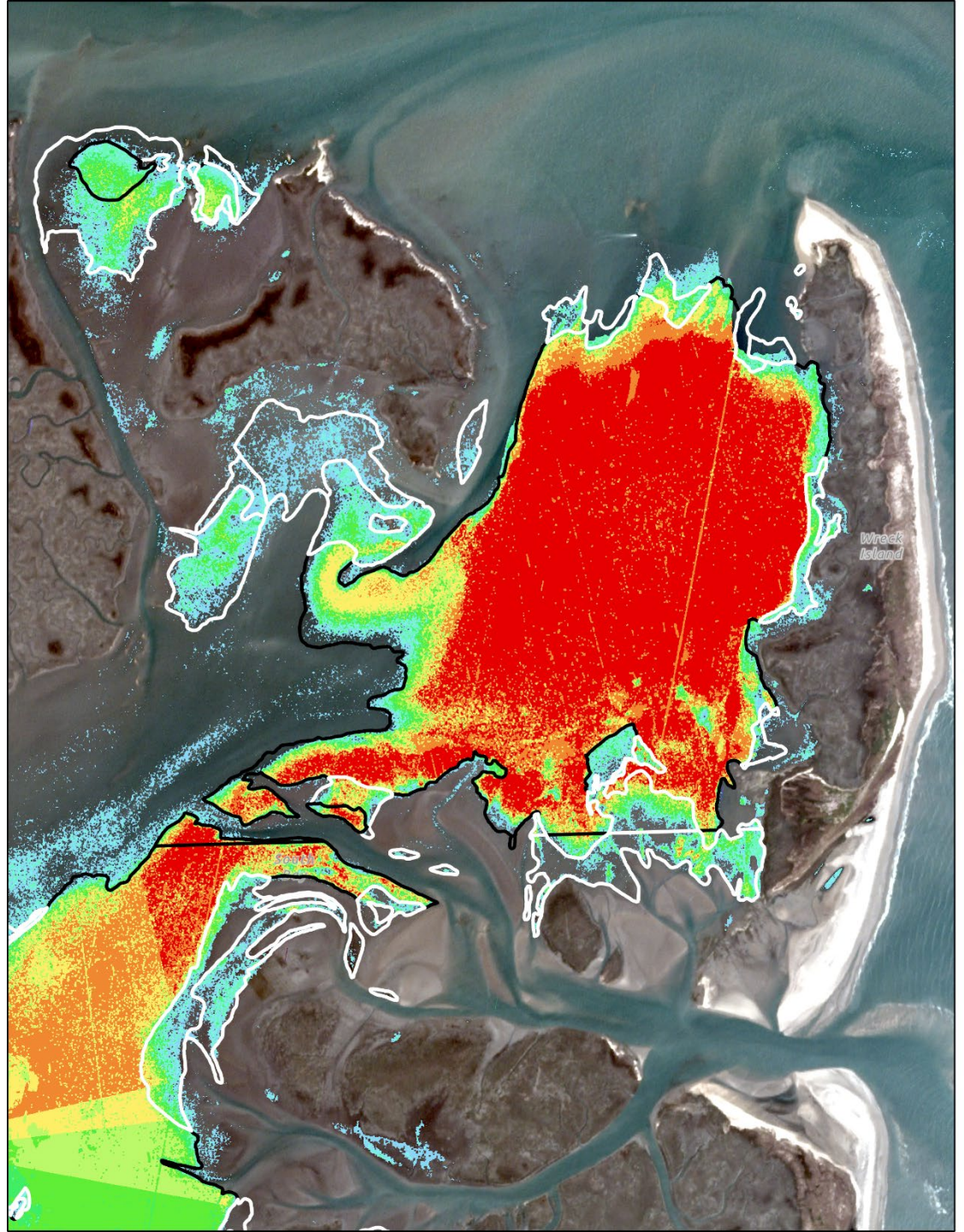
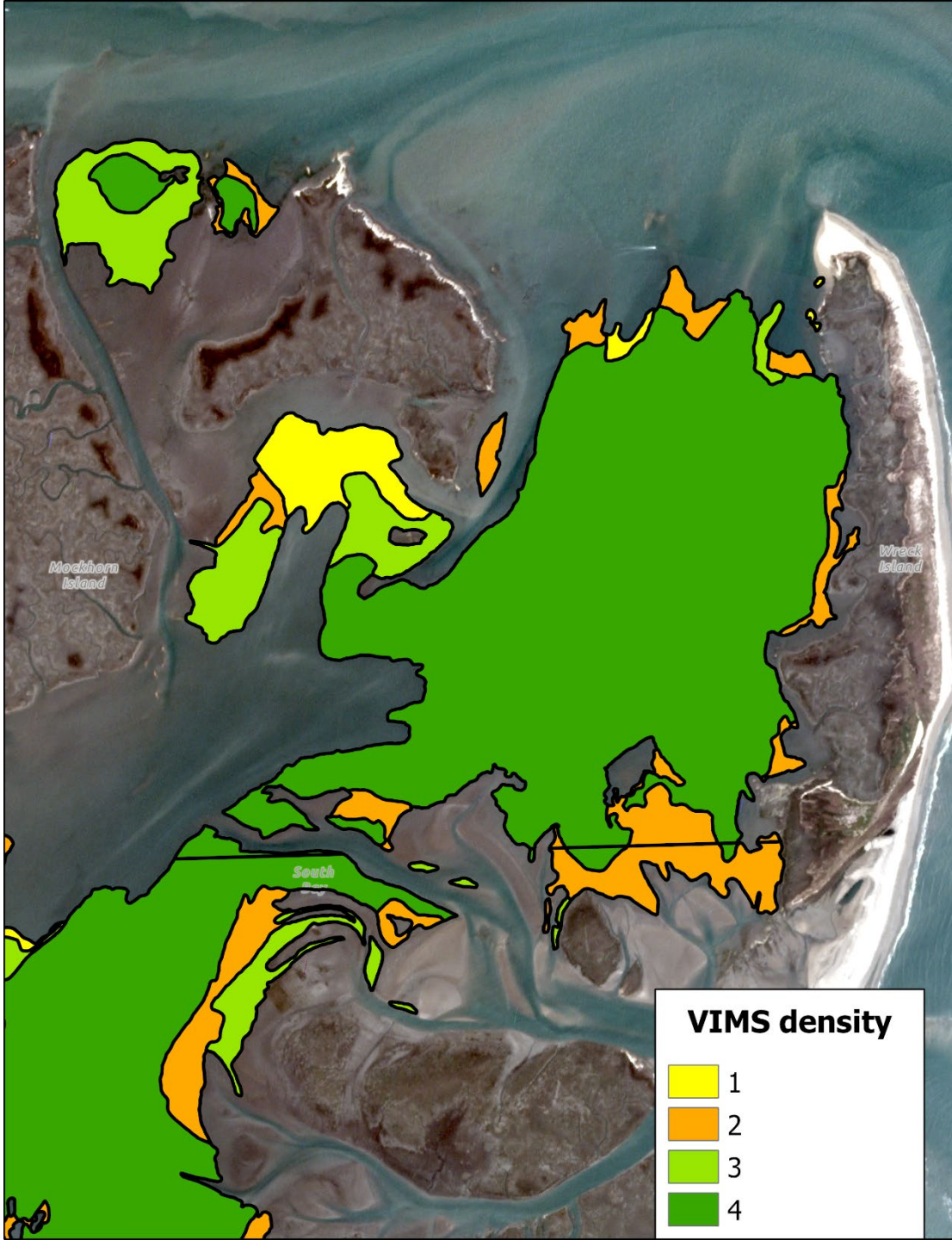


2020 VIMS



VIMS density

- 1
- 2
- 3
- 4

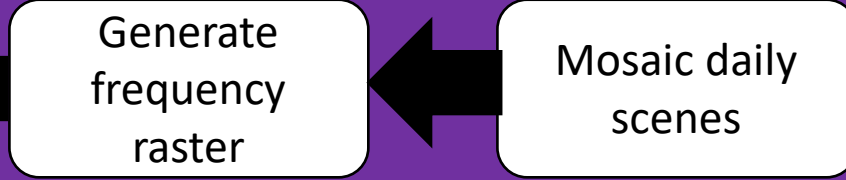
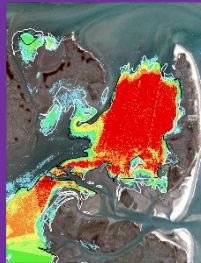


Processing workflow

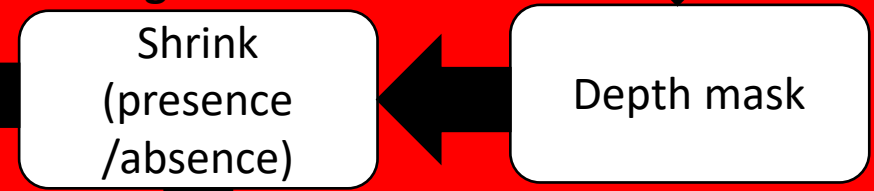
Classifying



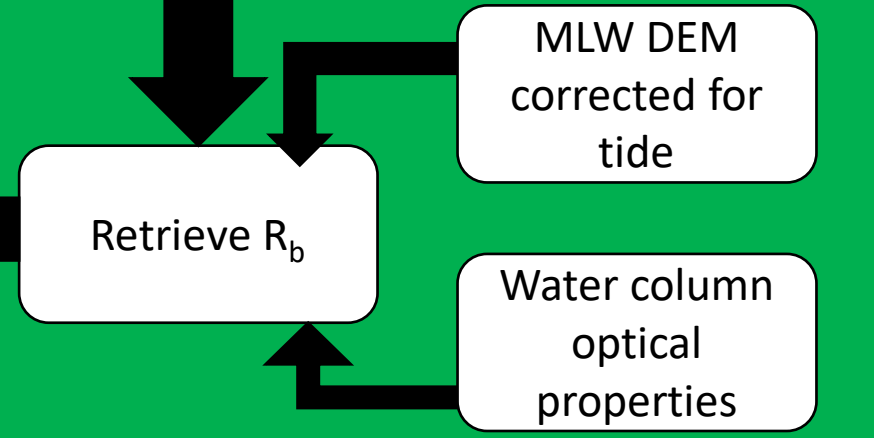
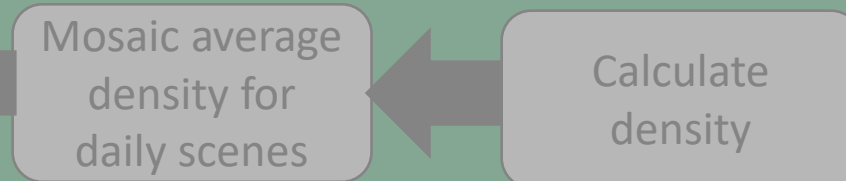
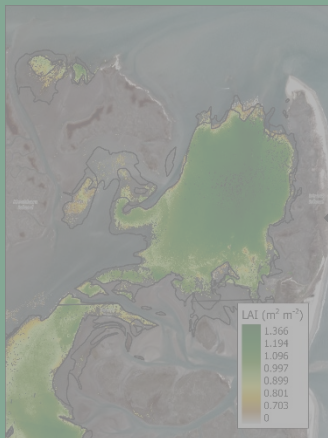
Presence



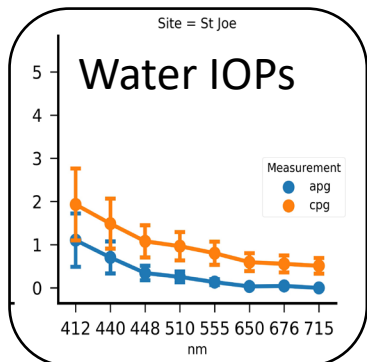
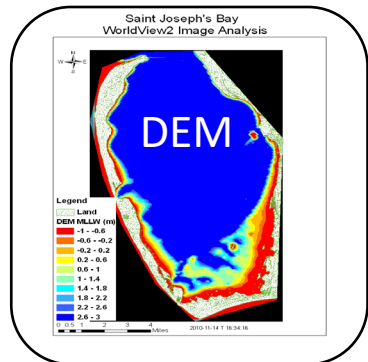
Refining



Density



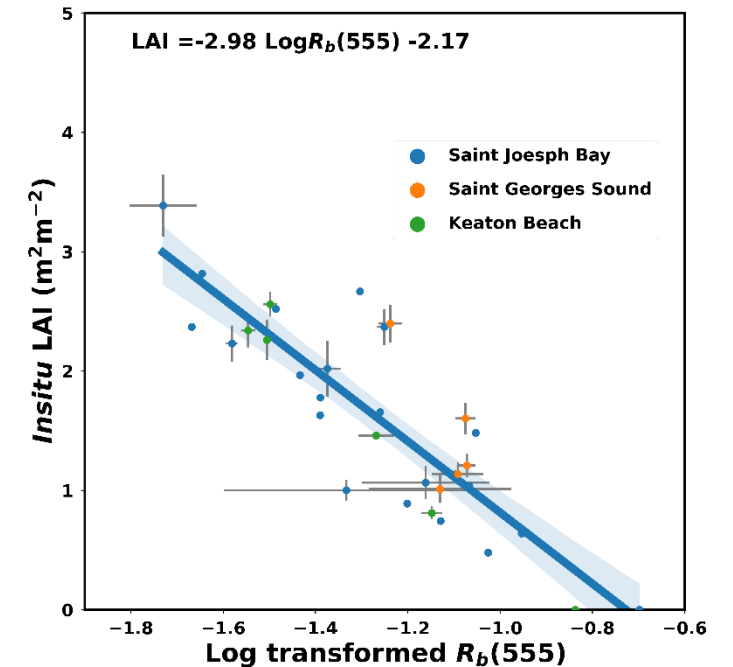
From distribution to density



- Atmospherically corrected R_{rs} from imagery
- $Q_b = E_u(z_b)/L_u(z_b) = \pi$
- K_{Lu} & K_d from *Hydrolight* using measured IOPs
- Water depth, DEM + tide

$$R_b = \frac{R_{rs} Q_b}{t} \frac{\exp[-K_{Lu} z_b]}{\exp(K_d z_b)}$$

- z_b – bottom depth from acoustic survey
- t – air/sea transmittance of $L_u(0.54)$



Hill, V. J., Zimmerman, R. C., Bissett, P., Dierssen, H. M., & Kohler, D. (2014). Evaluating Light Availability, Seagrass Biomass, and Productivity Using Hyperspectral Airborne Remote Sensing in Saint Joseph's Bay, Florida. *Estuaries and Coasts*, 37. doi:DOI: 10.1007/s12237-013-9764-3.

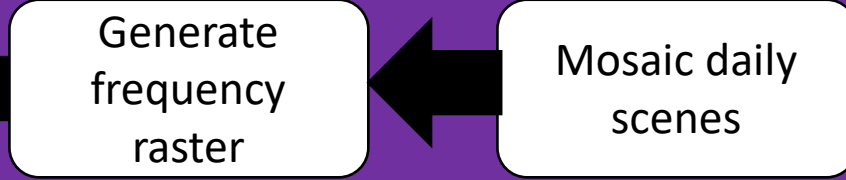
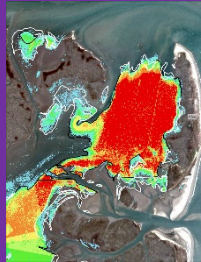
Dierssen, H., R. Zimmerman, R. Leathers, T. Downes, and C. Davis. 2003. Remote sensing of seagrass and bathymetry in the Bahamas Banks using high resolution airborne imagery. *Limnol. Oceanogr.* 48: 444-455.

Processing workflow

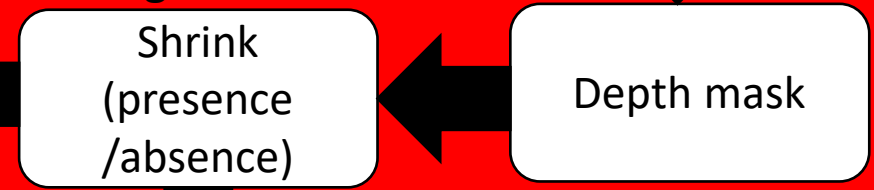
Classifying



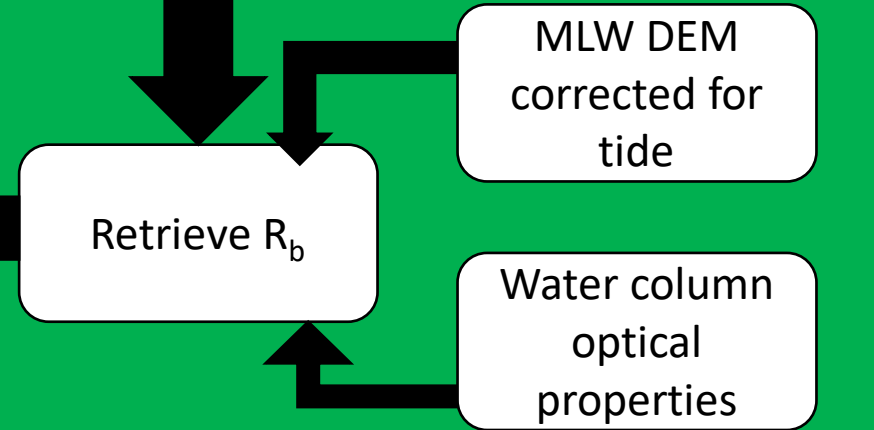
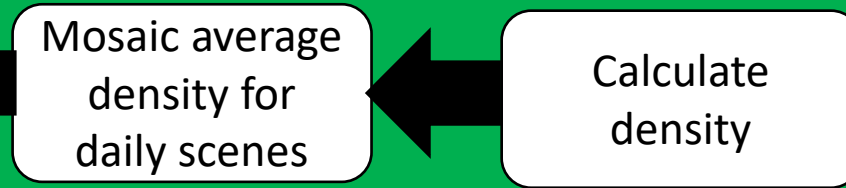
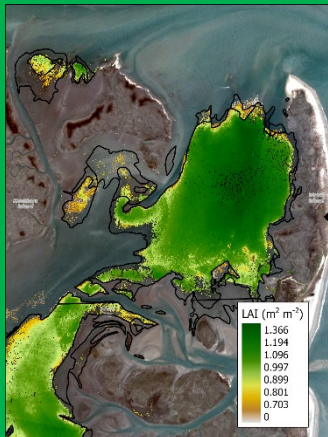
Presence



Refining

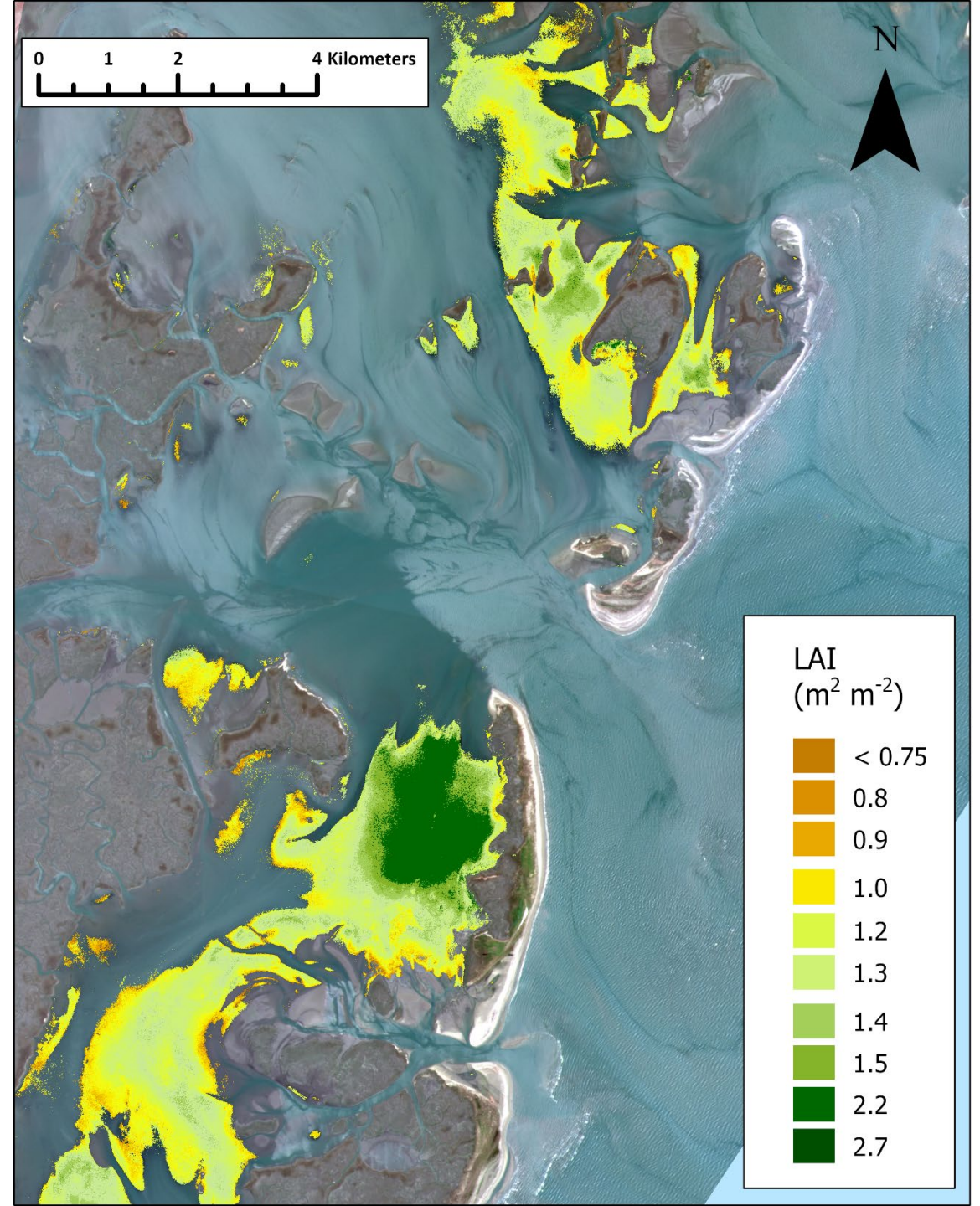


Density



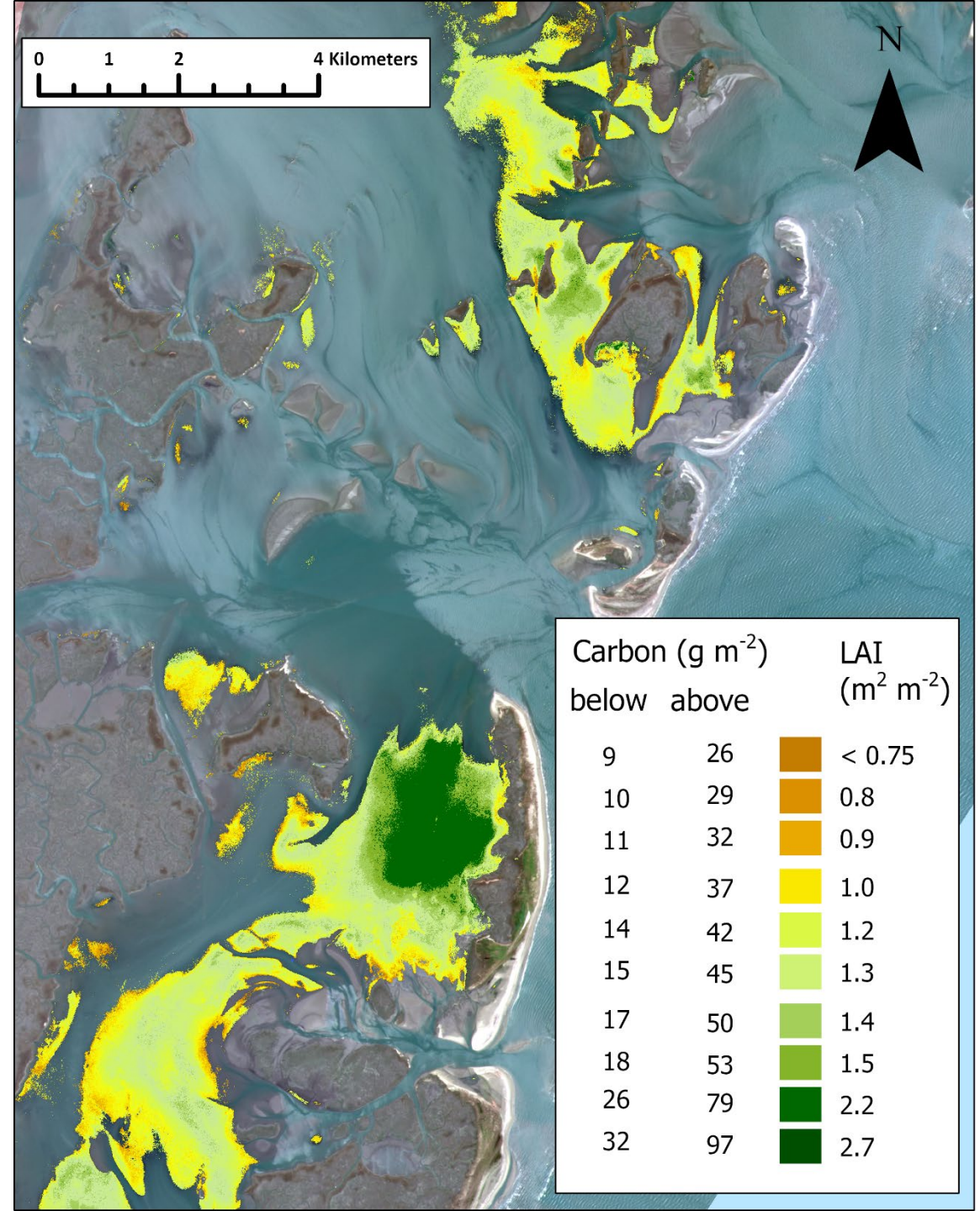
2021 – Leaf Area Index

- Average annual LAI
- Used frequency presence as a mask, values less than #6 were set to null.

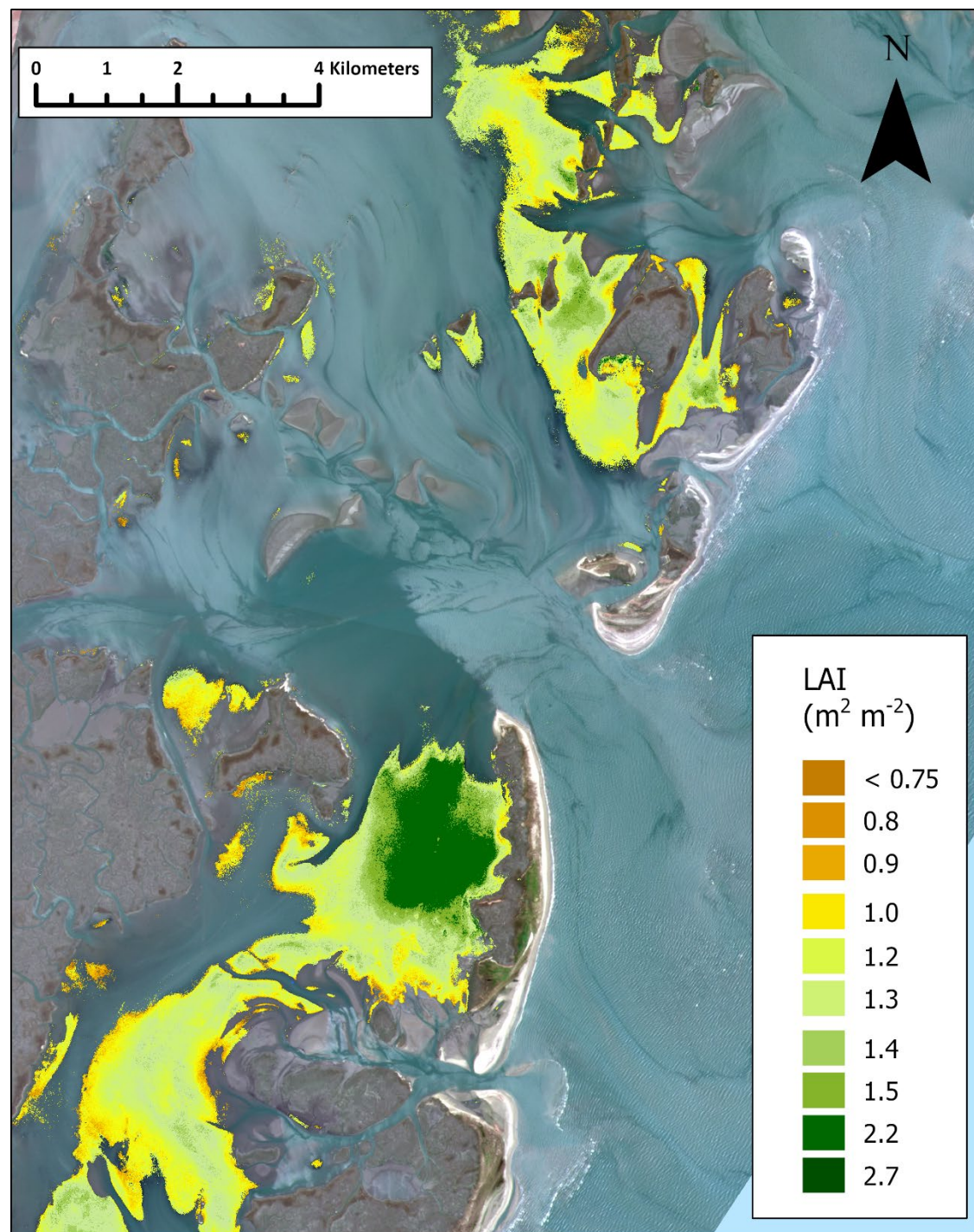
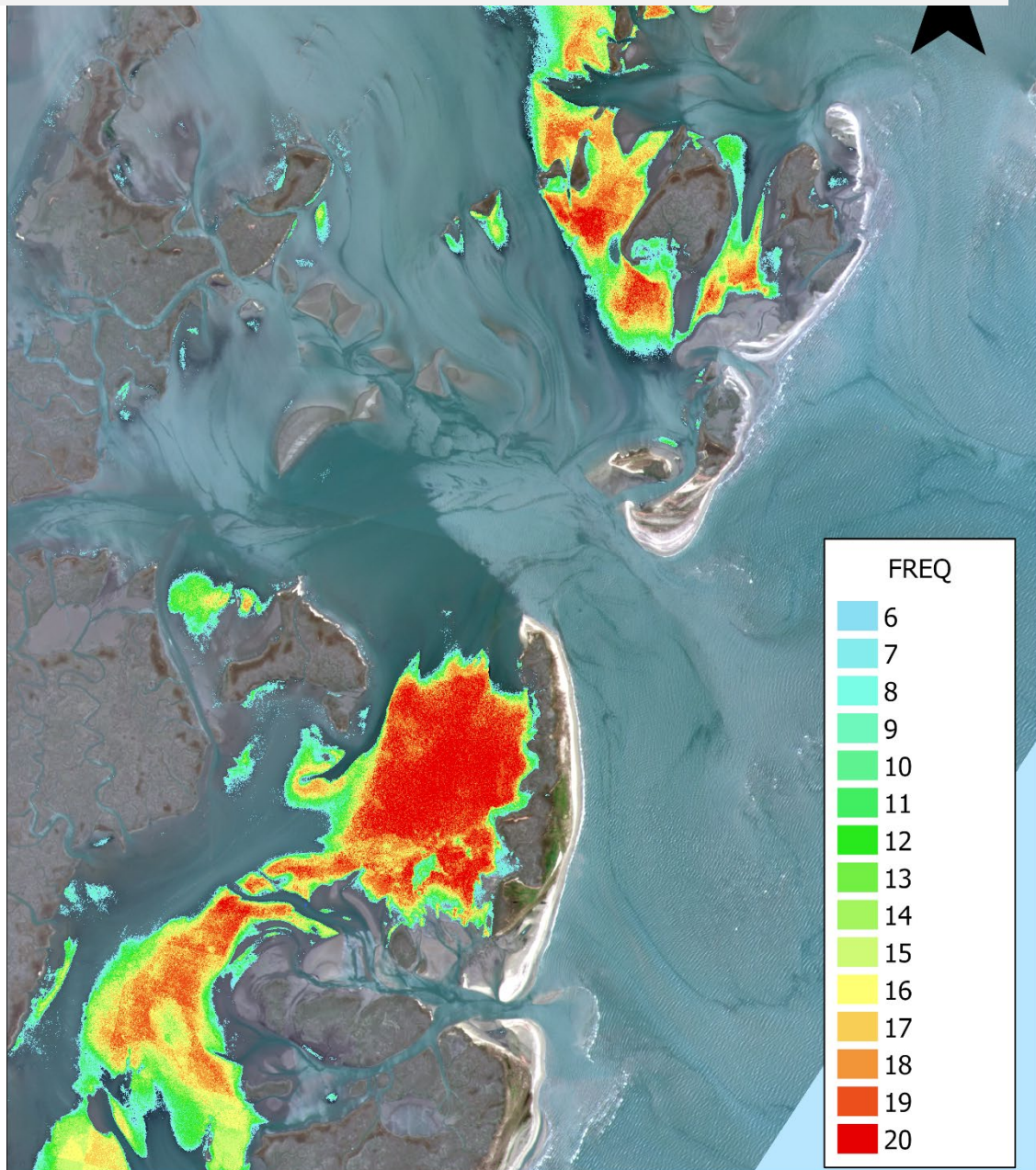


2021 – Carbon

- Use linear transfer coefficients to convert LAI to above and below ground carbon.
- Below ground carbon is based on in situ measurements. 1/3 of the above ground value.



Distribution → Density



Continuing work

- Partly automated processing.
 - Working on training a machine learning algorithm to classify images without additional training.
 - Refine QC techniques for each region.
 - Frequency = density?
-
- Use high frequency of images to overcome turbidity and sparse areas.
 - Sparse areas are still identified.
 - Atmospheric correction needs to be addressed.

