



Image Source: [Maxwell Ridgeway](#)

# Using Neural Networks in Optimizing Vulnerability Indicators of Mangrove Forests Towards Climate Change

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*Graduate Seminar  
(ENS 299)*

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# Outline



1. Objectives
2. Related Literatures
3. Framework & Methodology
4. Expected Output
5. Limitations
6. Significance

Image Source: [Maxwell Ridgeway](#)





# Objectives

To identify the level of vulnerability of mangrove forests in Cebu using an adaptive method in assessing vulnerability.

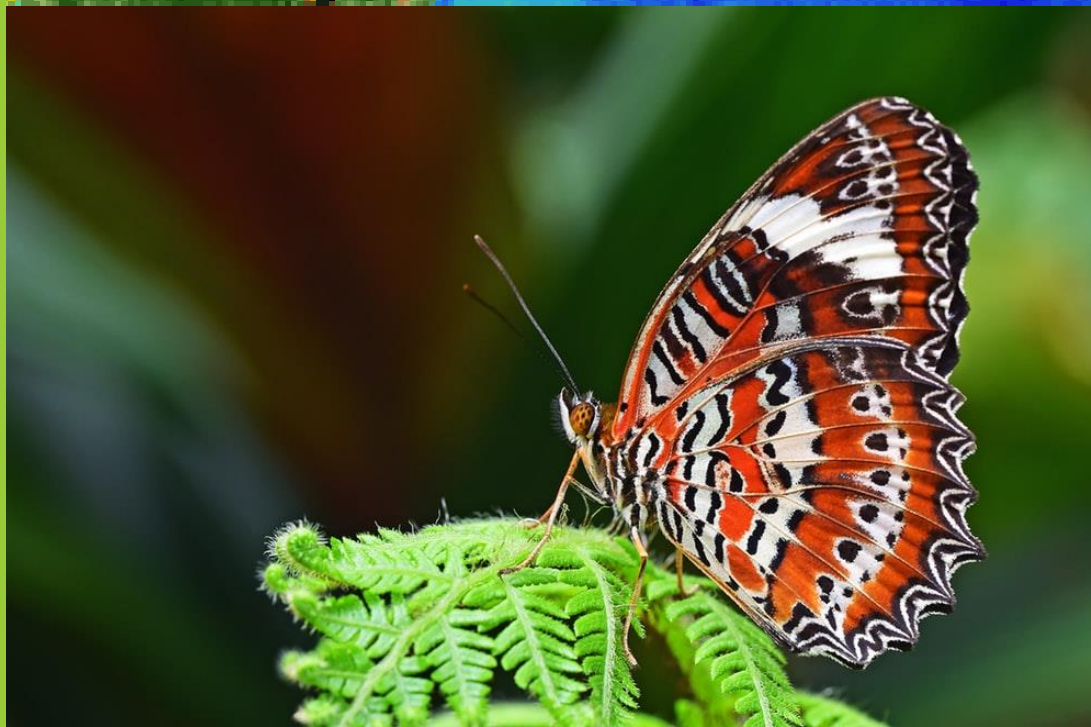
1. To identify the current extent of mangrove forests in Cebu.
2. To identify the indicators that are needed to analyze the vulnerability of mangrove forests.
3. To identify a new method in assessing the vulnerability of mangroves by using AI models.
4. To enable adaptive approach in the new method of quantifying vulnerability in mangroves.
5. To remove redundancy in the indicators for vulnerability by analyzing the created models.
6. To identify vulnerability levels in the different cities and municipalities in Cebu.





# Related Literatures

According to Bellard et al. (2012), climate change is unequivocal and represents one of the greatest global threats to biodiversity and associated ecosystem services in the coming decades.

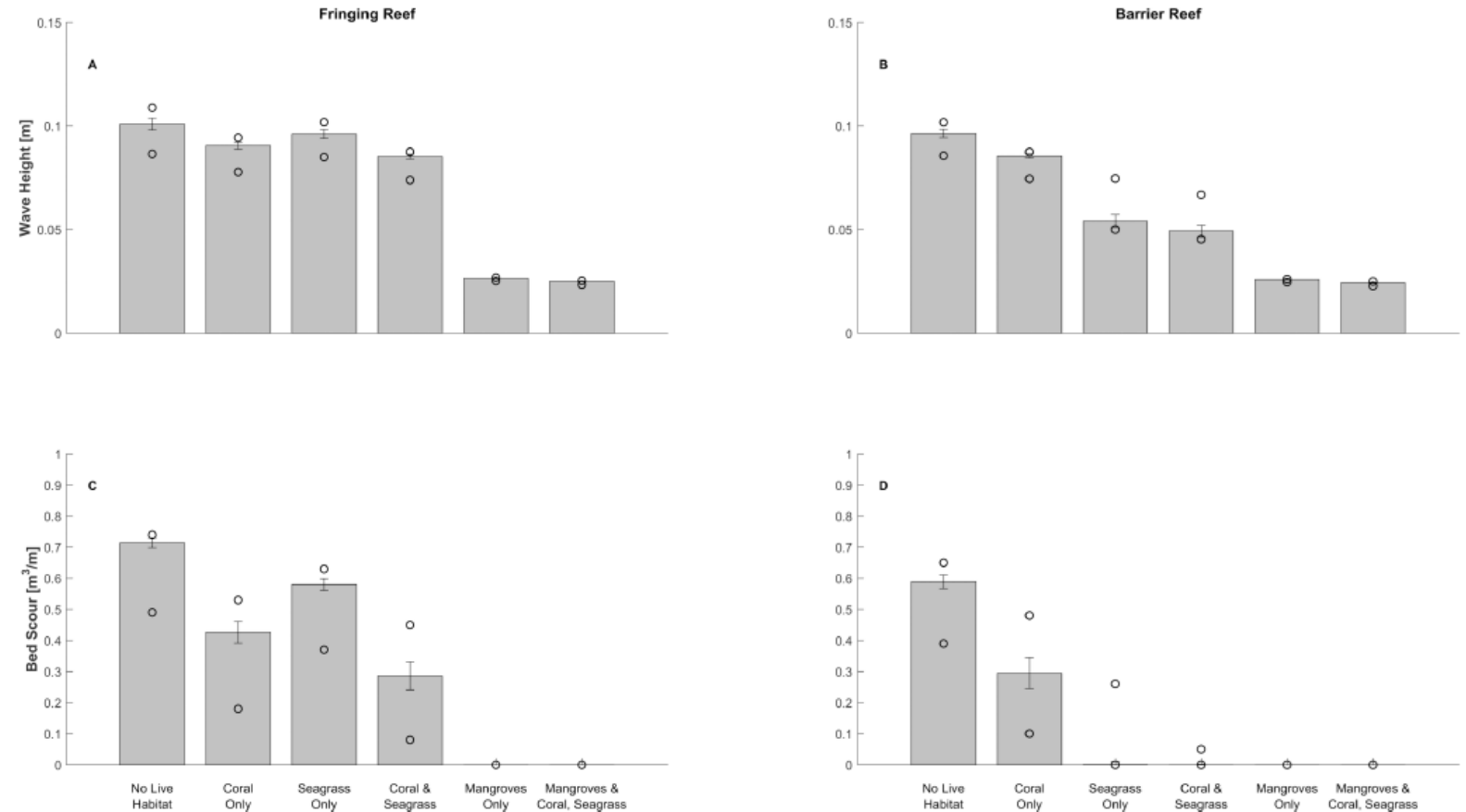






# Mangrove Forests

Mangrove forests live in the tropical and subtropical regions at the interface between terrestrial and marine environments (Koh et. Al, 2018). As a community, mangroves thrive in a wide range of harsh environmental conditions and they share unique adaptive traits such as salt-excreting leaves, an exposed breathing root system, and production of viviparous propagules (Duke, 1992). Mangrove habitats are ecologically important because they provide valuable ecosystem goods and services to coastal populations.



**Fig 7. Protective role of corals, seagrasses and mangroves during non-storm conditions under present sea-level conditions.** Bar plot of average wave height at the shoreward edge of the submerged mangrove forest (top subplots) and bed scour volume over the submerged mangrove forest (bottom subplots) computed for different combinations of live reef, seagrass meadows and mangroves presence, under present sea-level conditions. Vertical tick marks indicate 1 standard deviation value around the mean. Circles represent minimum and maximum values. See [S5 Fig](#) for box plot version of this figure for a future sea-level rise scenario.

Guannel et al (2018)



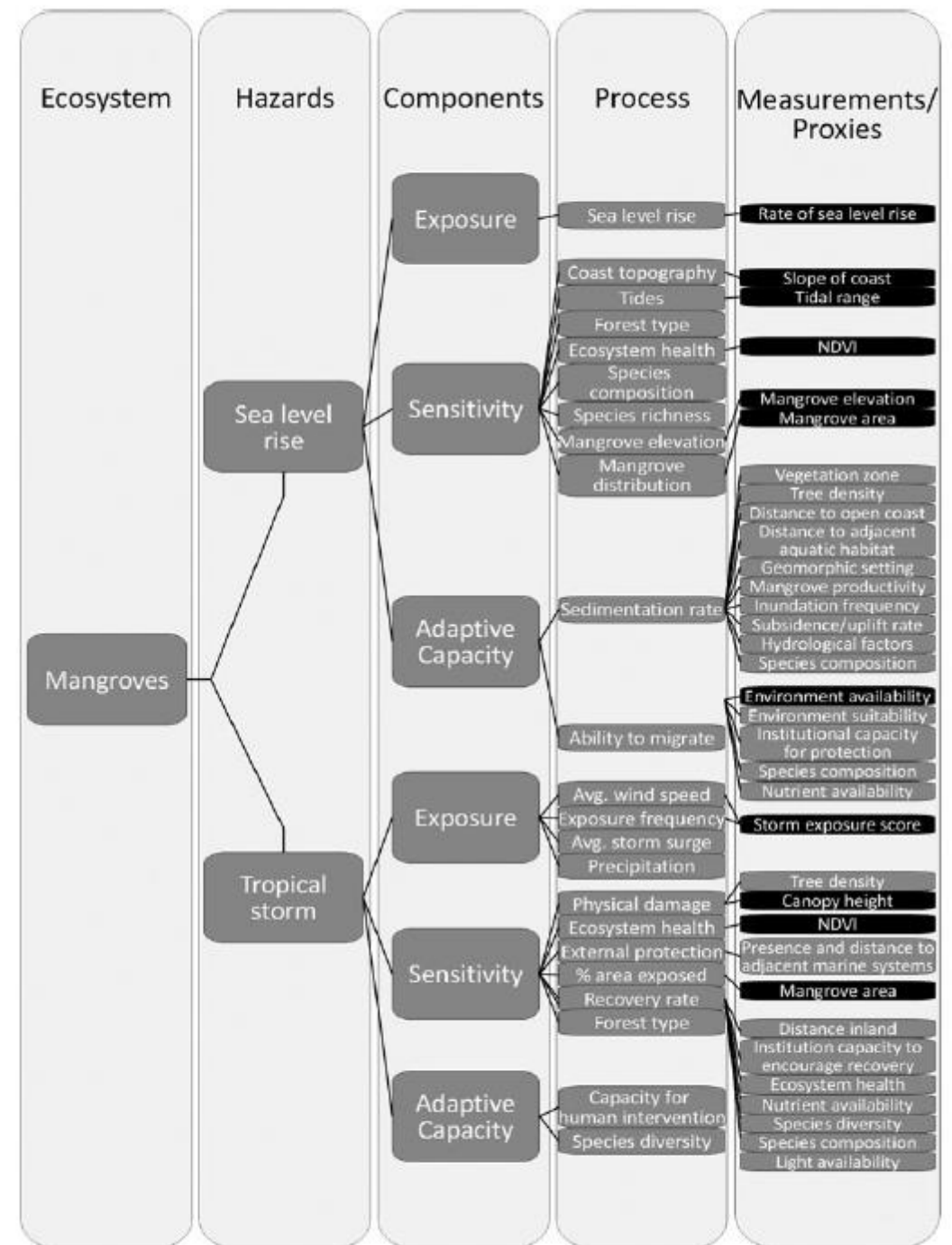
# A New Framework to Assess Relative Ecosystem Vulnerability to Climate Change

2017 • Literature

Lee, C. K. F., Duncan, C., Owen, H. J. F., & Pettorelli, N. (2018). A New Framework to Assess Relative Ecosystem Vulnerability to Climate Change. *Conservation Letters*, 11(2), 1.

<https://doi.org/10.1111/conl.12372>

- This work aims to further develop the toolbox of available vulnerability assessments methodologies by developing a spatially explicit vulnerability assessment framework at the ecosystem scale, which we believe has not been attempted before.
- Our vulnerability assessment targets the ecosystem level, and so potential candidates include metrics capturing changes in ecosystem area, structural attributes, functional attributes, and ecosystem composition.





# A Rapid, Low-Cost Approach to Coastal Vulnerability Assessment at a National Level

2016 · Literature

López Royo, M., Ranasinghe, R., & Jiménez, J. A. (2016). A Rapid, Low-Cost Approach to Coastal Vulnerability Assessment at a National Level. *Journal of Coastal Research*, 32(4), 932–945.

<https://doi.org/10.2112/JCOASTRE.S-D-14-00217.1>

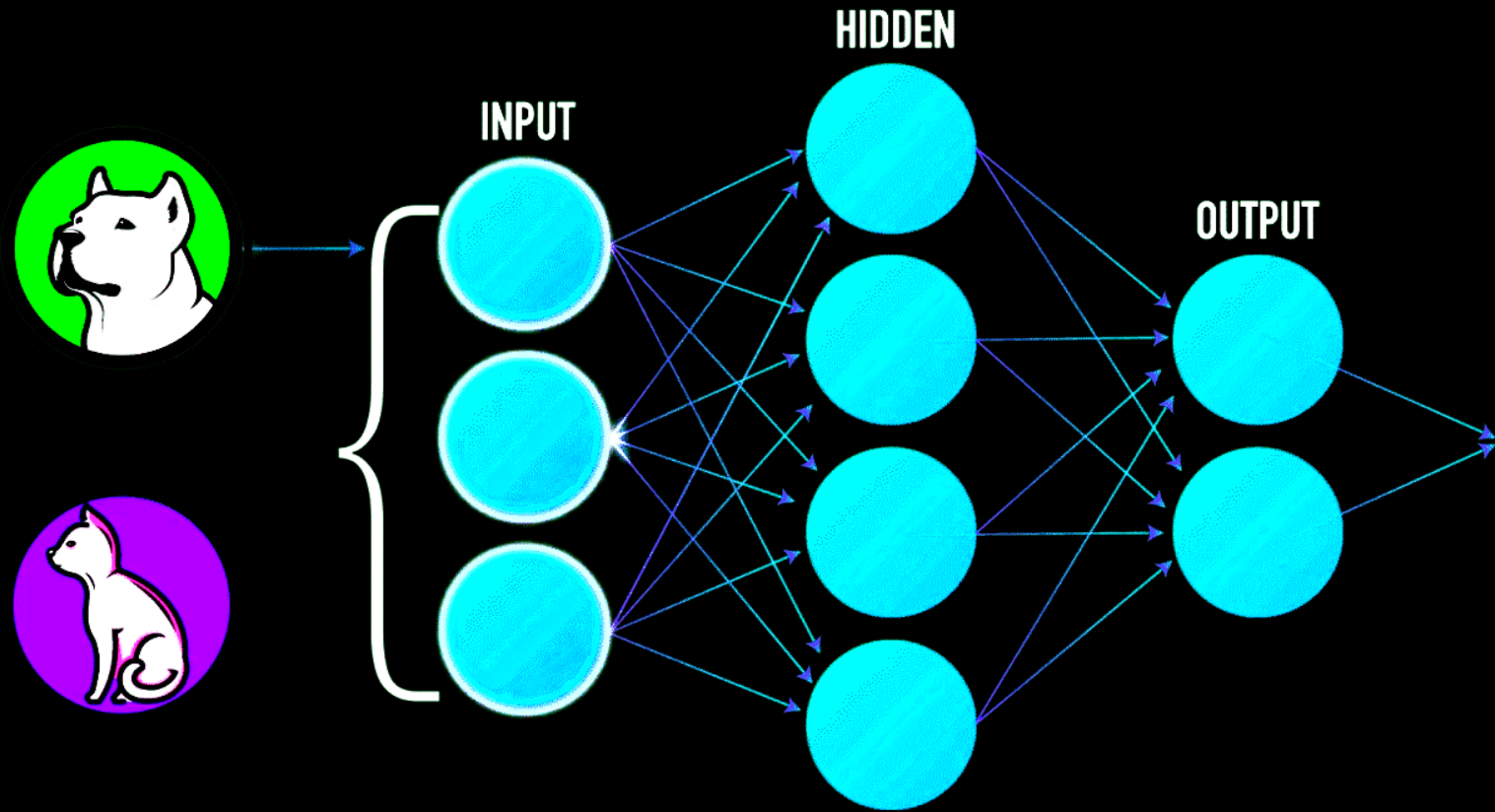
- The lack of an easy-to-use assessment method that requires only readily available data has severely hampered efforts to assess national-scale coastal vulnerability to the potential impacts of CC and population growth in the coastal zone, particularly when project budgets are limited.
- This study presents a modified version of the Coastal Vulnerability Index (CVI) approach.

Parameter	Barcelona (Maresme)	Castelldefels/ Garraf	Castelló	Almería (Costacabana)	Almería (Delta Adra)	Cádiz (Valdevaqueros)	Ría de Arosa
Stretch number <sup>a</sup>	7, 9	15, 16	29, 30	60, 61	64	86	100
Geomorphology	1	1	5	5	4	5	5
Shoreline erosion/accretion	5	5	5	5	5	5	3
Coastal slope	4	5	3	4	5	3	4
Sea-level rise	3	3	3	3	3	4	3
Wave height	4	4	1	1	1	1	3
Tide range	5	5	5	5	5	4	3
Total CVI	14.14	15.81	13.69	15.81	15.81	14.14	16.43
Vulnerability <sup>b</sup>	H	H	H	H	H	H	H

Parameter	Besos	Llobregat	Tarragona	Ebro	Valencia	Alicante	Murcia	Málaga	Gulf of Cádiz
Stretch number <sup>a</sup>	12	14	17	24	38	41	47, 48	79	91
Geomorphology	5	5	5	5	5	3	5	4	5
Shoreline erosion/accretion	5	1	5	5	5	5	3	5	5
Coastal slope	4	5	5	5	5	4	5	5	4
Sea-level rise	3	3	2	3	3	2	3	2	3
Wave height	4	4	4	1	4	4	1	3	3
Tide range	5	5	5	5	5	5	5	5	3
Total CVI	31.62	15.81	28.87	17.68	35.36	20.00	13.69	22.36	21.21
Vulnerability <sup>b</sup>	VH	H	VH	H	VH	VH	H	VH	VH



# Neural Network



- Neural networks are a computing system made up of a number of simple, highly interconnected processing elements, which process information by their dynamic state response to external inputs (Hecht-Neilsen, 1989).
- Artificial neural networks (ANNs) are receiving greater attention in the ecological sciences as a powerful statistical modeling technique; however, they have also been labeled a “black box” because they are believed to provide little explanatory insight into the contributions of the independent variables in the prediction process (Olden et al., 2004).





# Research Gap

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The related studies have shown that there is incoherence regarding the different approaches of large-scale vulnerability studies in mangrove resources. However the incorporation of geographic information systems in policy making and the advancement and increased application of artificial intelligence such as machine learning in ecological modelling has provided new way in assessing relative vulnerability of resources such as mangroves. There should be a way of somehow assessing the vulnerability of mangroves with the ease of a large-scale analysis with only 4 factors but still with the same accuracy as a full-blown complex vulnerability analysis with multiple indicators in a variable framework.





Exposure

# Methodology

Capacity)

Adapted from Alino et.al (2013) guidebook on Vulnerability Assessment Tools for Coastal Ecosystems

## Conceptual Framework



### 1. Enter Search Criteria

To narrow your search area: type in an address or place name, enter coordinates or click the map to define your search area (for advanced map tools, view the [help documentation](#)), and/or choose a date range.

**Geocoder**   KML/Shapefile Upload



Select a Geocoding Method  
Address/Place ▼

Address/Place

Show   Clear



**Polygon**   Circle   Predefined Area

Degree/Minute/Second   Decimal

1. Lat: 10° 19' 25" N, Lon: 123° 47' 26" E    

Use Map   Add Coordinate   Clear Coordinates

**Date Range**   Result Options

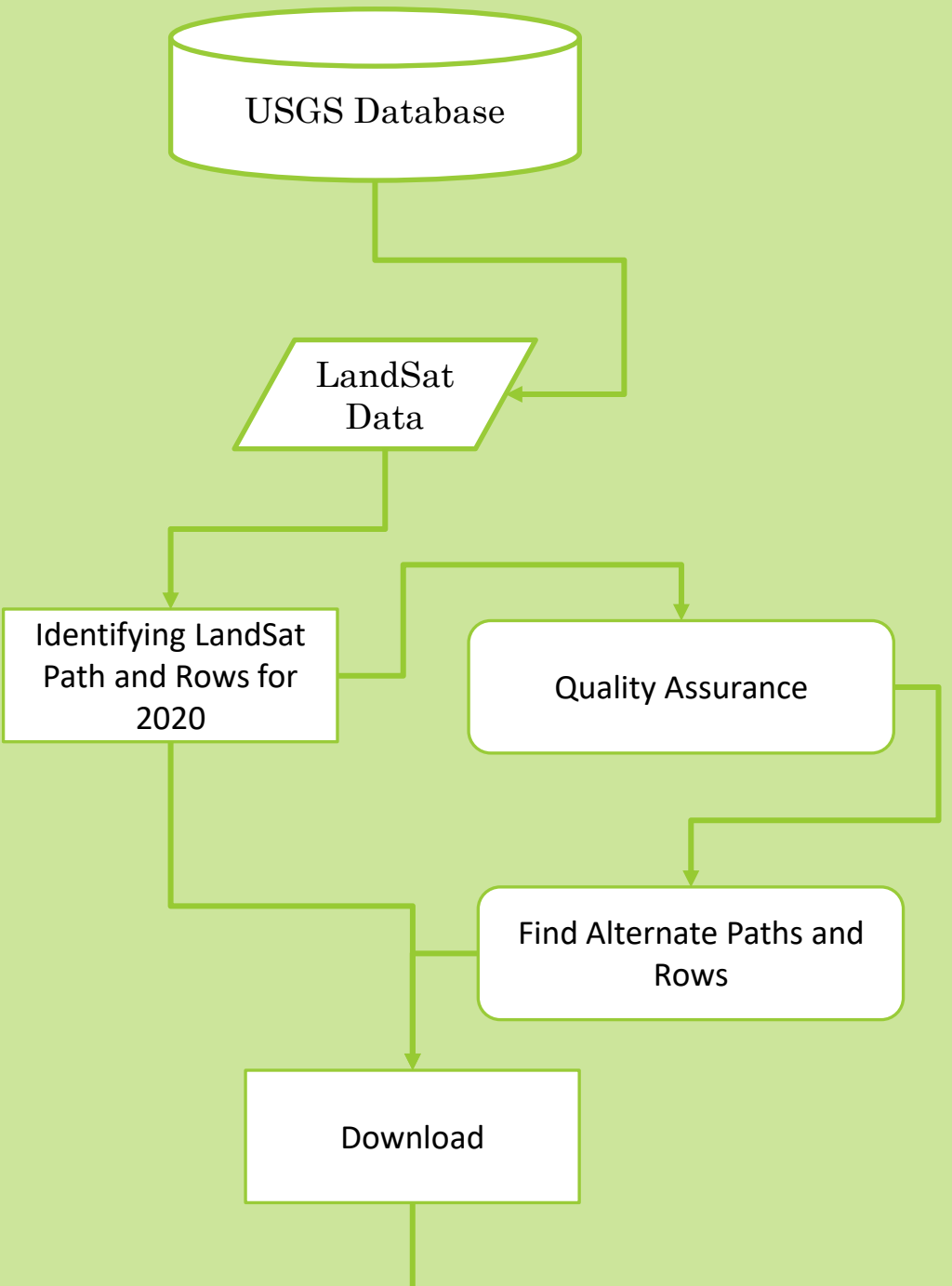
Search from: mm/dd/yyyy  to: mm/dd/yyyy 

Search months: (all) ▼

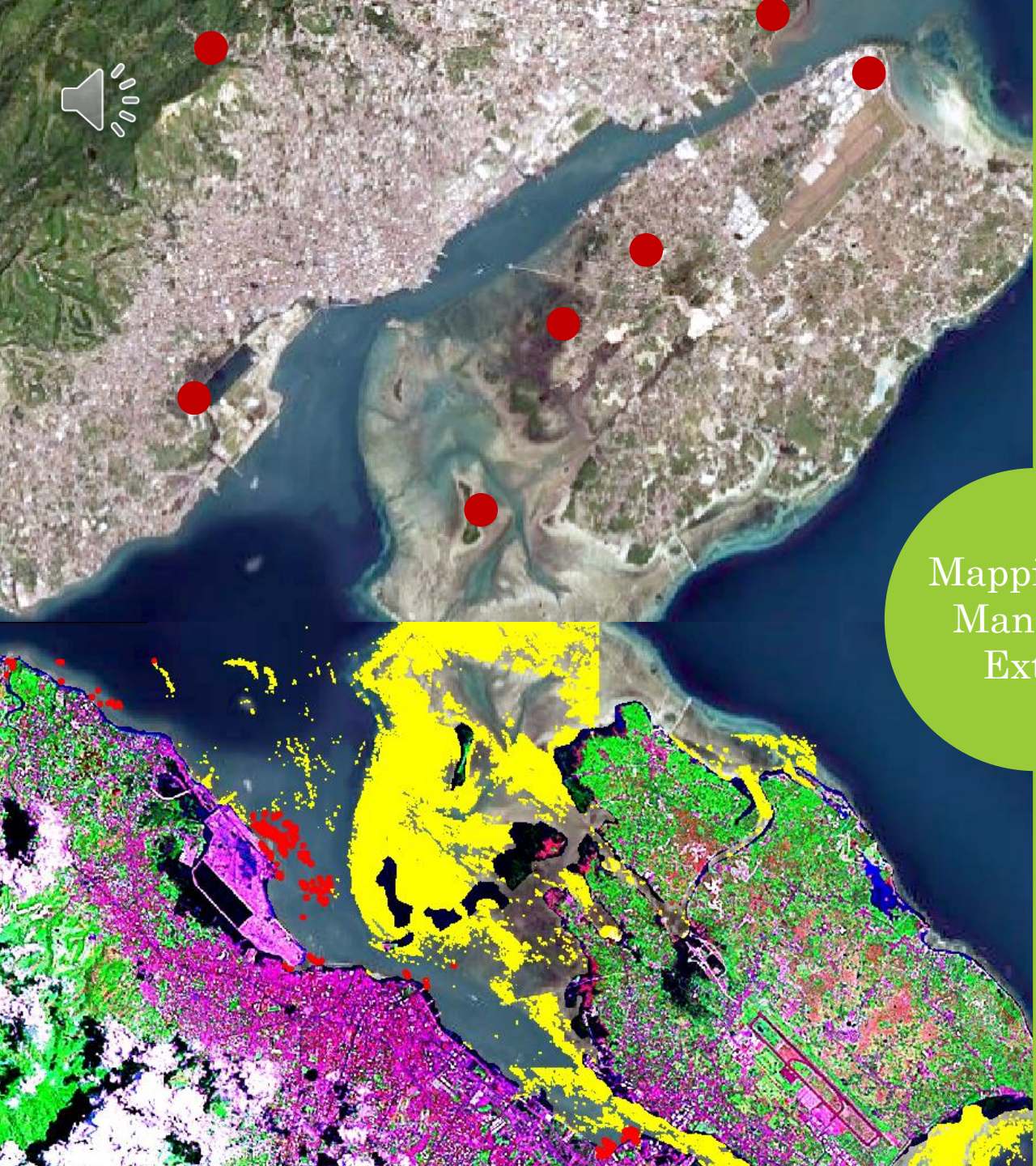
Data Sets »   Additional Criteria »   Results »



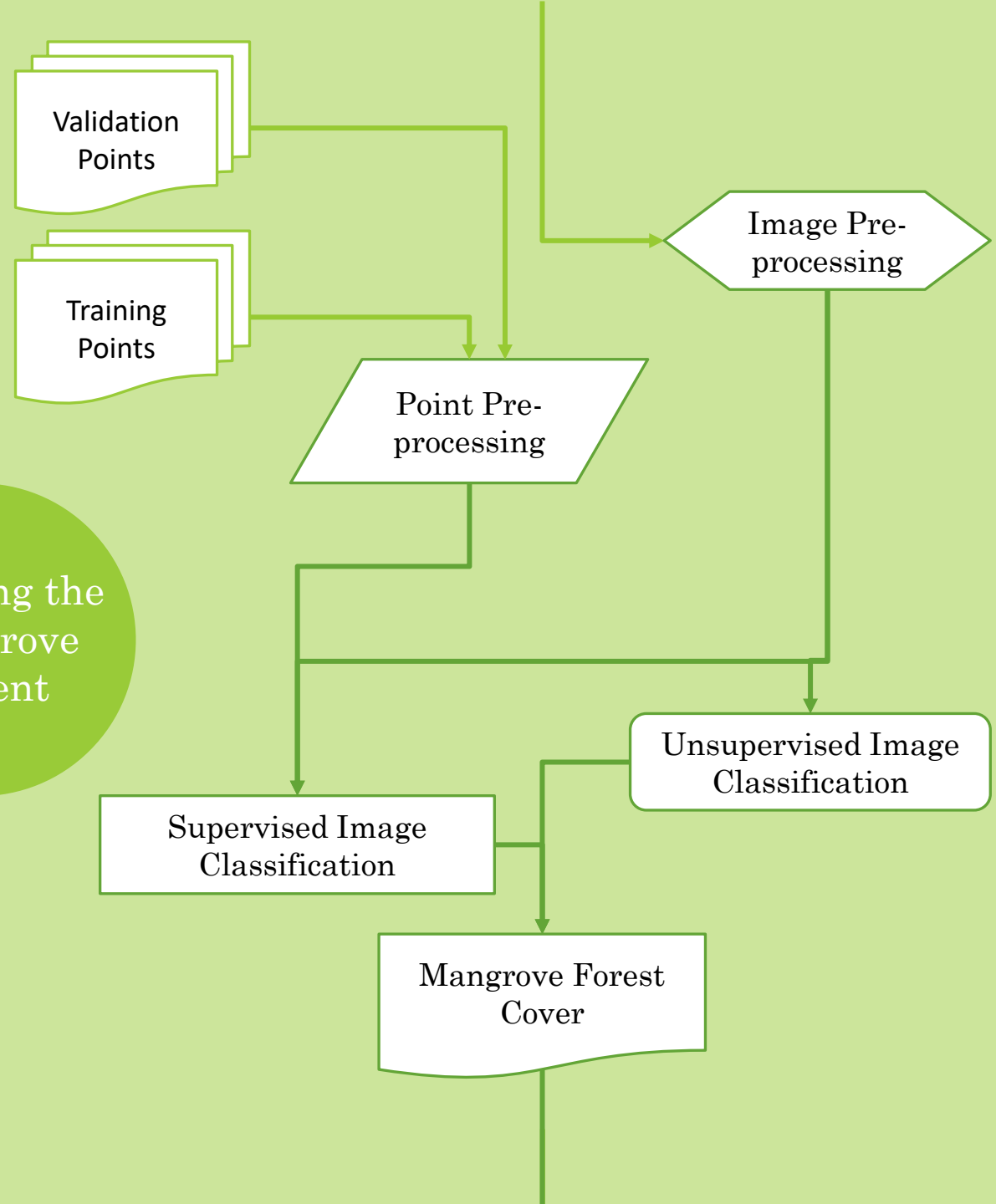
## Data Acquisition



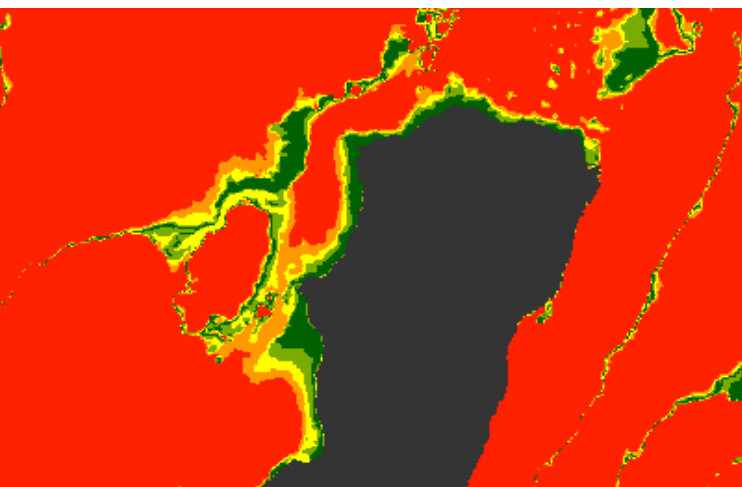
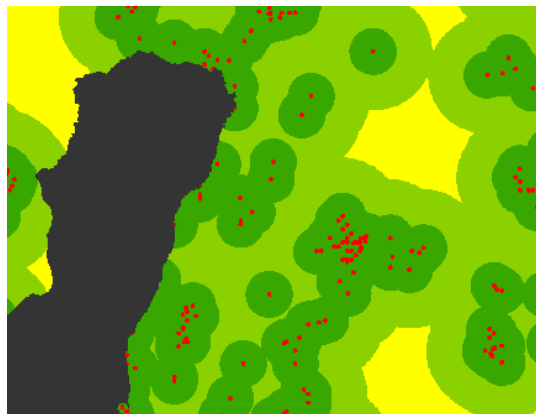
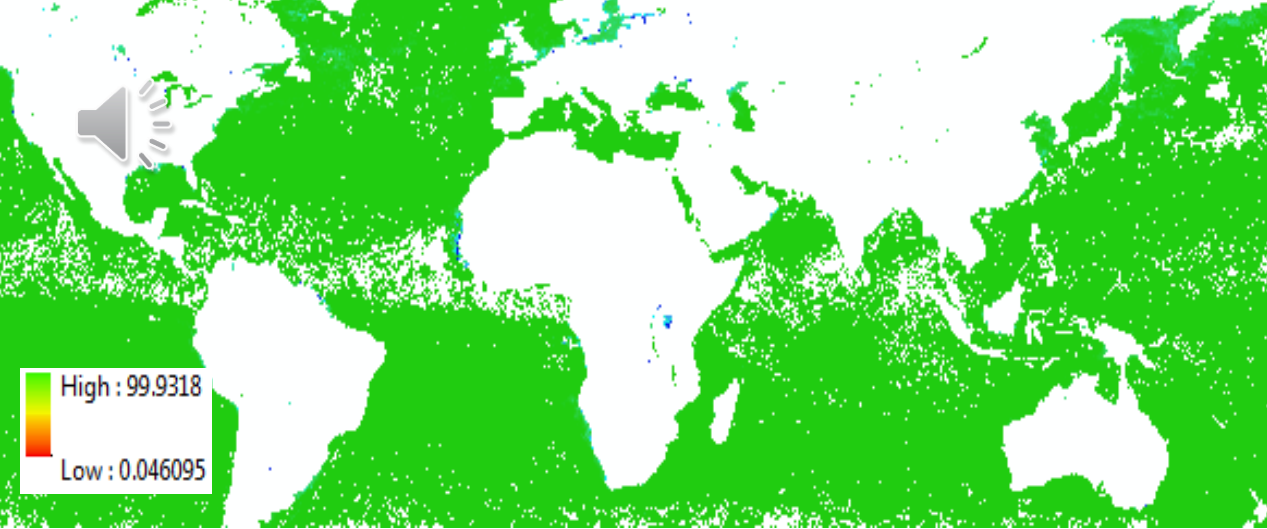




Mapping the Mangrove Extent







Preparing Indicators



&gt;&gt; nntool

fx &gt;&gt;

Name	Value
input	<4x26 d
sample	<4x4 dc
target	<1x26 d

## Neural Network



## Algorithms

Data Division: Random (dividerand)  
Training: Bayesian Regularization (trainbr)  
Performance: Mean Squared Error (mse)  
Calculations: MEX

## Progress

Epoch:	0	526 iterations	1000
Time:		0:00:05	
Performance:	0.744	2.94e-06	0
Gradient:	2.17	2.94e-07	
Mu:	0.00500	5.00e+10	
Effective # Param:	33.0	28.8	
Sum Squared Param:	182	122	
Validation Checks:	0	0	

## Plots

- Performance (plotperform)
- Training State (plottrainstate)
- Error Histogram (ploterrhist)
- Regression (plotregression)
- Fit (plotfit)

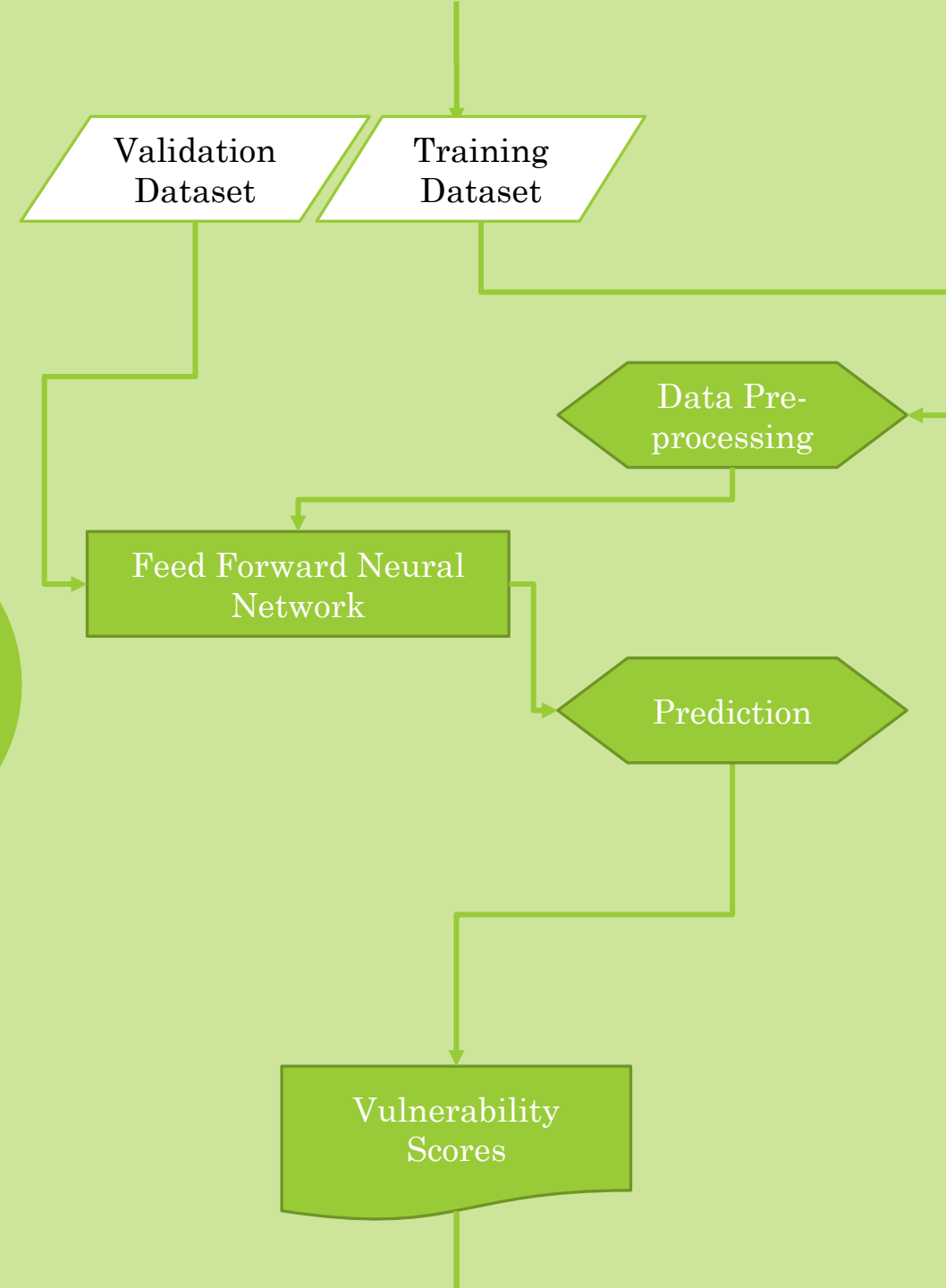
Plot Interval: 1 epochs

✔ 'Maximum MU reached.'

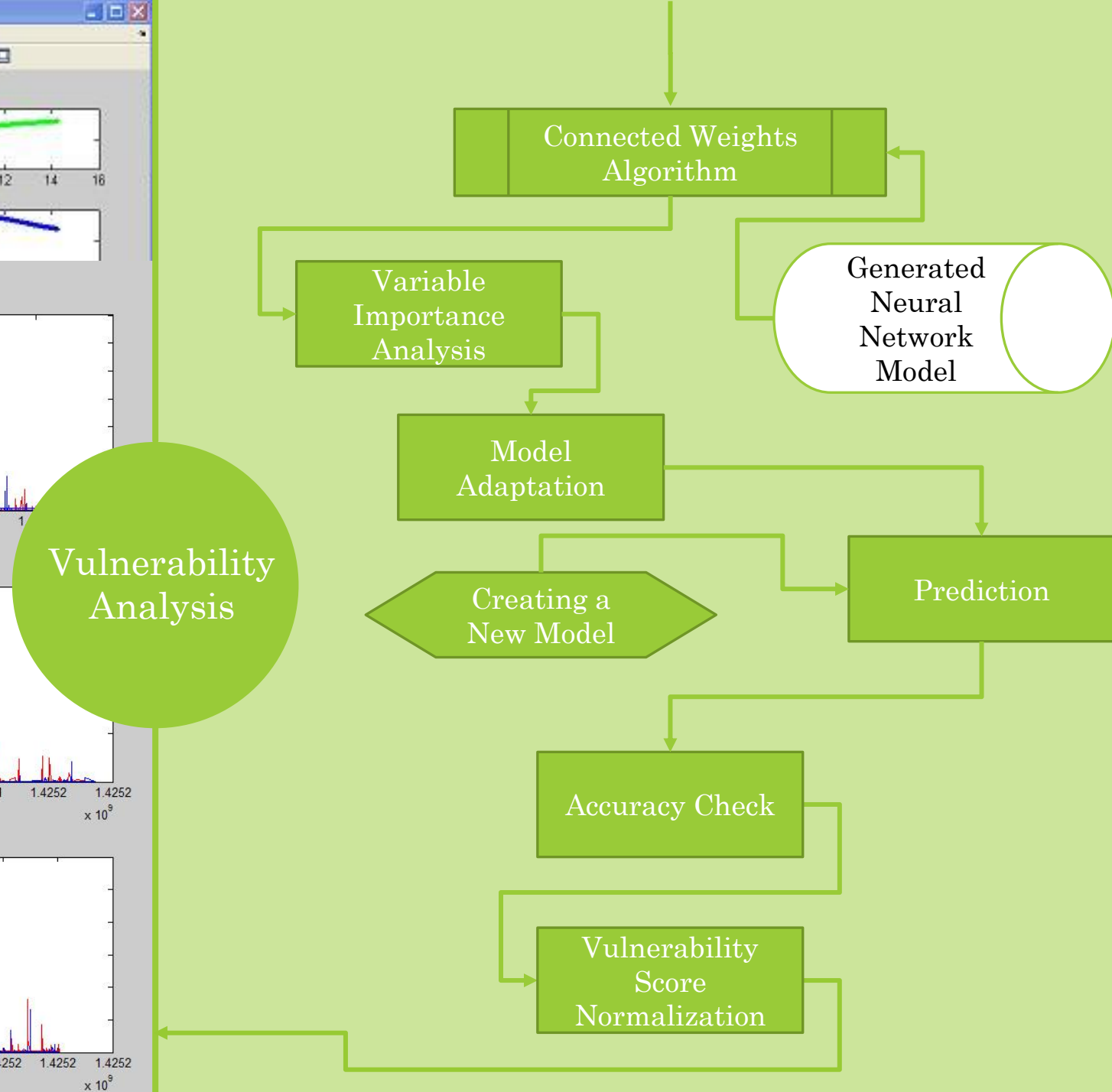
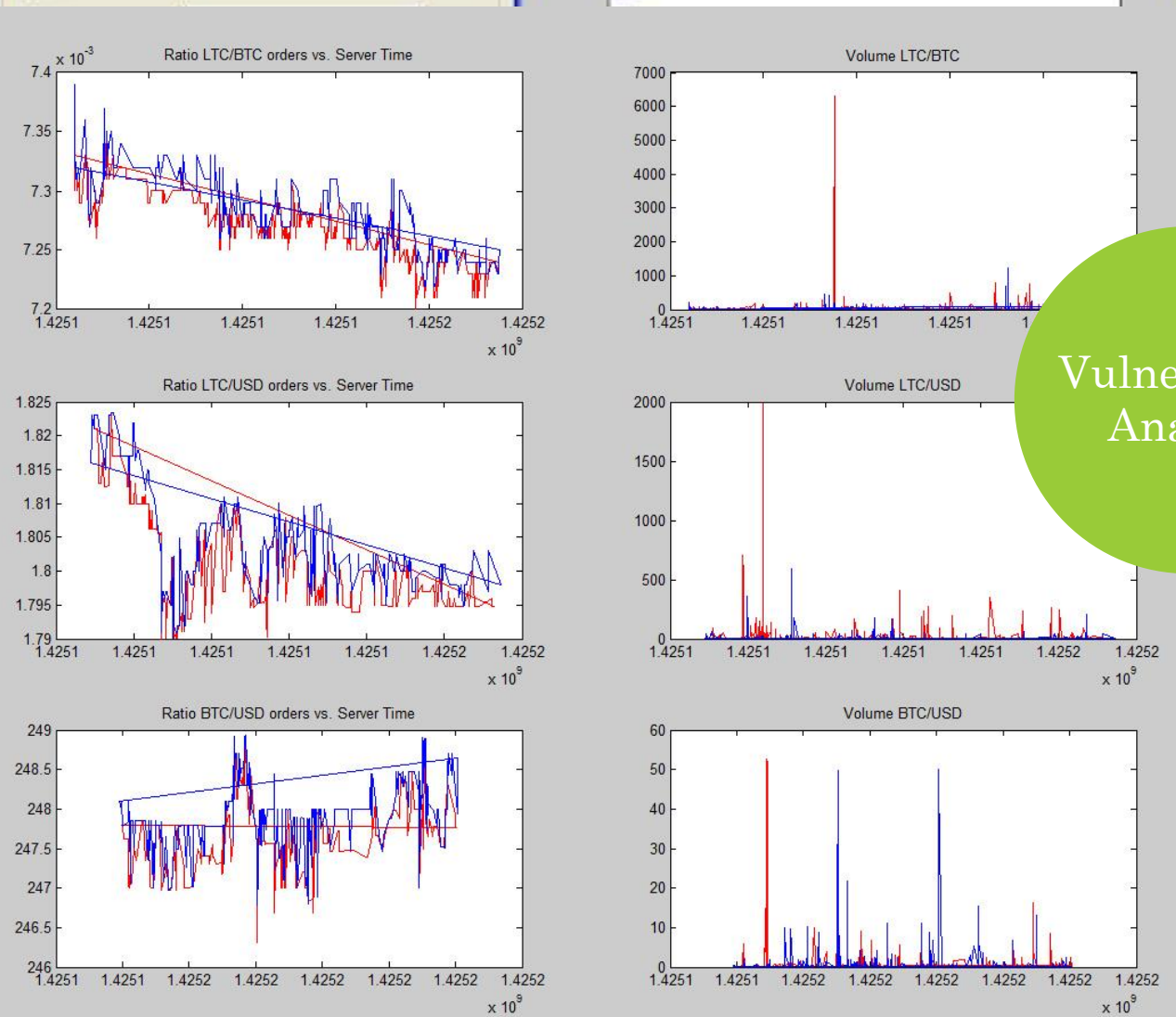
Stop Training

Cancel

Training the Model

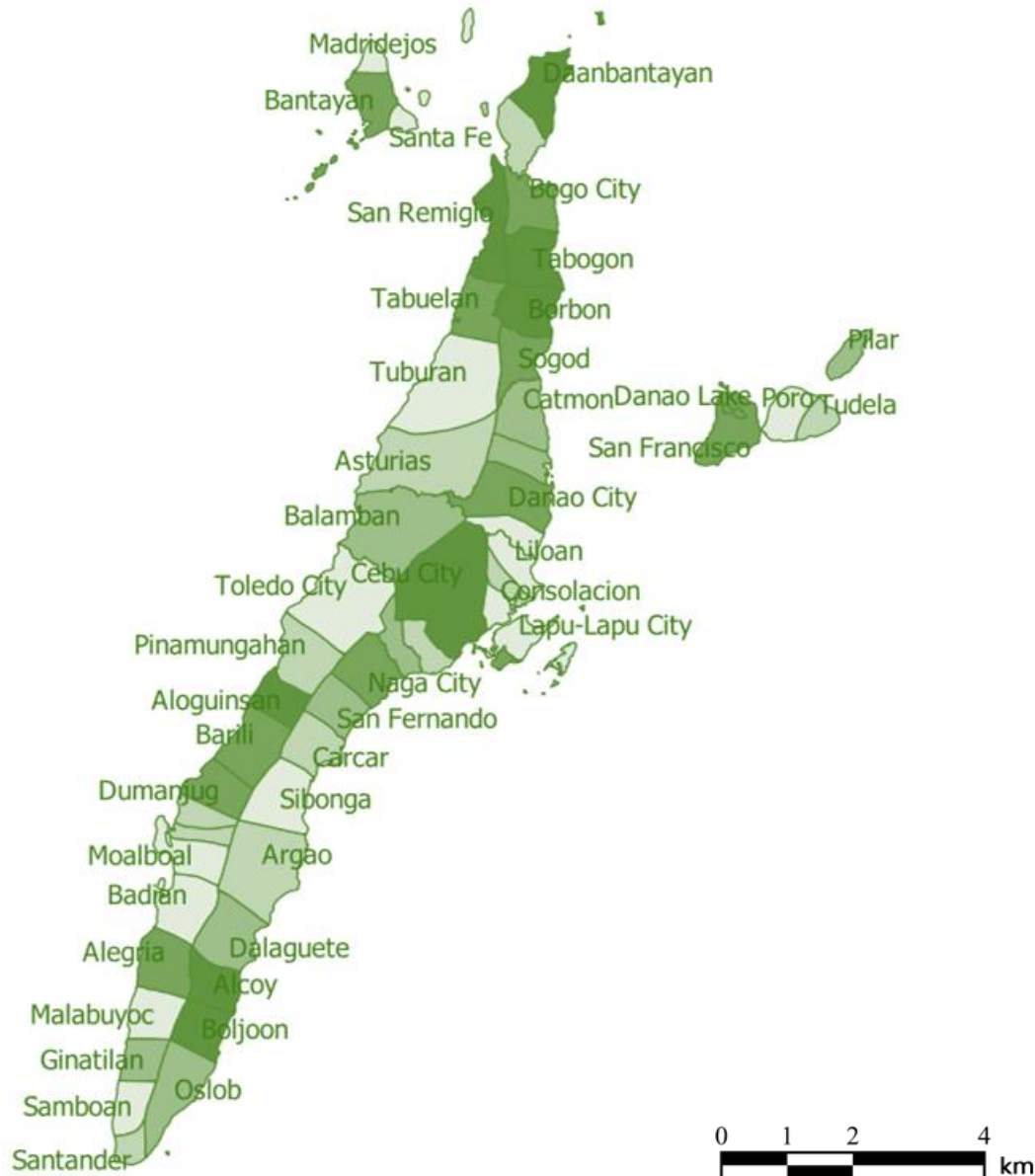












# Mangrove Vulnerability Map

## *Cebu Province*





# Limitations

- ❖ This study is focused on the mangrove forests located in the province of Cebu in the Philippines.
- ❖ The proposed indicators that are under the different factors might be limited due to financial and time constraints of the project, however the replicability of the presented method should still accommodate if in case a new variable is introduced.
- ❖ The proposed vulnerability framework is also based on the current and accessible researches regarding coastal vulnerability alone, thus all vulnerability methods that are not apt for coastal areas has not been explored.
- ❖ Furthermore, the proposed artificial intelligence model provides a generic solution and has not been proven to be the paramount of all existing models, other researchers are encouraged to explore other artificial intelligence models as well.





# Significance





