

Using Remote Sensing Techniques
to Assess and Monitor Salt Marsh
Condition in Massachusetts

Threats to Salt Marshes

- Coastal Development
- Invasive species (nutria, green crabs, *Phragmites*)
- Freshwater intrusion
- Tidal restrictions
- Sea level rise
- Nutrient enrichment
- Sediment starvation
- Crab herbivory/trophic cascade
- Salt marsh die back



An aerial photograph of a salt marsh. The landscape is a mosaic of vibrant green marsh vegetation and dark, winding water channels. The sun is low in the sky, creating a warm, golden glow and long shadows across the terrain. The water reflects the light, and the overall scene is a complex, textured environment.

Assessing Salt Marsh Condition & Vulnerability to SLR

Access is difficult

Difficult to collect data at all stages in the tide cycle

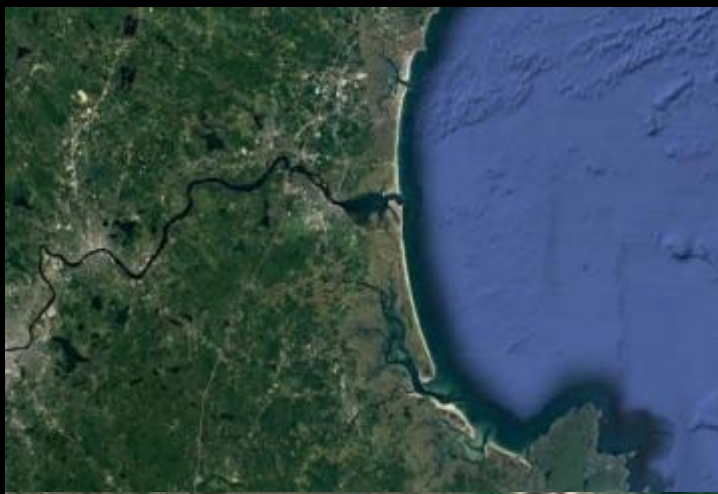
Timing of aerial photos & satellite data

UnVegetated to Vegetated Ratio (UVVR)

Unoccupied Aerial Systems (drones & sensors)

- Subtle changes in vegetative composition
- Water content of marsh peat
- Peat density
- Plant stress

Combination of remote sensing and ground truthing to comprehensively assess salt marsh condition



Objectives

- ❑ Create an automated classification model
 - Vegetation
 - Water features
 - Bare ground

- ❑ Assess salt marsh condition
 - Identify areas of degradation
 - Identify areas of stress
 - Characterized tidal hydrology

- ❑ Protocol and tools that can be used by researchers & practitioners
 - Condition assessment
 - Assist in planning and implementation of conservation action
 - Monitor responses to natural disturbance and ecological restoration



Tools in the toolbox: UAS platforms



DJI Matrice 600 Pro Hexacopter - front

DJI Matrice 600 Pro
(Carries heavier sensor payload)



DJI 210
(Carries medium sensor payload)



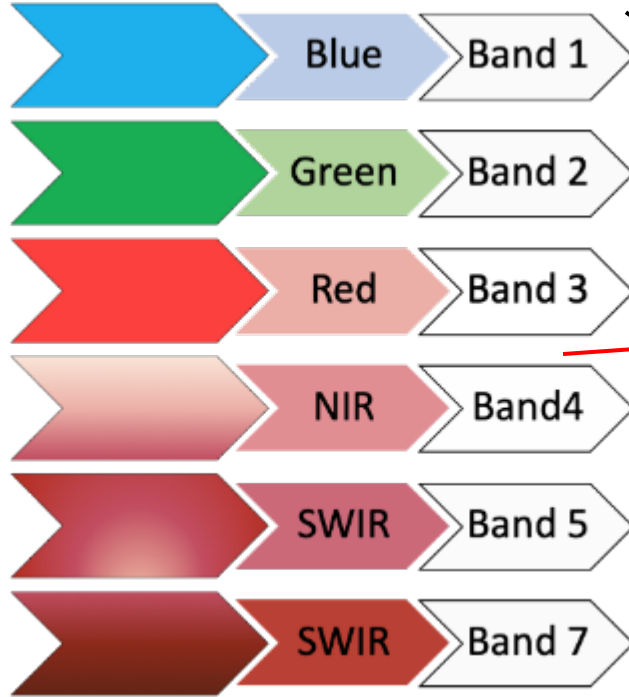
Visible Blue, Green, Red
RedEdge
Near Infrared (NIR)



Shortwave Infrared

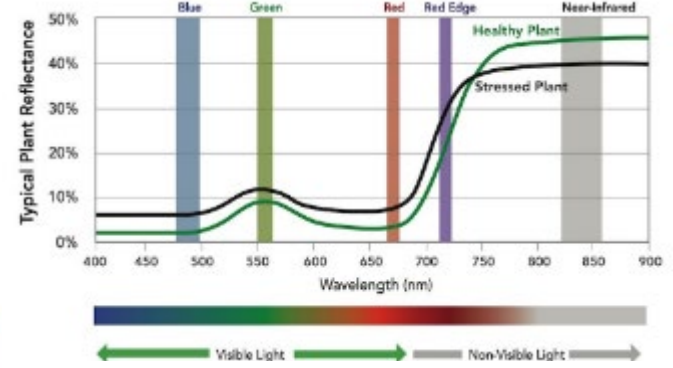
UAS Spectral Resolution

Landsat

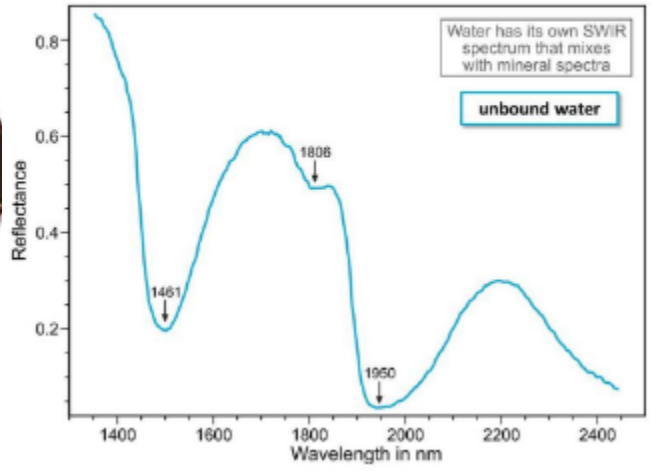


UAS

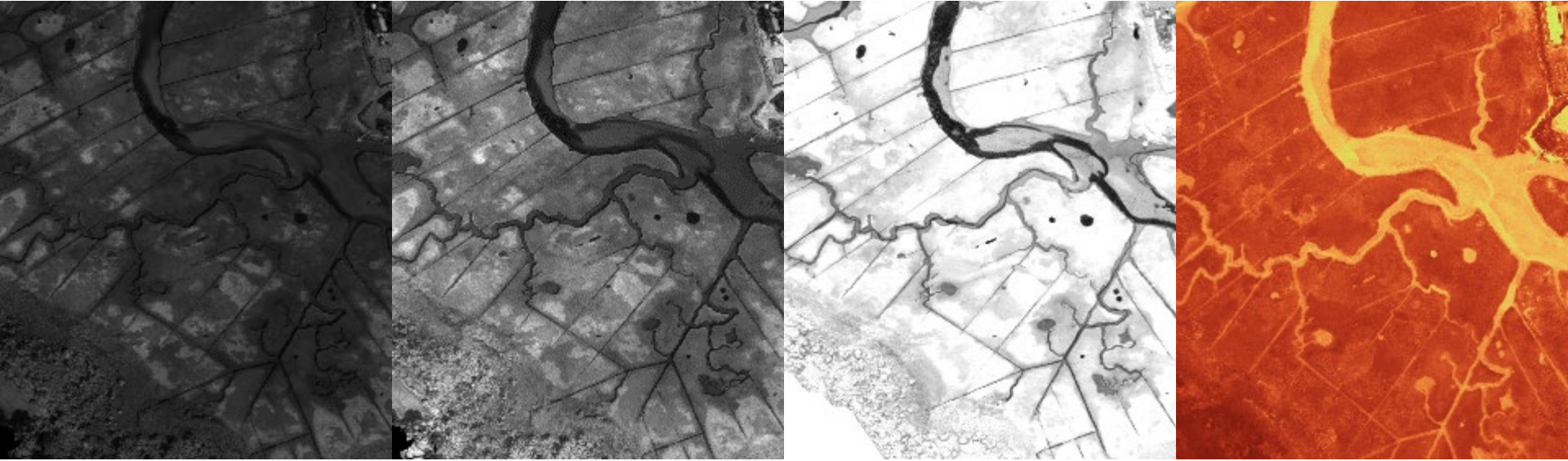
MicaSense RedEdge



SWIR Water Spectrum



South River (South Shore)



Rededge

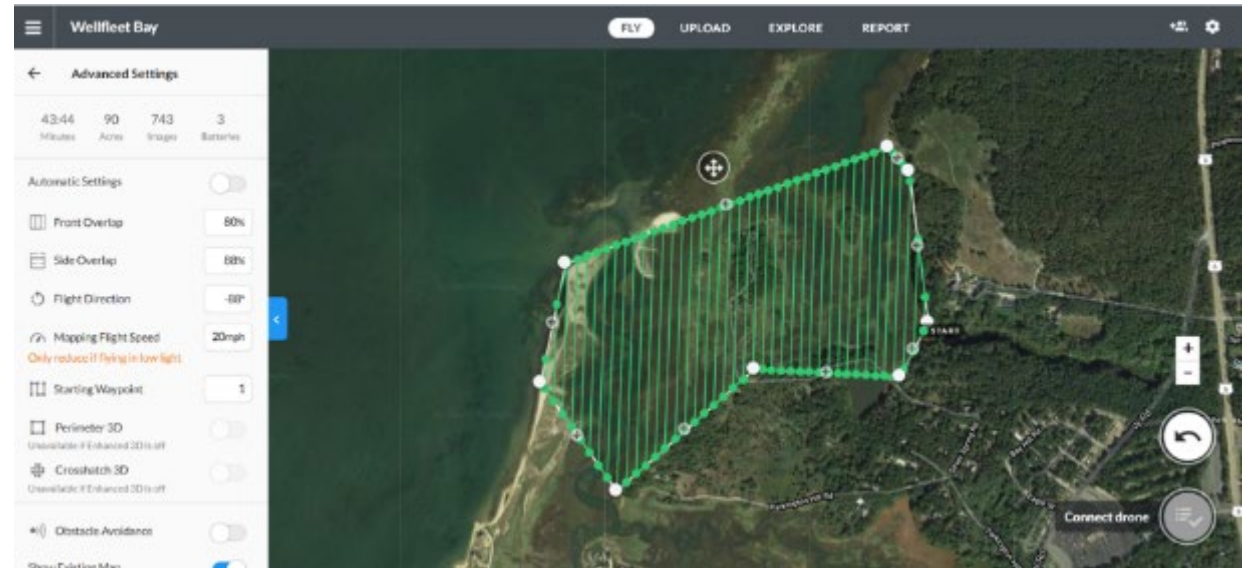
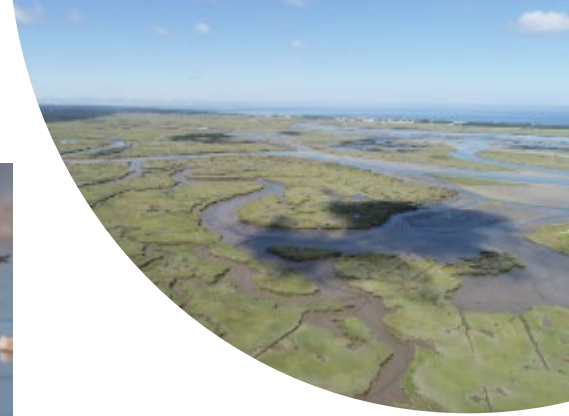
NIR

SWIR

NDVI
(calculated)

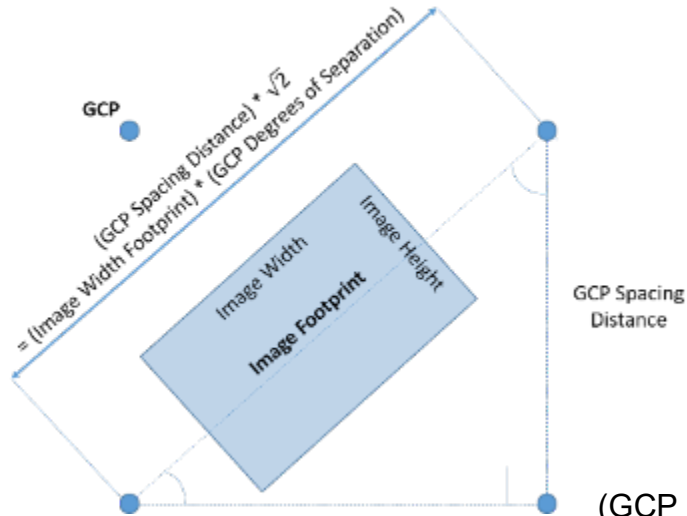
Flight Information

- Receive permissions from nearby airports, land owners, and conservation commissions, MassWildlife & USFWS (for endangered birds)
- Fly at 400 feet
- 70% Overlap
- 100 acre footprints



Ground Control Points

- Strategically placed throughout the salt marsh
- Appear in all bands
- Allows remote sensing data to be accurately stacked

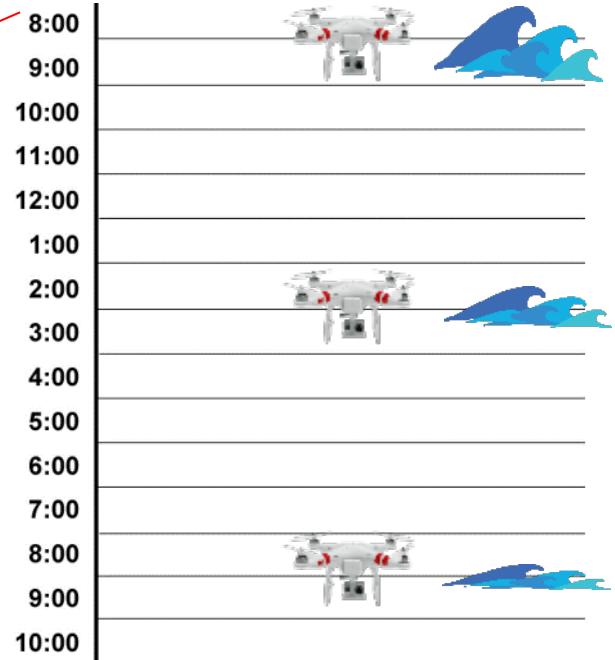


$$(\text{GCP Spacing [m]}) = (\text{camera-GCP degrees of separation}) \text{ Image Footprint Width m}^2$$



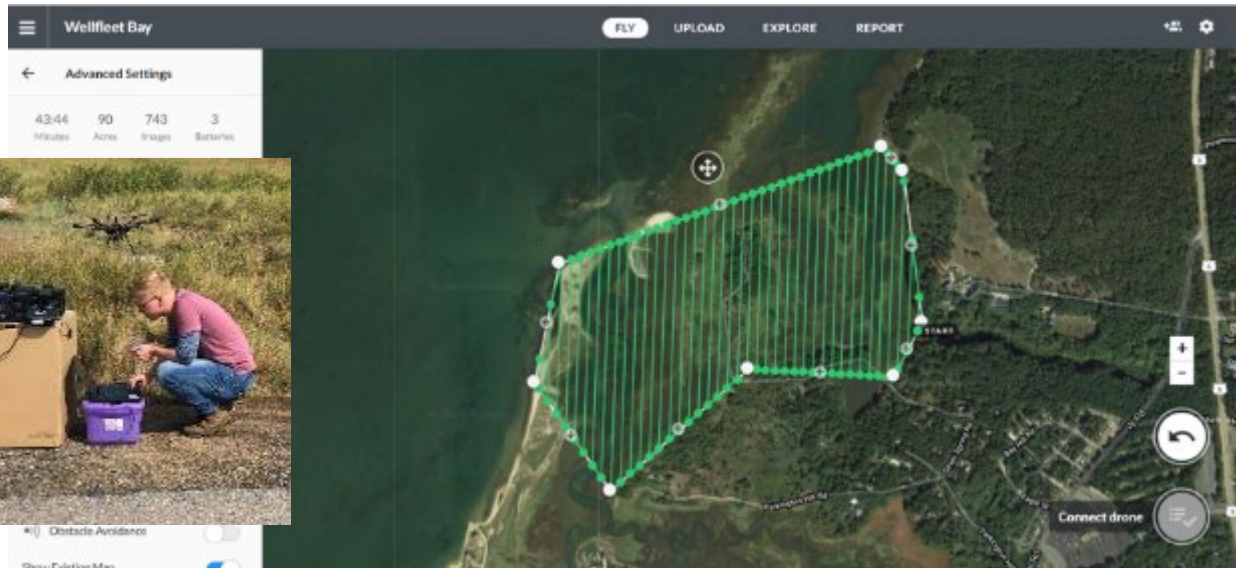
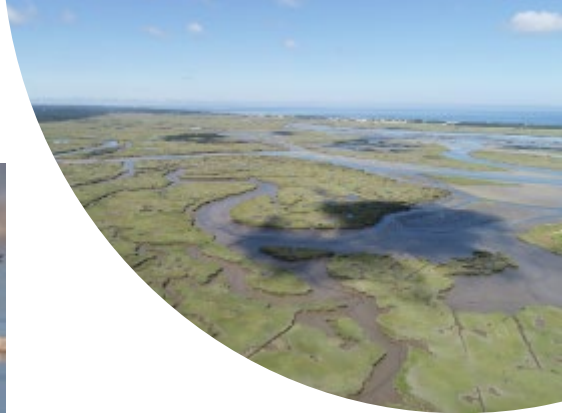
UAS Temporal Resolution

Sunday	Monday	Tuesday	Wednesday	Thursday	Friday	Saturday
29	30	1	2	3	4	5
6	7	8	9	10	11	12
13	14	15	16	17	18	19
20	21	22	23	24	25	26
27	28	29	30	31	1	2



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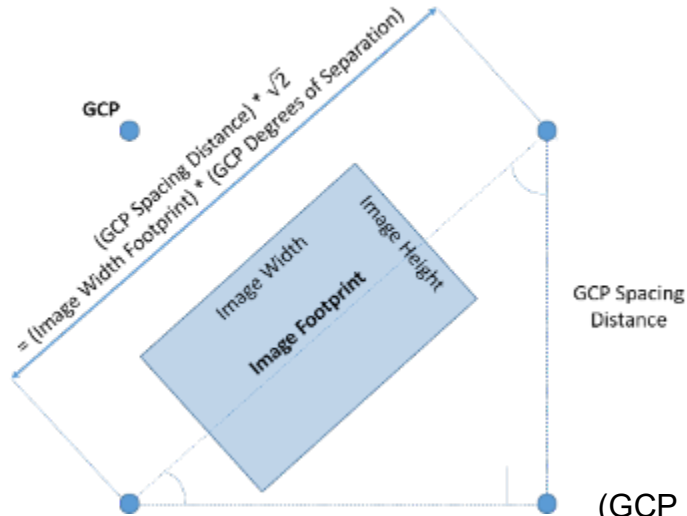


Advanced Settings			
43:44	90	743	3
Minutes	Acres	Images	Batteries



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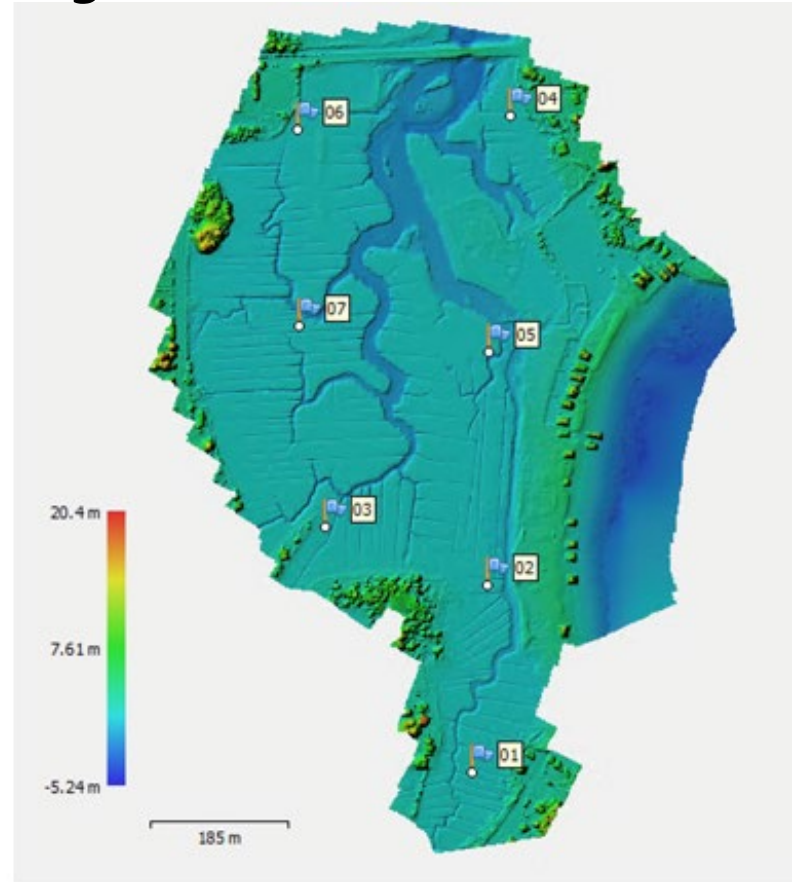
Data Products

Orthomosaics



Peggotty Beach, Scituate

Digital Elevation Models (DEMs)

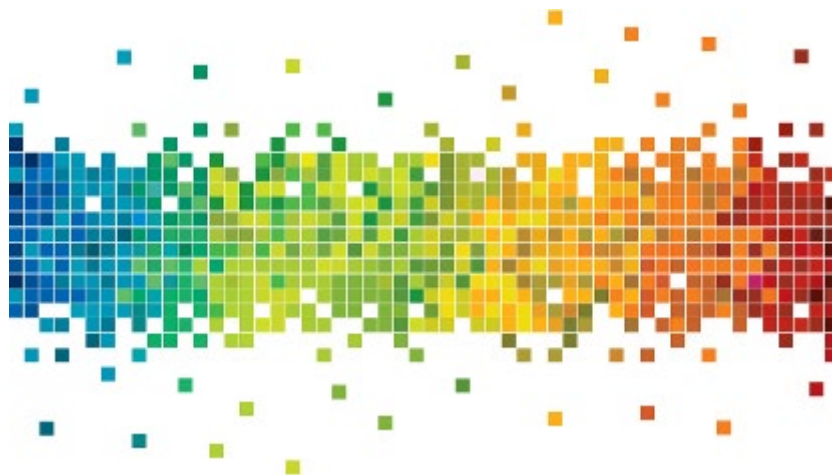


Essex Bay (North Shore)

UAS Orthomosaic

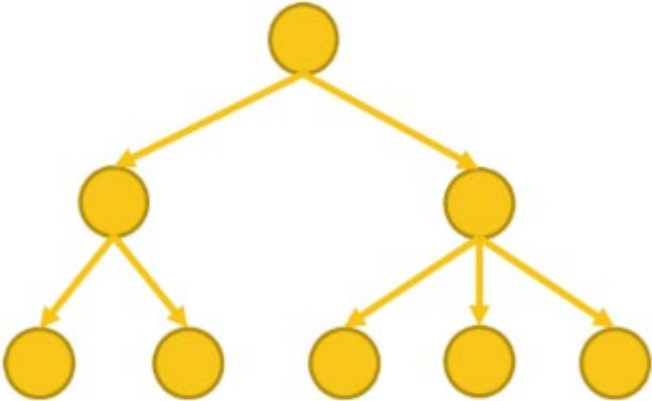


6 bands, 3 tidal cycles =
18 features per pixel, per day
1,458,000,000 data points per site per day!

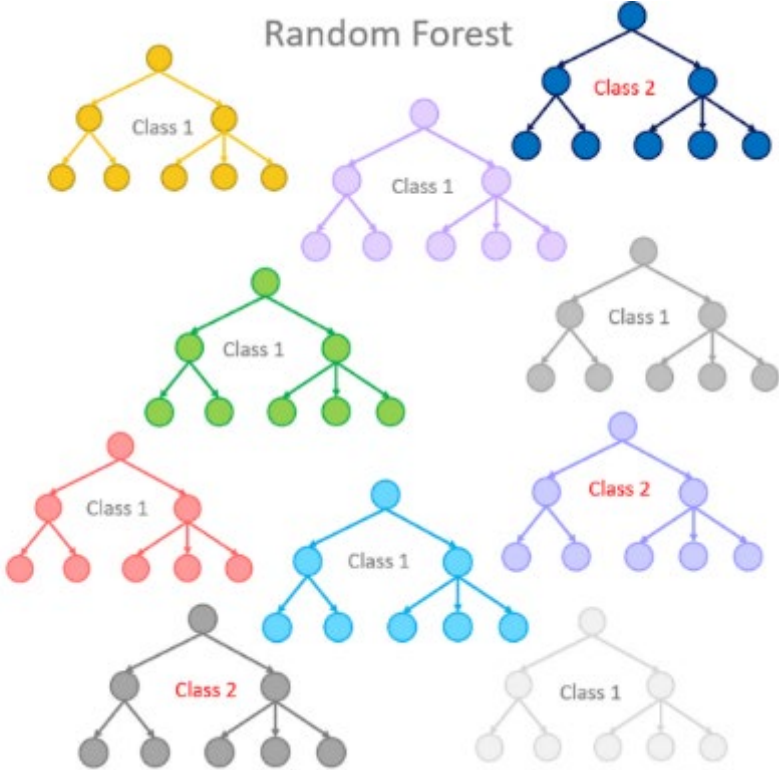


Decision Trees and Machine Learning

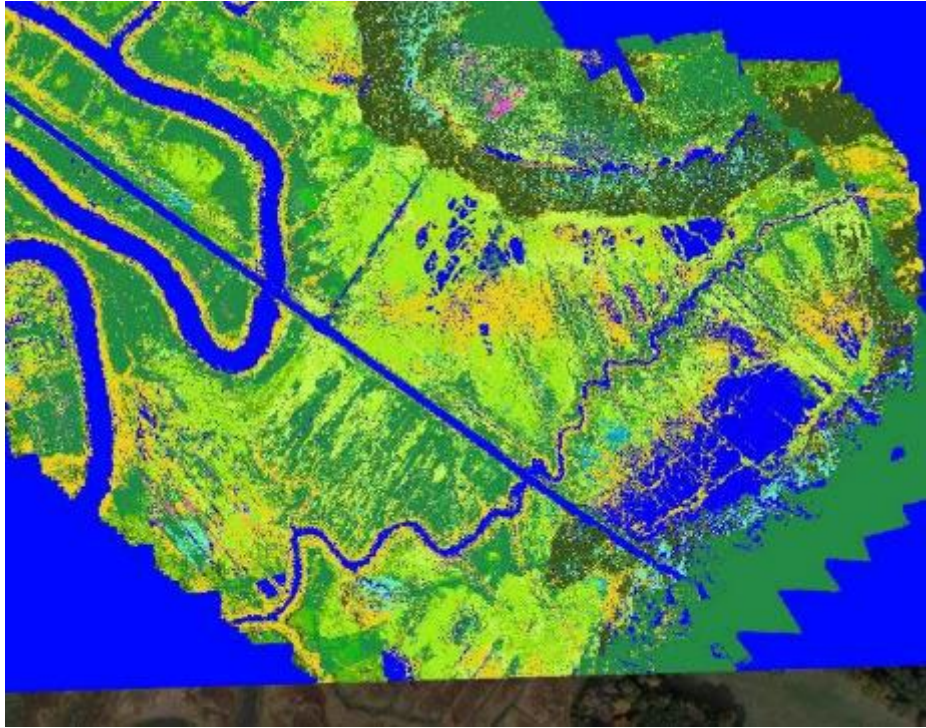
Single Decision Tree



Random Forest



Vegetation Classification



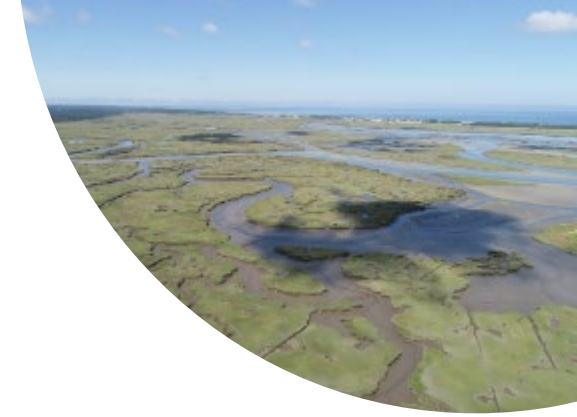
Salt Marsh Classification

First Level: Class (first digit - number)

1 - Vegetated: > 30% vegetation cover

2 - Water feature: 100% inundated at typical high tide with < 30% vegetation cover

3 - Bare ground: Exposed at typical high tide with < 30% vegetation cover



Verify Location
of Features

Salt Marsh Classification

Subclass

1 - Vegetated: > 30% vegetation cover

01 - Low marsh (tall form *Spartina alterniflora* dominant)

02 - Intermediate marsh (mix of high marsh vegetation and tall form *S. alterniflora*)

03 - Transitional marsh 1: short form *S. alterniflora* dominant (> 80%) mixed with typical high marsh species

04 - Transitional marsh 2: short form *S. alterniflora* common or dominant (30-80%) mixed with typical high marsh species

05 - Transitional marsh 3: *S. patens* & *D. spicata* dominant but mixed with 5-30% short form *S. alterniflora*

06 - High marsh 1: > 90% plant cover in *S. patens* & *D. spicata* and < 5% short form *S. alterniflora*

07 - High marsh 2: < 90% plant cover in *S. patens* & *D. spicata*, mixed with other high marsh species but < 10% shrub species and < 5% short form *S. alterniflora*

08 - *Juncus gerardii* band: > 50% of marsh vegetation is *Juncus gerardii*

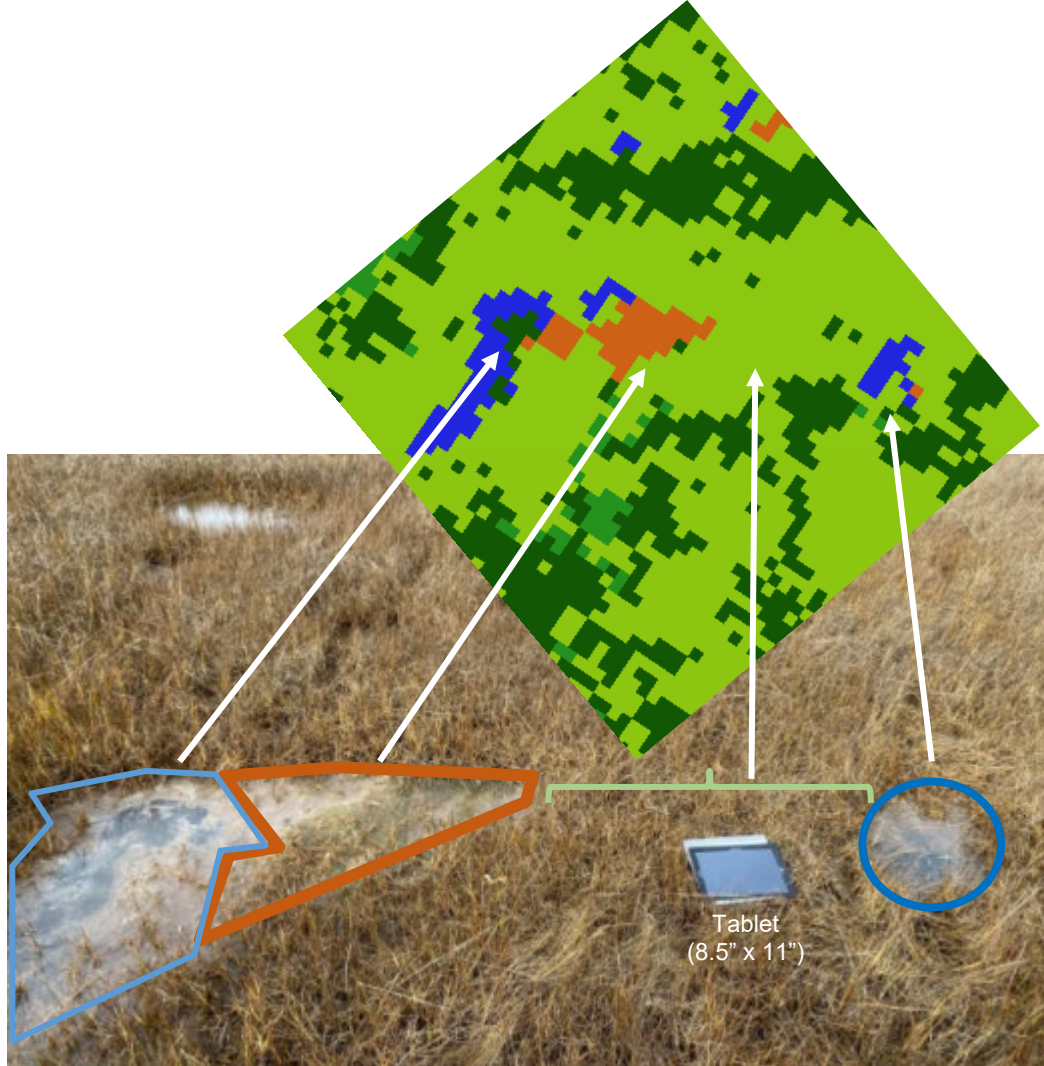
09 - Salt-shrub marsh (high marsh vegetation mixed with shrub species)

10 - *Salicornia* or *Suaeda* marsh

11 - Brackish marsh

12 - Brackish marsh - Phragmites: > 30% vegetative cover of *Phragmites australis*

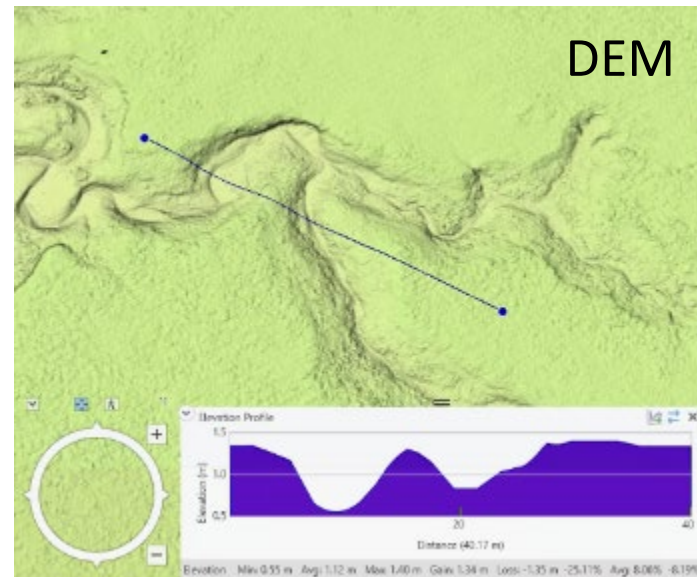
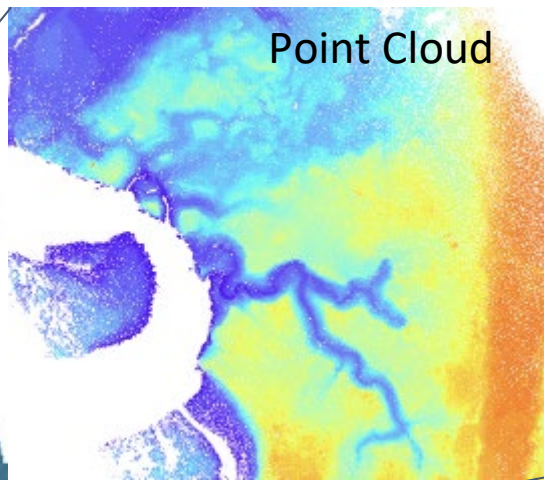
13 - Vegetated ditch edges: mix of high marsh vegetation and intermediate form (neither tall nor short) *Spartina alterniflora* as linear features along the edges of water features (typically along the crown of ditch banks)



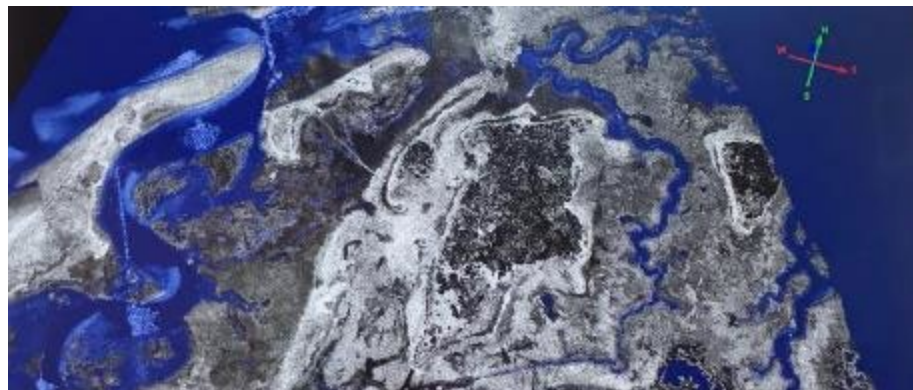
Inertial Labs RESEPI with HESAI XT32



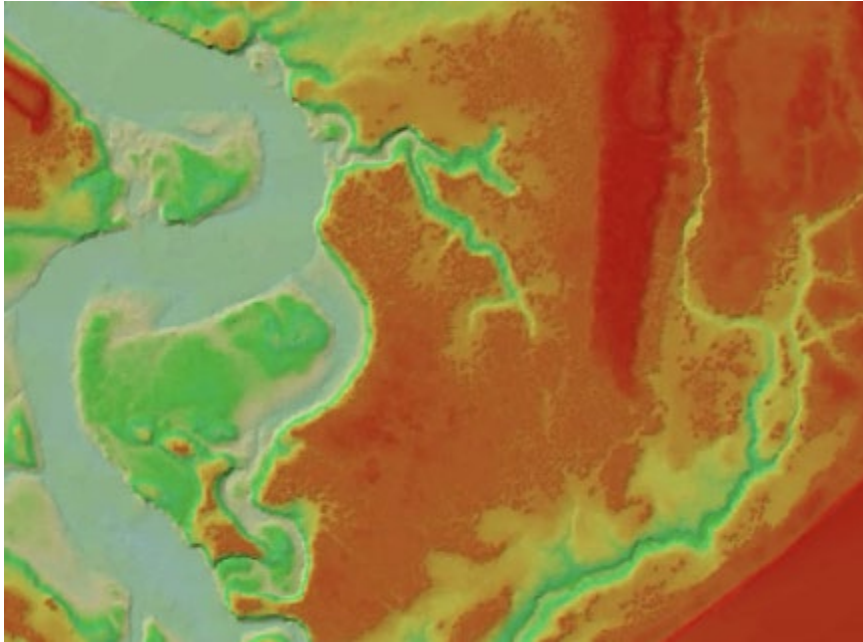
LiDAR



Wellfleet Bay



LiDAR DTMs

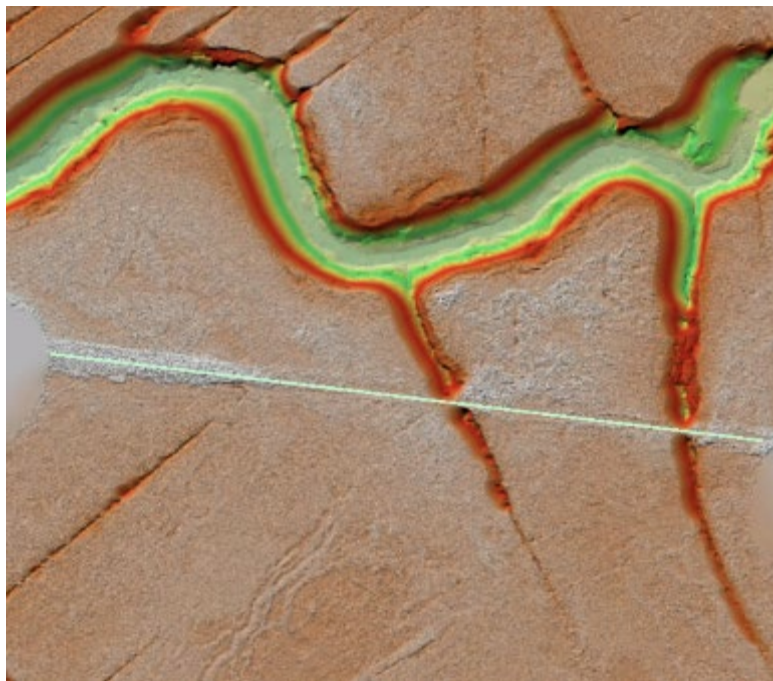


Filtered LiDAR
Digital Terrain Model

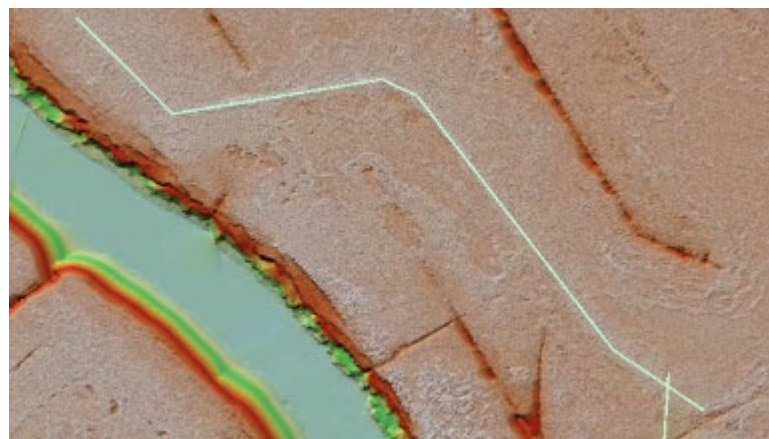


RGB Orthomosaic

Identification of Historical Embankments

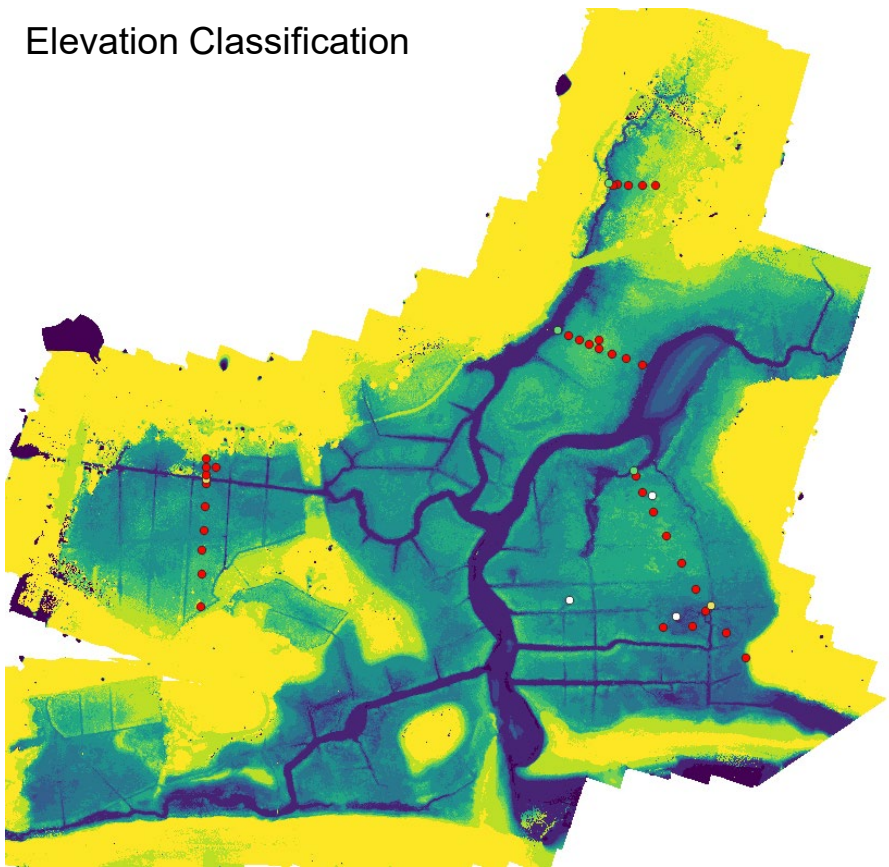


Filtered LiDAR DTMs

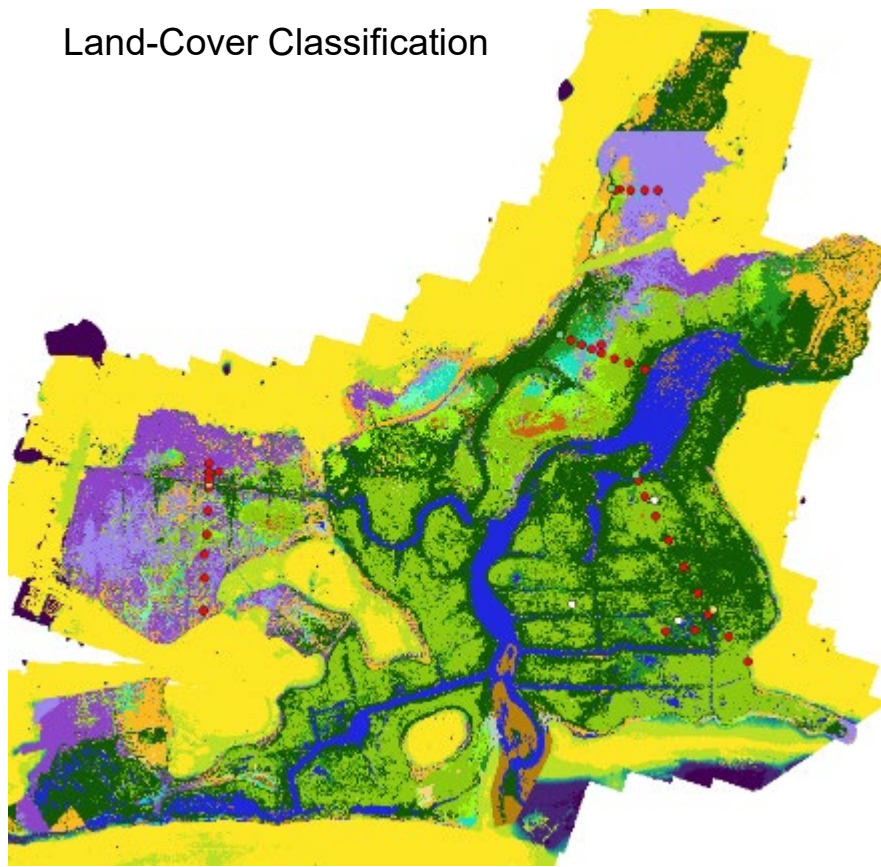


HOBO Water Logger Array

Elevation Classification



Land-Cover Classification



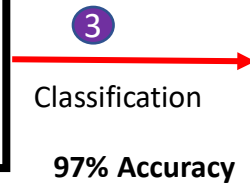
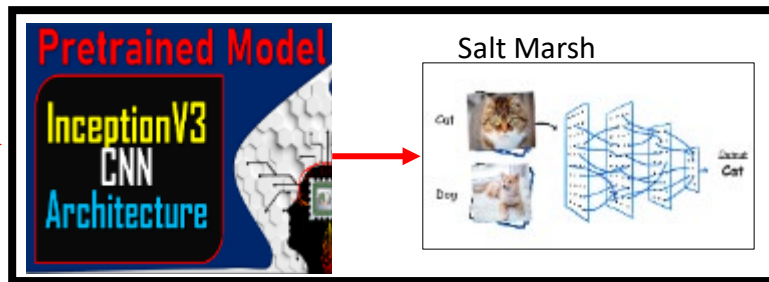
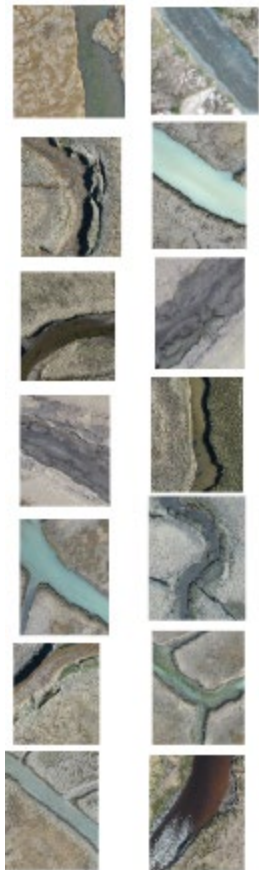
Creek Channel Erosion



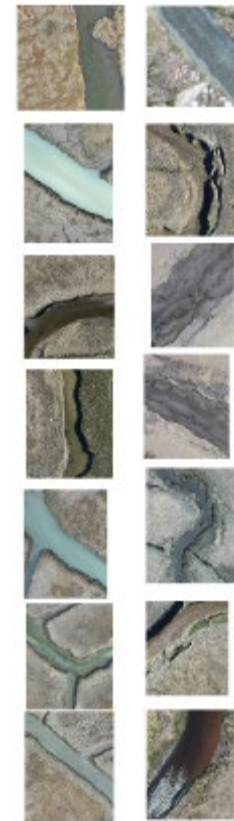
Zoom in to show extent of 300x300 tiles

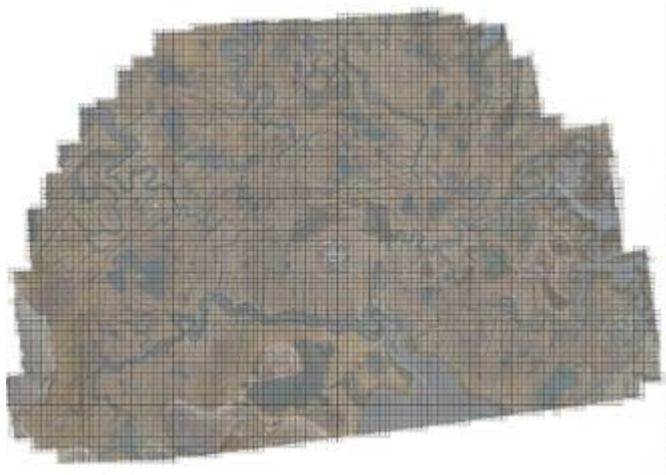
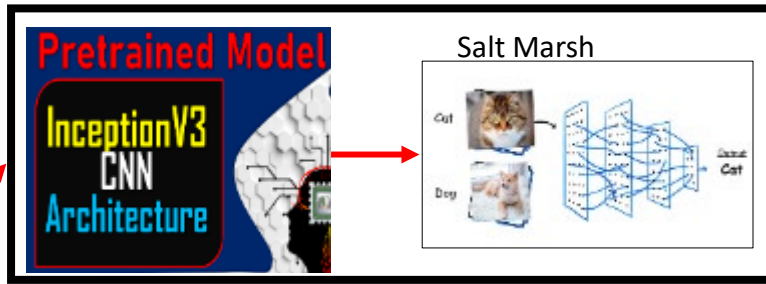


Training set: 50/50 300x300
tiles, multiple sites. ①

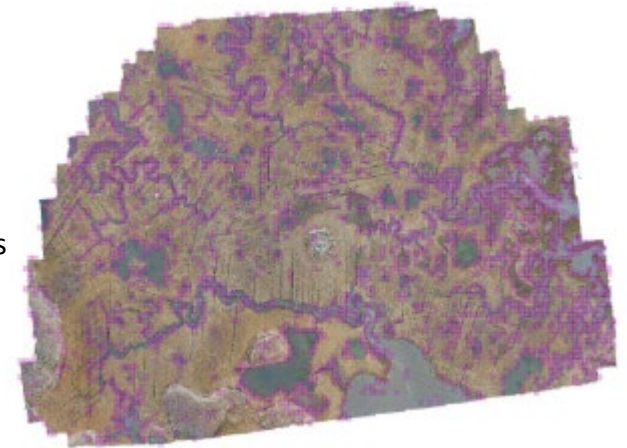


Healthy Unhealthy





**Essex Bay with
tiling showing**

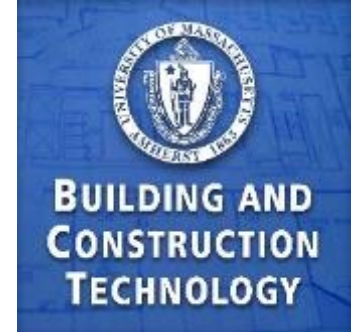


**Unhealthy tiles
(purple)**

Funding



Access and Field Support



Towns: Newbury, Essex, Scituate, Marshfield, Westport, Harwich, Chatham, Barnstable, Wellfleet