Mapping Kissimmee River Floodplain Vegetation: An Approach Using Machine Learning In Small Plots

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Kissimmee River Location



- Location: Central Florida, about 50 miles South of Orlando
- Length: 103 miles
- Drains Lake Kissimmee
- Drains into Lake Okeechobee

Kissimmee River Circa 1947

Native River:

Natural flood pulse
Highly productive and diverse wetlands
Abundant native flora and fauna

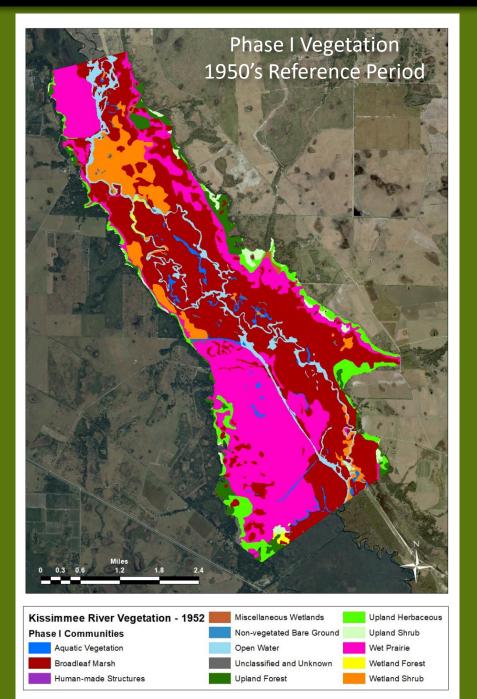
SOUTH FLORIDA WATER MANAGEMENT DISTRICT



Kissimmee Restoration Project :

- •Backfilled one-third of C-38 canal
- Re-established flow to 40-50 miles of river channel
- Potential inundation reestablished to roughly 25,000
 - acres of floodplain area
- Intermittent floodplain inundation re-established

Channelized System:
Controlled flooding
Little or no natural inundation
Drained 60% of wetlands
Lowered plant, fish, and waterfowl abundance and diversity
Discussions began immediately about restoring the river



Evaluating Vegetation for KRR

Wetland Vegetation:

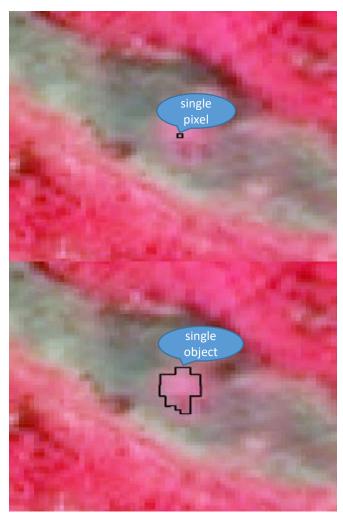
- Evaluated based on "reference conditions" from 1950's vegetation map:
 - Compare current vegetation map derived from aerial (or satellite) images to reference map
 - Evaluation based on specific performance measures for total wetland area, area of Wet Prairie, and area of Broadleaf Marsh
 - Most recent aerial imagery collected in 2023

I will complete a new vegetation map of the Kissimmee floodplain this year based on 2023 imagery using the methods I discuss in this presentation

Mapping Process

Machine-based Image Analysis:

- Object Based Image Analysis (OBIA):
 - A computer joins adjacent pixels with close spectral or other signatures into "objects," which creates entities more similar in size and shape to real-world objects (buildings, water bodies, plant canopies, etc.)
- Machine Learning (ML) classification methods:
 - Can use object signatures based on spectral, elevation, or any continuous or discrete characters for training an ML model
 - Once trained, ML methods allow for more flexible machine-based classifications
- Today, I'm discussing combining **ML and OBIA** algorithms developed through both commercial and open-source software products to produce a vegetation map.
- The benefit of using these methods is a quick turnaround and lower funding requirements, compared to traditional mapping methods or using private mapping contractors.

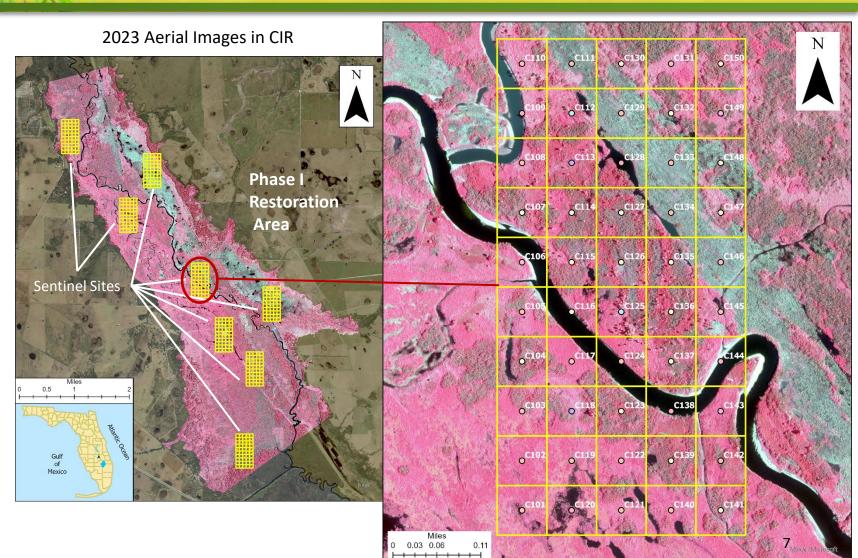




Using Sentinel Sites

A Proof of Concept:

- For 2023 mapping effort, we began using grids of fifty 1hectare cells (called Sentinel Sites) to collect vegetation signatures by helicopter and airboat
- When in helicopter, we collect GoPro video transects in these grids to maximize the generation of signatures
- Use ML techniques to map these smaller sites
- Then extrapolate to full floodplain extent





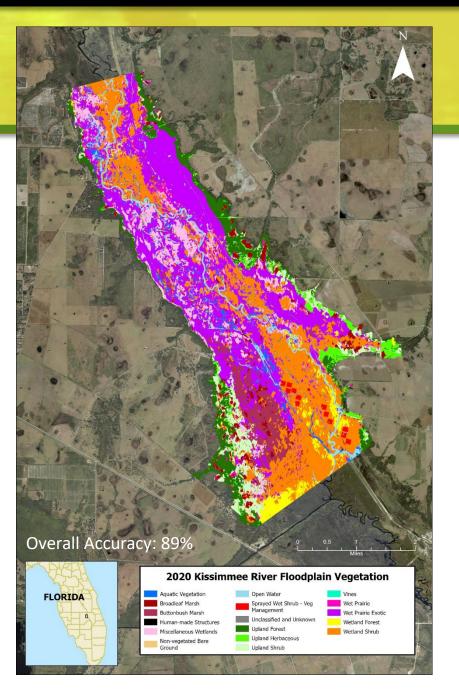




2020 Map Result

Goal of 2023 mapping effort is to produce a similar map to this one from 2020, but more efficiently

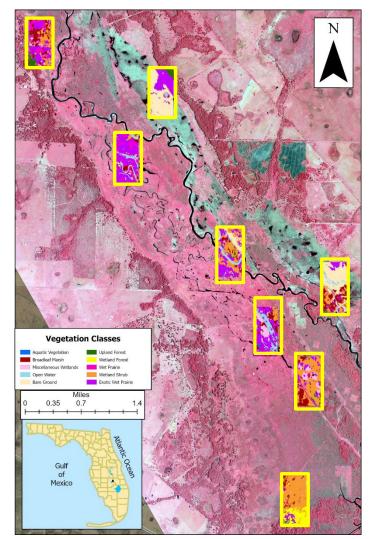




2023 Preliminary Mapping Result

Mapping of eight Sentinel Sites in Kissimmee River Phase I:

- Machine Learning used ~800 signature samples (25-100 signatures per class)
- Map accuracy:
 - Overall Accuracy: 78%
 - Range: 60-80% for all classes
- Most confused signatures: Wet Prairie vs. Exotic Wet Prairie Buttonbush (BLM) vs. Wet Shrub Aquatic Vegetation vs. Wet Prairie





Sentinel Site Mapping Results: Change over Time

Comparisons between 2020 and 2023 Maps: Specific Sites



Site C10



2020 Map Accuracy: **89%**

Comparison Result:

- 2023 generally similar to 2020 map with some apparent differences.
- Herbicide spraying caused increase in bare ground areas.
- Possible confusion between buttonbush and willow apparent here.
- Possible confusion between
 WP and AQ apparent here.
- Decrease in hibiscus.
- Increase in wet prairie including smartweed and bulrush in some areas.





Site C25





Sentinel Sites show promise for improving mapping by allowing concentration on a limited area of floodplain for repeat visits



Video transects from helicopter are useful to collect multiple signatures for the sites from a single visit; allow for increased coverage vs. previous technique (single point ID)



More field signatures necessary for some classes; also improve specificity of low-quality signatures



Consider adjusting locations or addition of Sentinel Sites to cover more of floodplain area





- Develop more (and higher quality) signatures for classes showing relatively low accuracy
- Run ML process for Sentinel Sites with higher number of signatures, perhaps iteratively
- Final Proof of this Concept
 - Using the Sentinel results as signatures in extrapolation to a wider floodplain area to create 2023 Phase I vegetation map
 - Achieve accuracy comparable to 2020 map (i.e., 85-90%)
- Repeat full process on other restoration phases



Effects of Hurricane lan?

- Differences in vegetation distribution seem to exist between 2020 and 2023 vegetation maps
- If borne out in final analysis, could these be attributable to effects felt from Hurricane Ian in fall 2022?
- Planet Satellite Imagery is available for before and after Ian
- Using same process, carry out similar ML analysis to see if vegetation changes seem can be linked to hurricane's occurrence



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