



PEMANFAATAN DATA KEHATI SKALA BESAR

Safran Yusri

Yayasan TERANGI

PENDAHULUAN

- Dampak kerusakan lingkungan
- Menjaga pemanasan global $< 2^{\circ}\text{C}$
- Skala pengelolaan besar
- Pengelolaan multidisiplin
- Ekolog perlu menjawab tantangan tersebut dengan cepat dan akurat

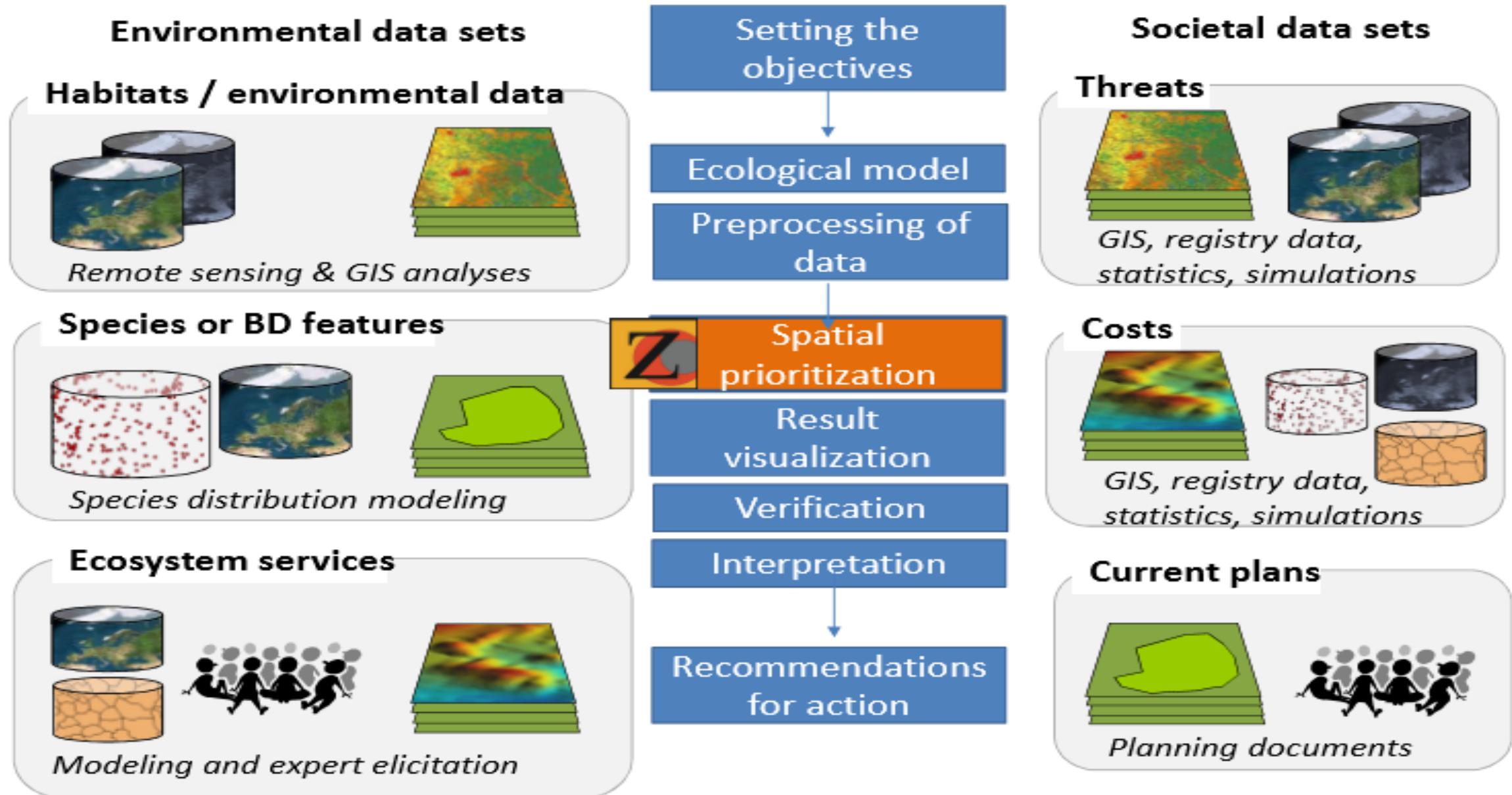
BIODIVERSITY ♥ BIG DATA ♥ CLOUD COMPUTING ♥ MACHINE LEARNING

- Data KEHATI banyak dihasilkan berbagai pihak
- Teknologi penyimpanan meningkat pesat
- Variasi format dan inkonsistensi sudah bisa diatasi
- Kemampuan komputasi memungkinkan analisis data skala besar
- Sumberdaya komputasi dapat dikelola, dibagi, serta ditingkatkan sesuai skala yang dibutuhkan
- Pengembangan algoritma pembelajaran mesin untuk mengubah data skala besar menjadi informasi

PRIORITAS KERUANGAN

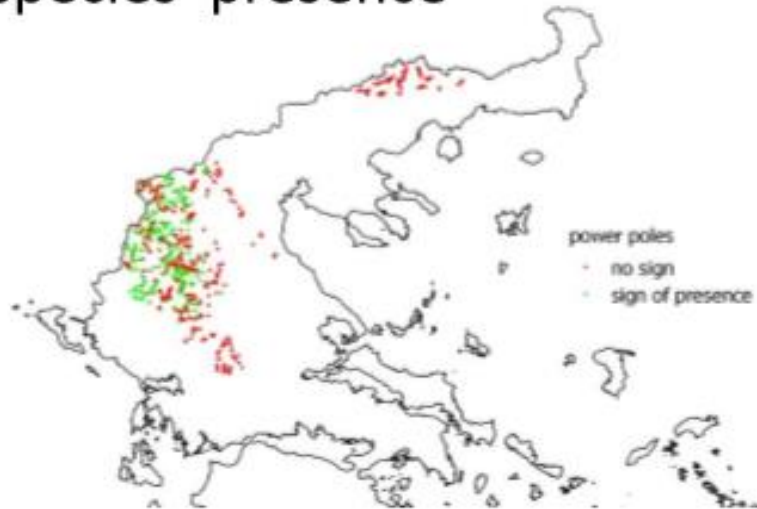
- Bagaimana cara menentukan prioritas ruang untuk konservasi dan pemanfaatan lainnya?
- Tekanan tinggi dari berbagai pihak yang berkepentingan
- Berpacu dengan waktu dengan kerusakan alam dan kepunahan spesies
- Butuh data banyak dan sebarannya secara spasial dimengerti
- Survei lapangan mahal dan Indonesia sangat luas

The workflow of spatial prioritization in Zonation

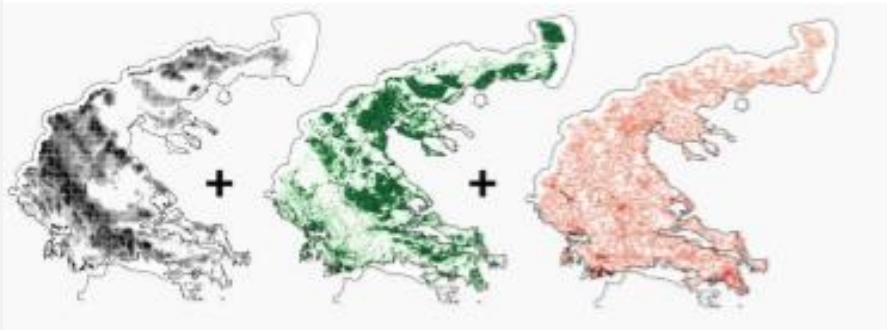


SPECIES DISTRIBUTION MODELLING

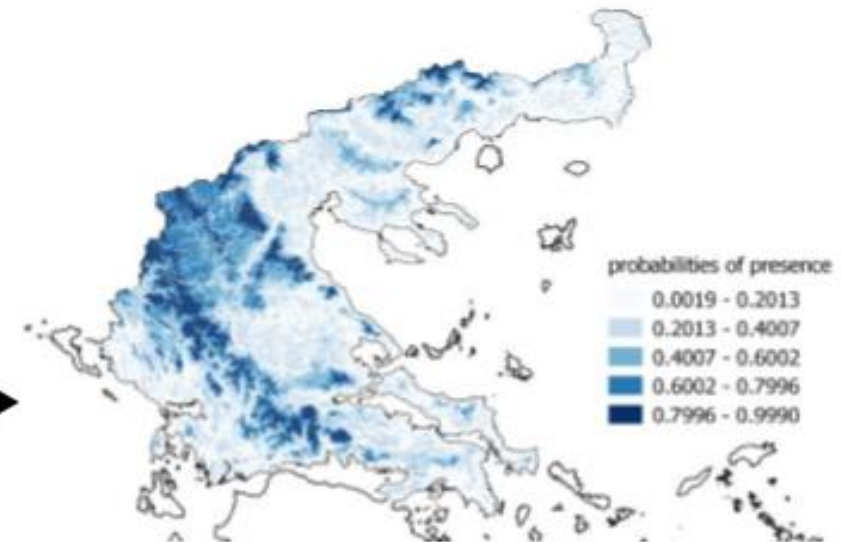
Partial information on the species' presence



+



Environmental variables



Probabilities of presence in the whole area of interest

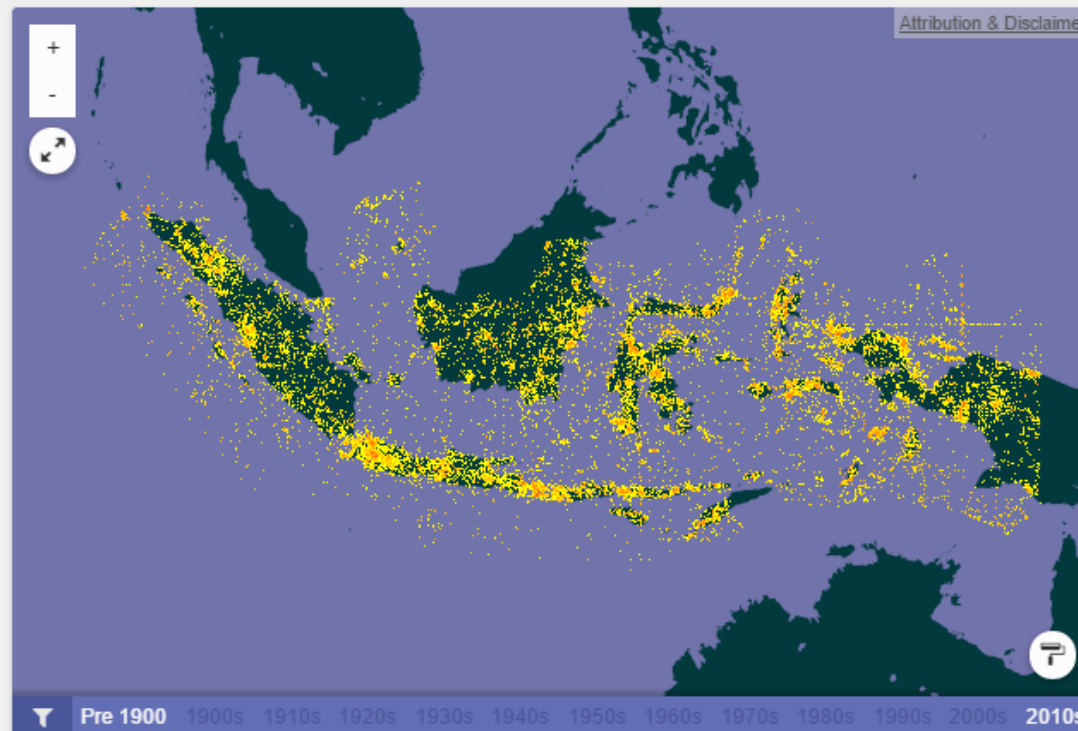
[Get data](#)[Share](#)[Tools](#)[Inside GBIF](#)[Login](#)

GBIF | Global Biodiversity Information Facility

Free and open access to biodiversity data

[OCCURRENCES](#)[SPECIES](#)[DATASETS](#)[PUBLISHERS](#)[RESOURCES](#)[WHAT IS GBIF?](#)[ABOUT GBIF INDONESIA](#)

- Global Biodiversity Information Facility (GBIF) merupakan insiatif global pengumpulan data bersama
- Menyediakan 1,5 juta data kemunculan di Indonesia
- <https://gbif.org>



Data about Indonesia

- 814 occurrence datasets with 1,567,566 records.
- No checklist datasets.
- No metadata-only datasets relevant to Indonesia.
- 37 countries contribute data about Indonesia.

[View records shown on the map](#)

A planetary-scale platform for Earth science data & analysis

Powered by Google's cloud infrastructure

- Google Earth Engine (GEE) menyediakan beberapa terabit data pengamatan kebumihan
- Wahana pemetaan dan analisis citra berbasis komputasi awan
- <https://earthengine.google.com>

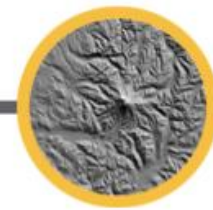
The Earth Engine Public Data Catalog



**Landsat and
Sentinel**



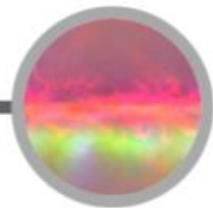
MODIS
Daily, NBAR, LST, ...



Terrain
SRTM, GTOPO, NED, ...



Land Cover
GlobCover, NLCD, ...



Atmospheric
NOAA NCEP, OMI, ...

STUDI KASUS



SPATIAL MODELLING OF SCLERACTINIAN CORAL DISTRIBUTION IN INDONESIA

MSc in IT
for NRM



Safran Yusri /
G051160021

INTRODUCTION

Amazon
(terrestrial-forest)



Congo Basin
(terrestrial-river basin)

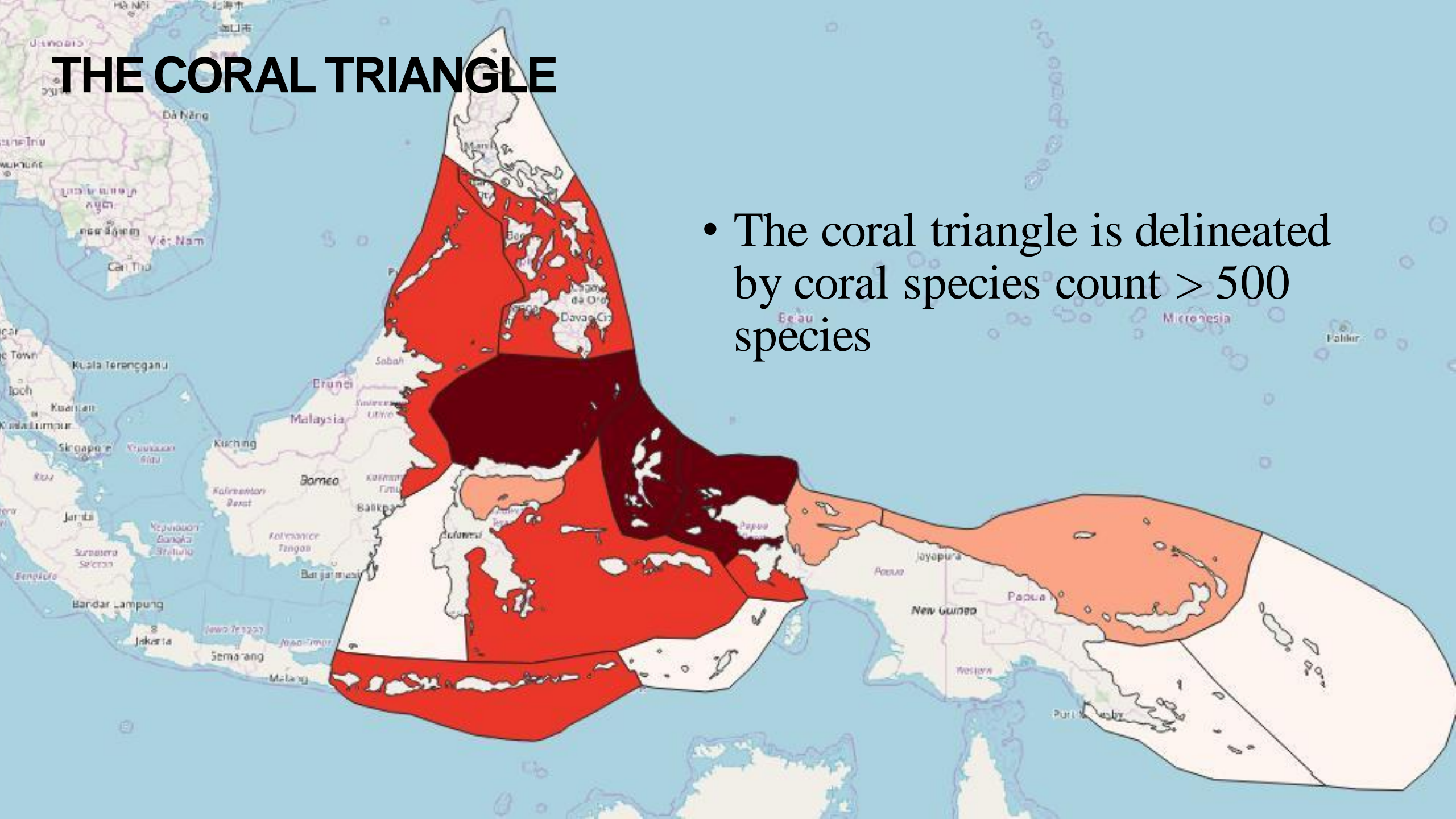


Coral Triangle
(marine)



THE CORAL TRIANGLE

- The coral triangle is delineated by coral species count > 500 species



CORAL CONSERVATION IN INDONESIA

- Coral reefs extent : 2.5 million ha (BIG 2013)
- 569 species of hard corals (Suharsono 2017)
- Corals are traded for ornamentals
- Increasing local and global threats
- Managed through coastal zonation and quota

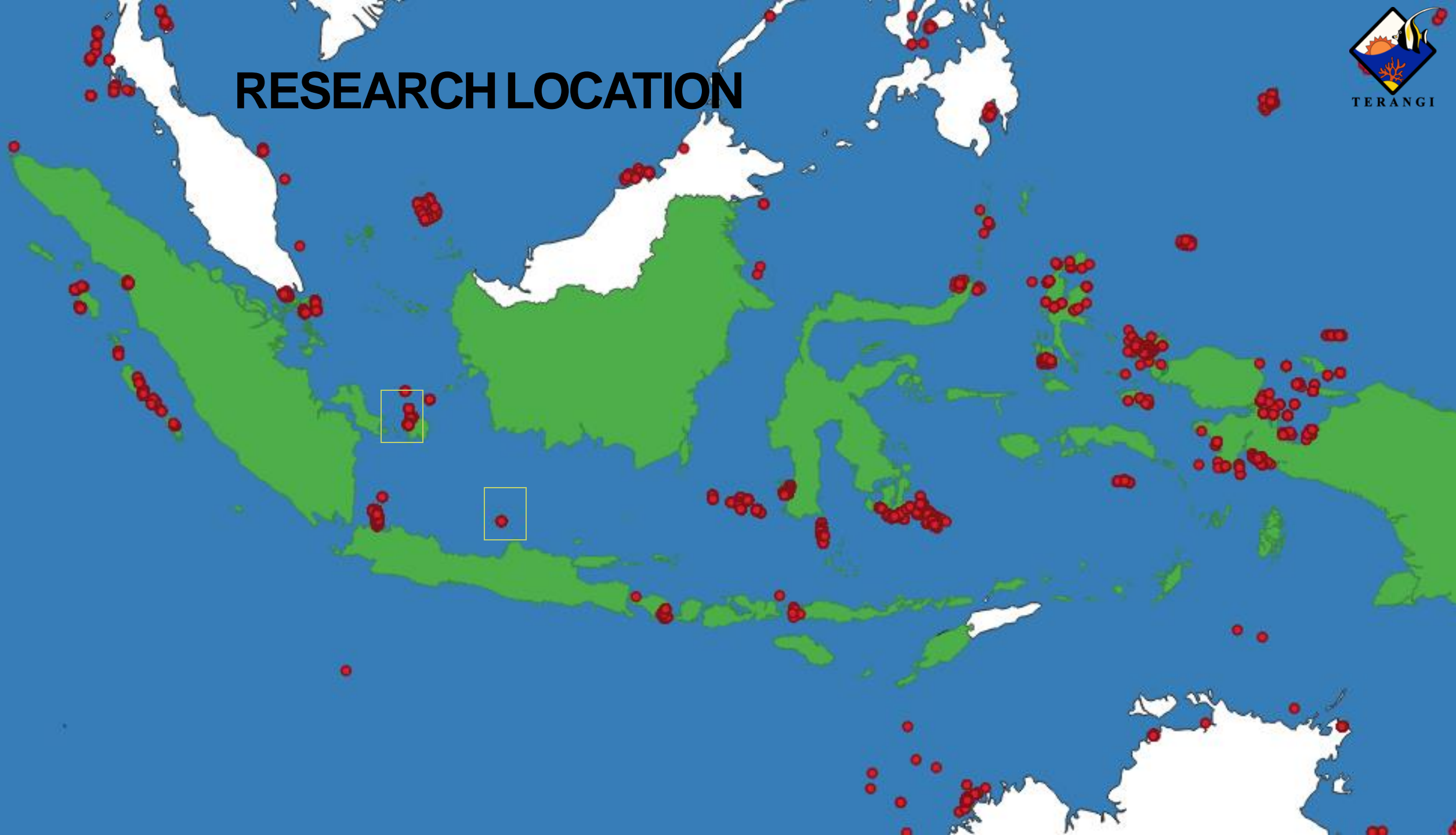


RESEARCH OBJECTIVE



- To develop genera distribution model of hard corals (Scleractinia) in Indonesia based on the available presence records and publicly available remote sensing imageries and oceanographic models using Maximum Entropy.

RESEARCH LOCATION



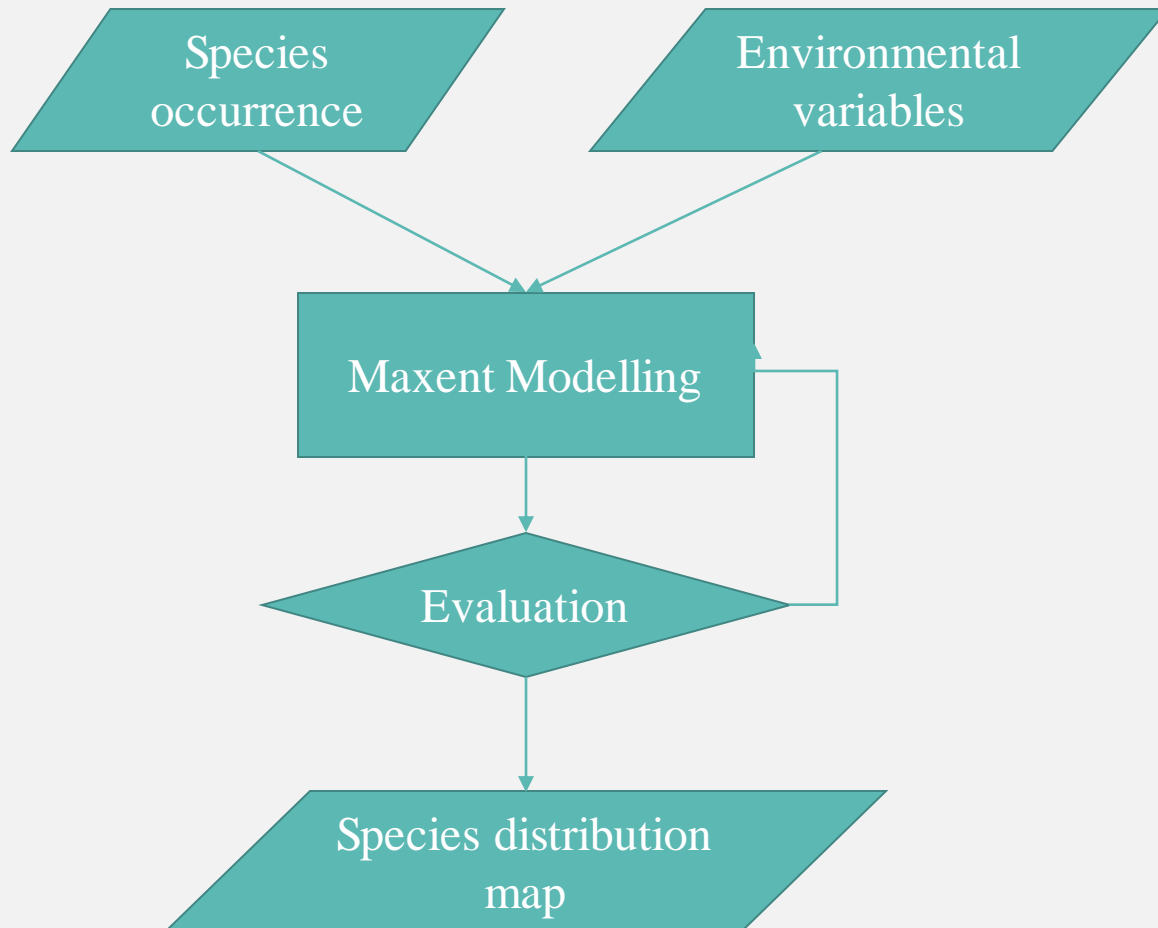
MAXIMUM ENTROPY: THE BASIC IDEA

- Goal: estimate p_i
- Choose p with maximum entropy (or “uncertainty”) subject to the constraints (or “evidence”).

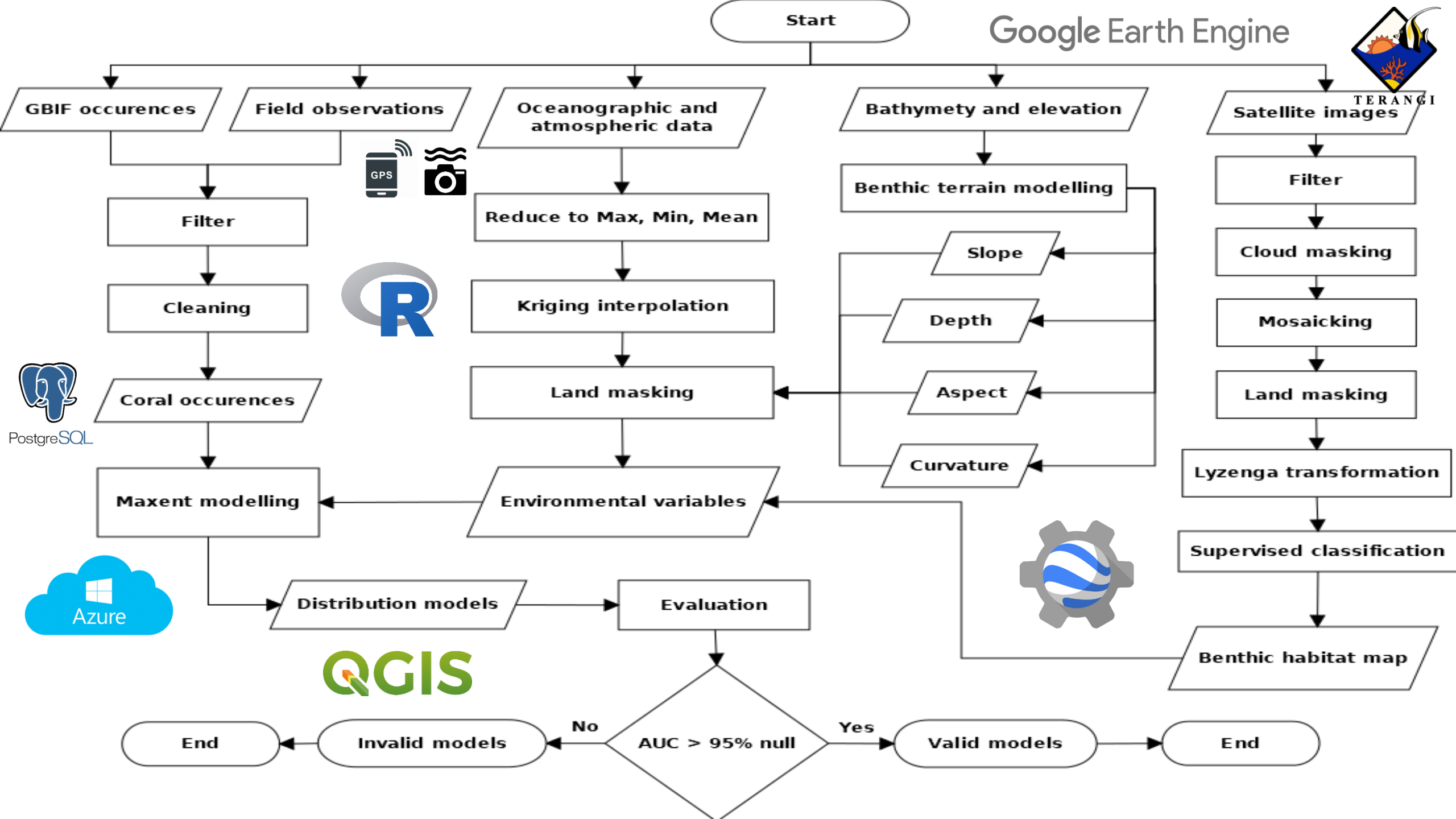
- $$H = - \sum_{i=1}^N p_i \ln(p_i)$$

- and $p(y=x|z) = f_x(z)p(y=x) / f(z)$

BASIC FLOWCHART

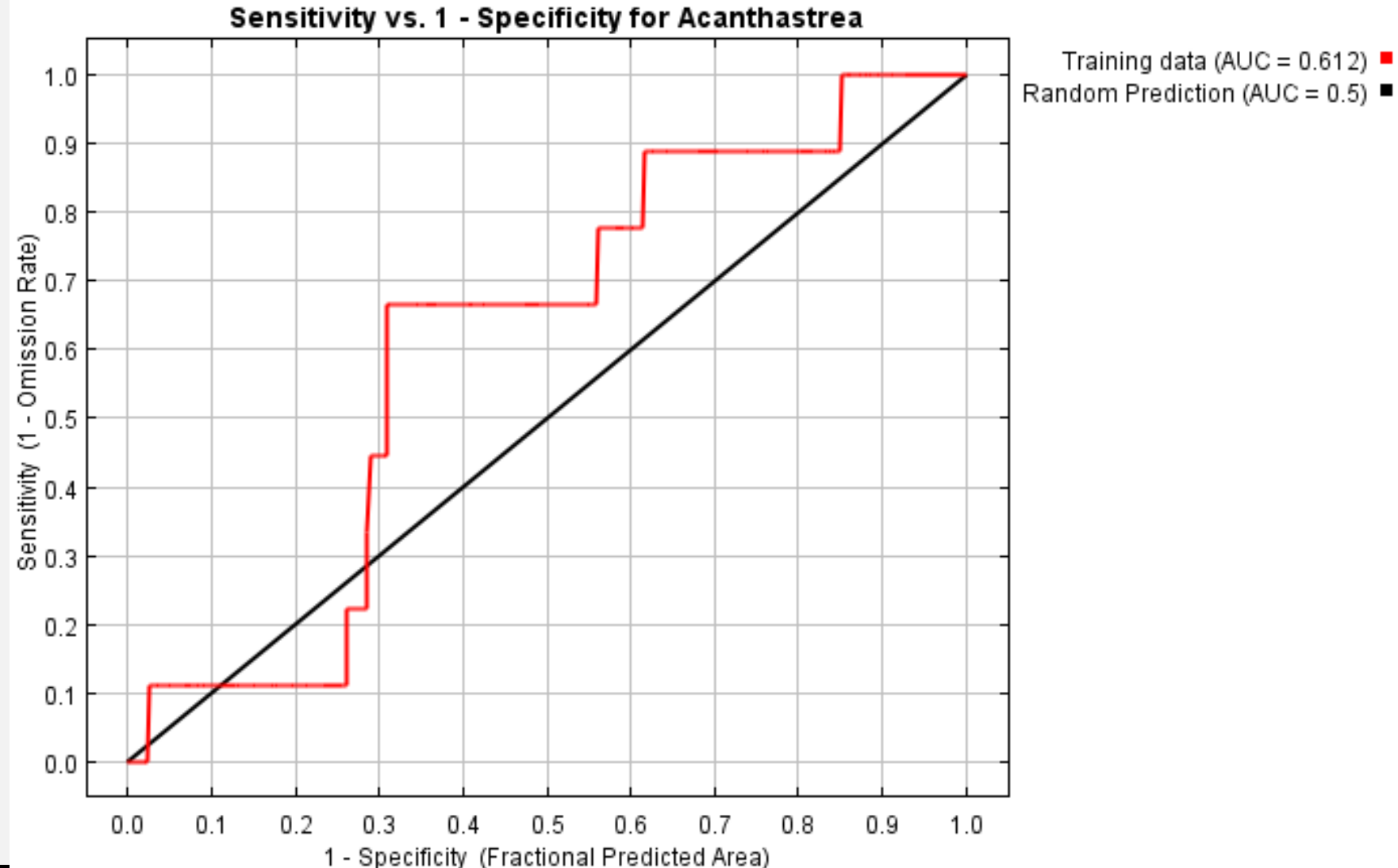


- Target: 73 coral genera (Suharsono 2017)
- Environmental variables
 - Substrate type
 - Chlorophyll-A
 - Bathymetry
 - Sea surface temperatures
 - Particulate organic carbon
- Species occurrence
 - Specimens from GBIF
 - Observations



MODEL EVALUATION AND VALIDATION WITH AUC

- Area under the curve (AUC)
- AUC value close to 1 = Good prediction
- Compared to 99 null model's AUC
- $\text{AUC} > \text{top 5\% of null model's AUC} = \text{Significant and valid model}$





Results and Discussions

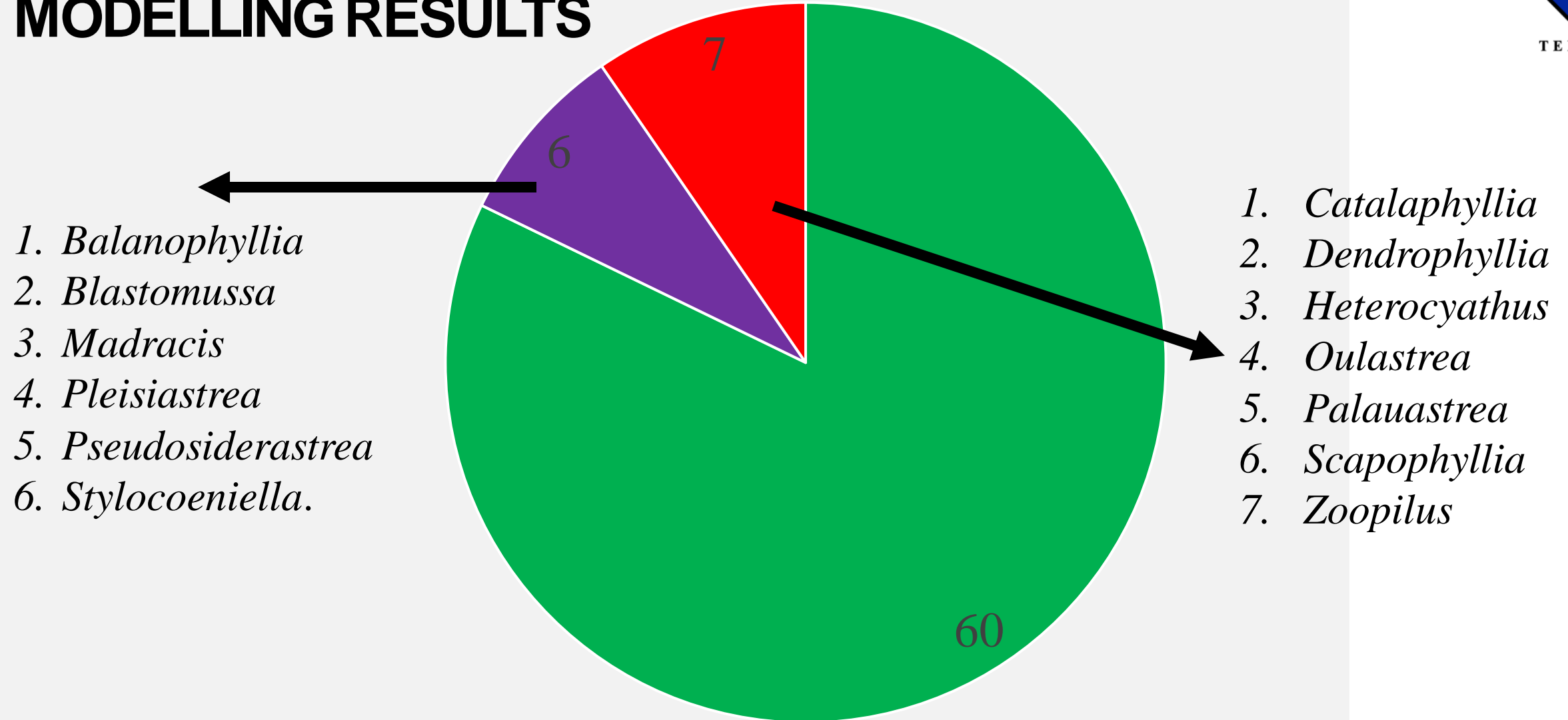


ENVIRONMENTAL PARAMETERS



- 32 rasters generated
- Benthic geomorphology (2014)
 - Depth: 0 – 6827 m
 - Slope: 0 – 34.33°
 - Aspect: 0 – 359.99°
 - Curvature: 0 – 0.94.
- Water energy (2002 – 2017)
 - Mean sea surface elevation: 0 – 0.85 m
 - Mean water velocity: 0 – 4 m/s
- Water quality (2002 – 2017)
 - Mean particulate organic carbon: 25.31 – 953.47‰
 - Mean chlorophyll-A concentration: 0.05 – 13.63‰.
 - Mean surface salinity: 20.09 – 35.32‰.

MODELLING RESULTS




Valid

Insignificant

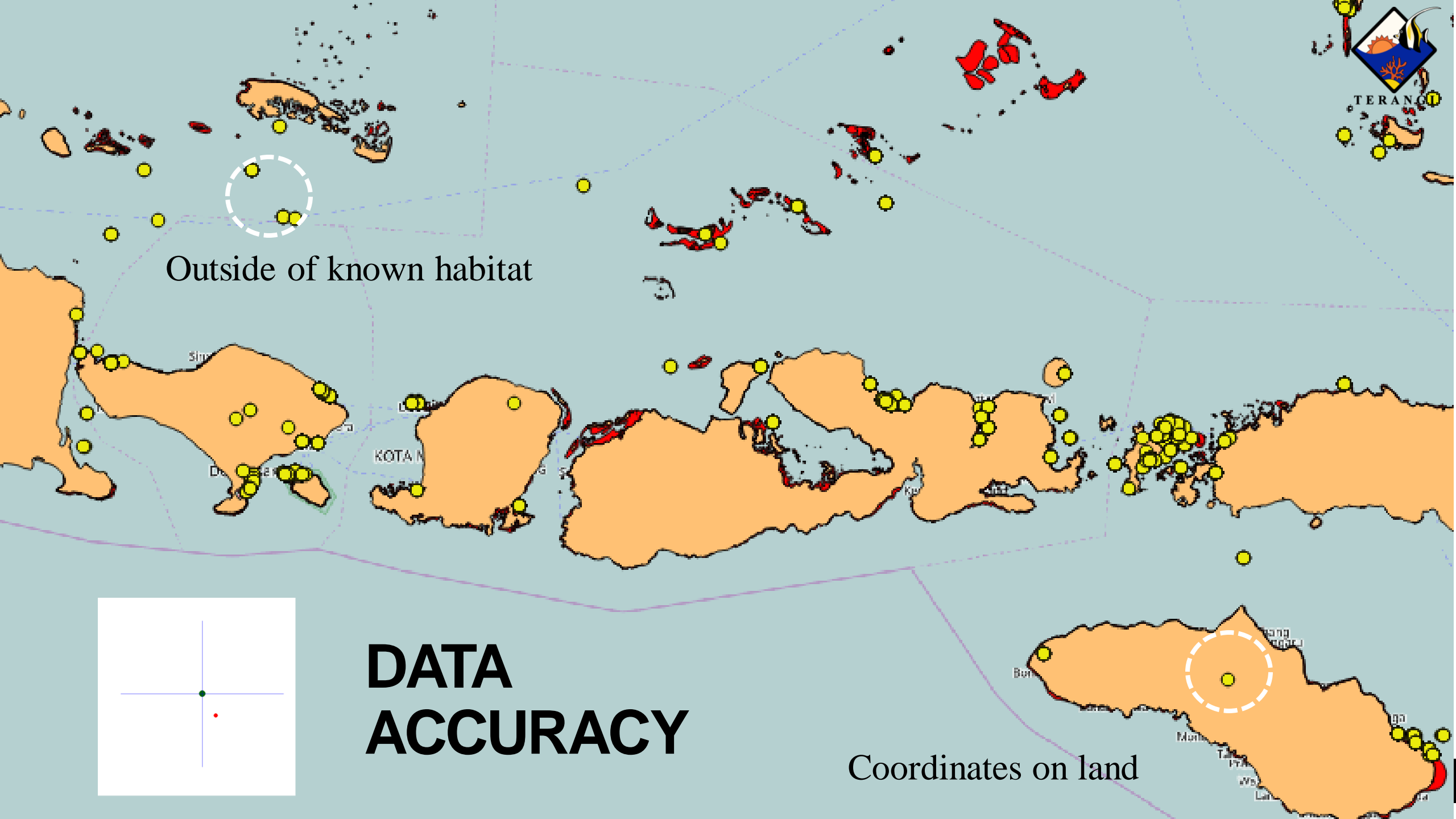
Can not be modeled

UNSUCCESSFUL MODELS

- Even though the insignificant models have high AUCs, cross validation and low sample size can make even random null models' AUC values of 0.85 to be unusual (Merckx et al. 2011).
- All unsuccessful models have low sample size
- Due to low records and low data accuracy



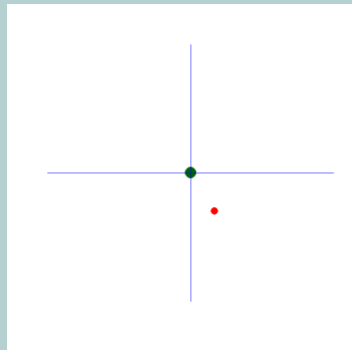
Genus	AUC		Sample
	Test	95% null	
<i>Balanophyllia</i>	0.9452	0.9792	6
<i>Blastomussa</i>	0.8406	0.9999	3
<i>Madracis</i>	0.9287	0.9989	4
<i>Plesiastrea</i>	0.9731	0.9952	5
<i>Pseudosiderastrea</i>	0.8751	0.9974	5
<i>Stylocoeniella</i>	0.9233	0.9708	7
<i>Catalaphyllia</i>	0.5	N/A	1
<i>Dendrophyllia</i>	0.9999	N/A	2
<i>Heterocyathus</i>	0.9743	N/A	2
<i>Oulastrea</i>	0.9695	N/A	5
<i>Palauastrea</i>	0.5	N/A	1
<i>Scapophyllia</i>	N/A	N/A	1
<i>Zoopilus</i>	N/A	N/A	0



Outside of known habitat

**DATA
ACCURACY**

Coordinates on land



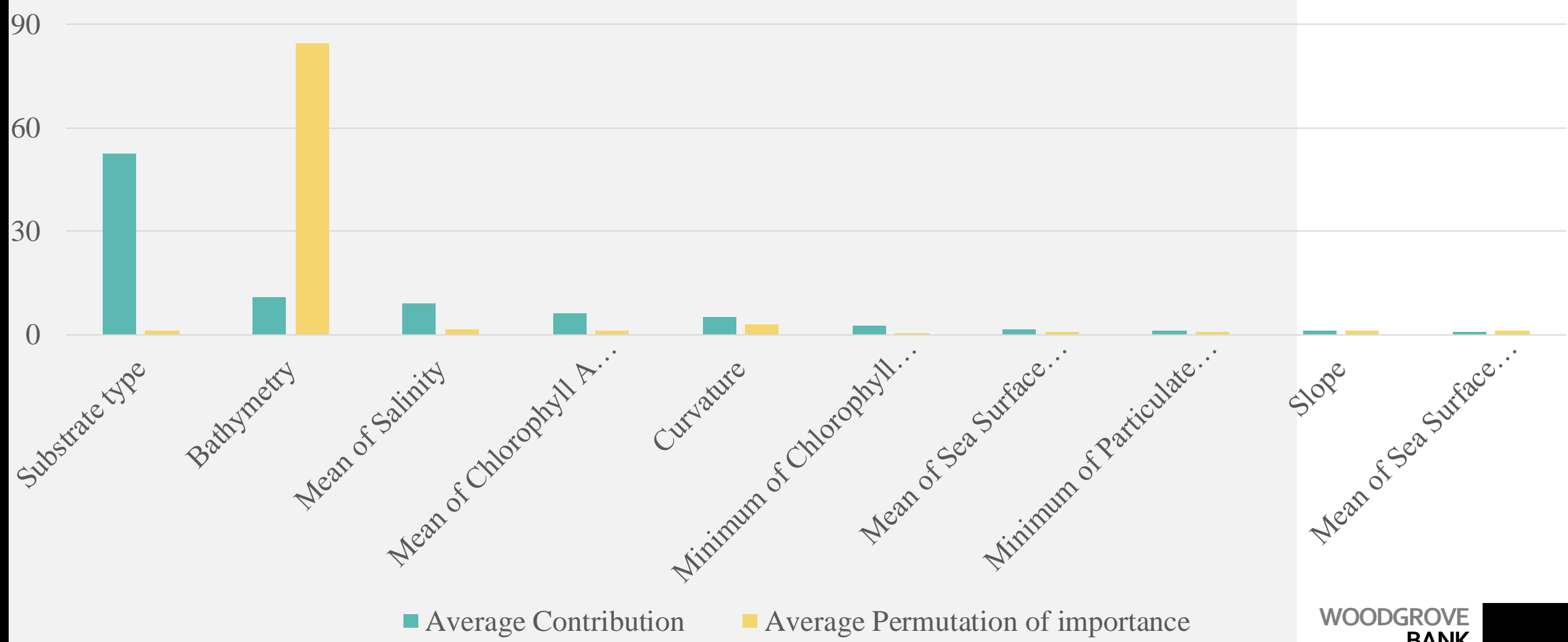
UNSUCCESSFUL MODELS

- These genera except for *Oulastrea*, are generally rare in nature
- *Oulastrea* are usually found in turbid water
- *Dendrophyllia*, *Madracis*, and *Stylocoeniella* are cryptic and usually found in the shade of rocks and caves
- *Catalaphyllia*, *Heterocyathus*, *Balanophyllia*, and *Blastomussa* are mostly found in deeper water (more than 20 m)
- These areas are where coral reef monitoring programs seldom reach
- These genera require targeted surveys and the use of another modelling method

SUCCESSFUL MODELS

- 60 genera can be modelled successfully and tested significant against the upper 5% of the null distribution's AUC.
- Successful model can be built using as low as 7 + 1 training samples with cross validation (*Gardineroseris* distribution model).
- Model with lowest training sample and null AUC below 0.9 is *Alveopora* distribution model with 33 samples with cross validation

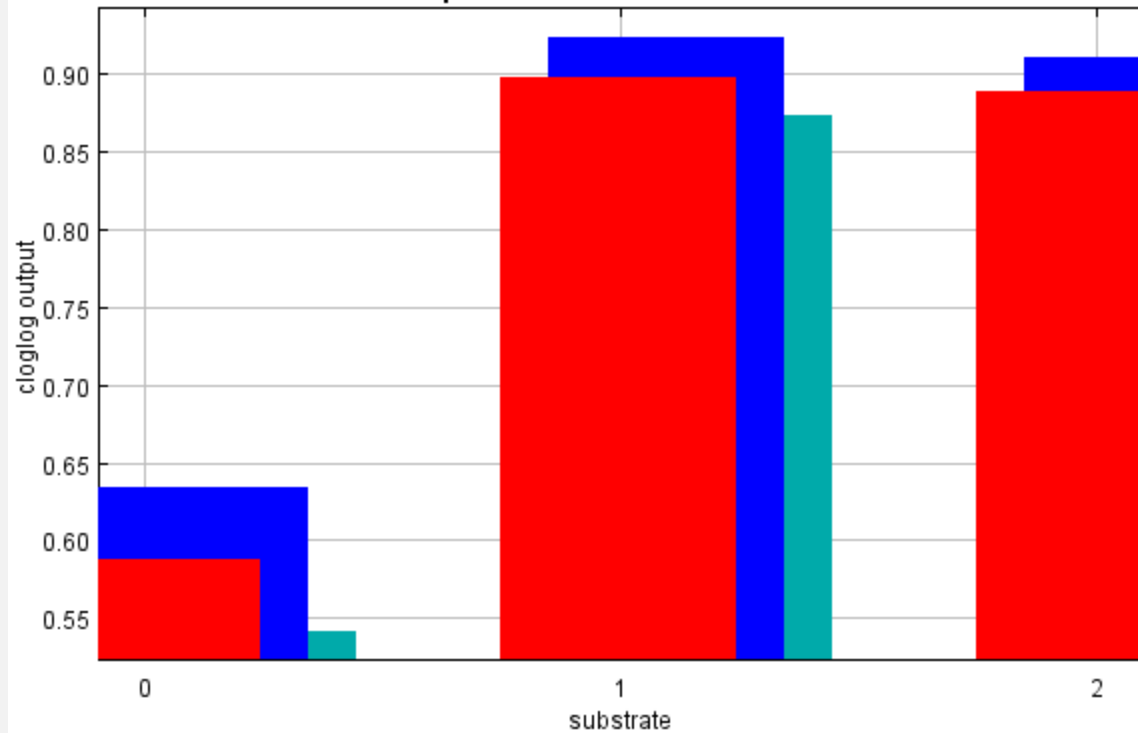
ENVIRONMENTAL VARIABLES CONTRIBUTION TOWARDS MODEL GAIN



SUBSTRATE TYPE

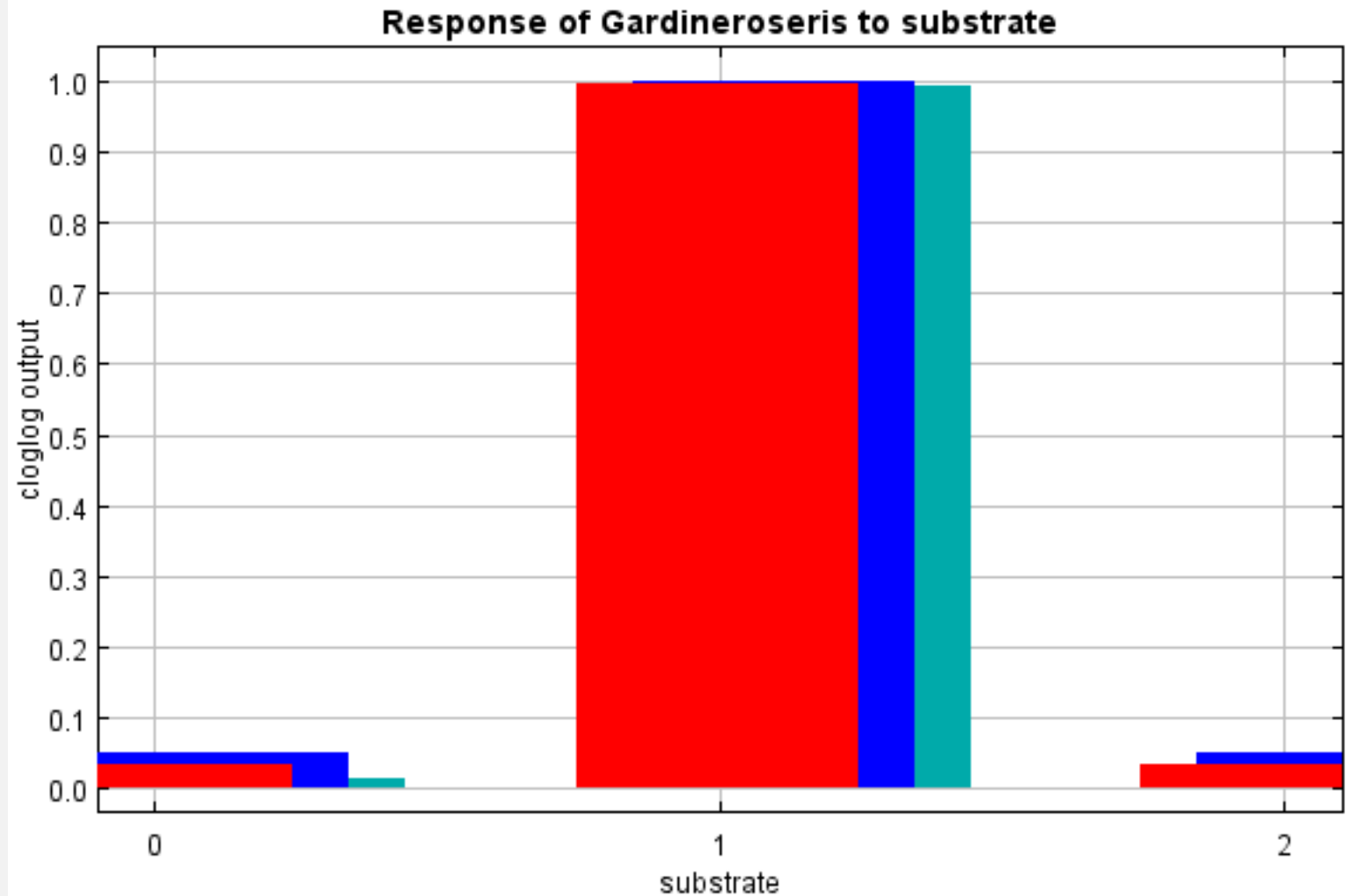
- *Porites* preferred coral dominated reefs (1) than sand dominated reefs (2) but can live in both

Response of *Porites* to substrate



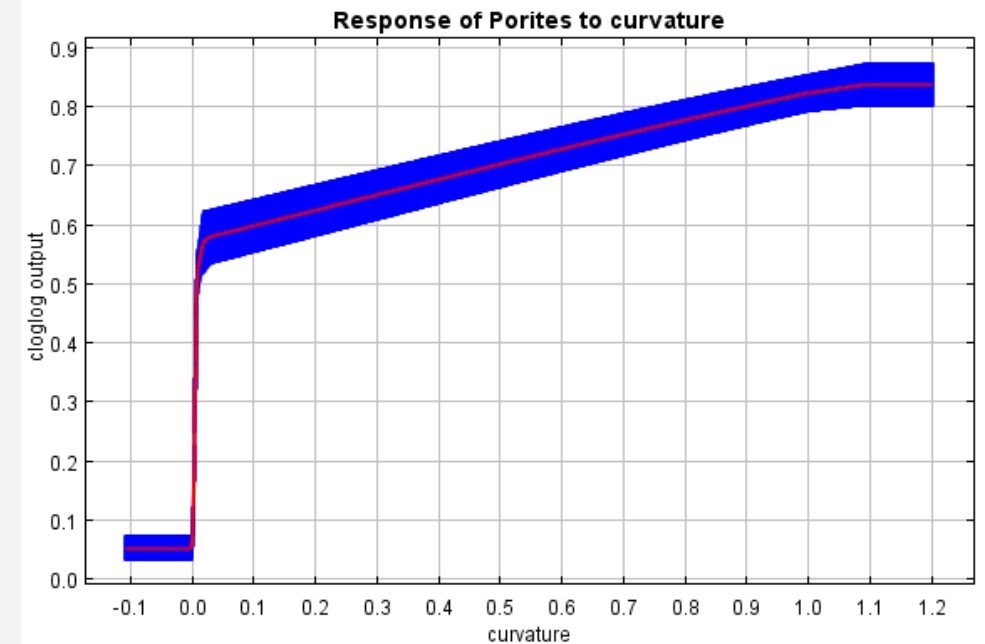
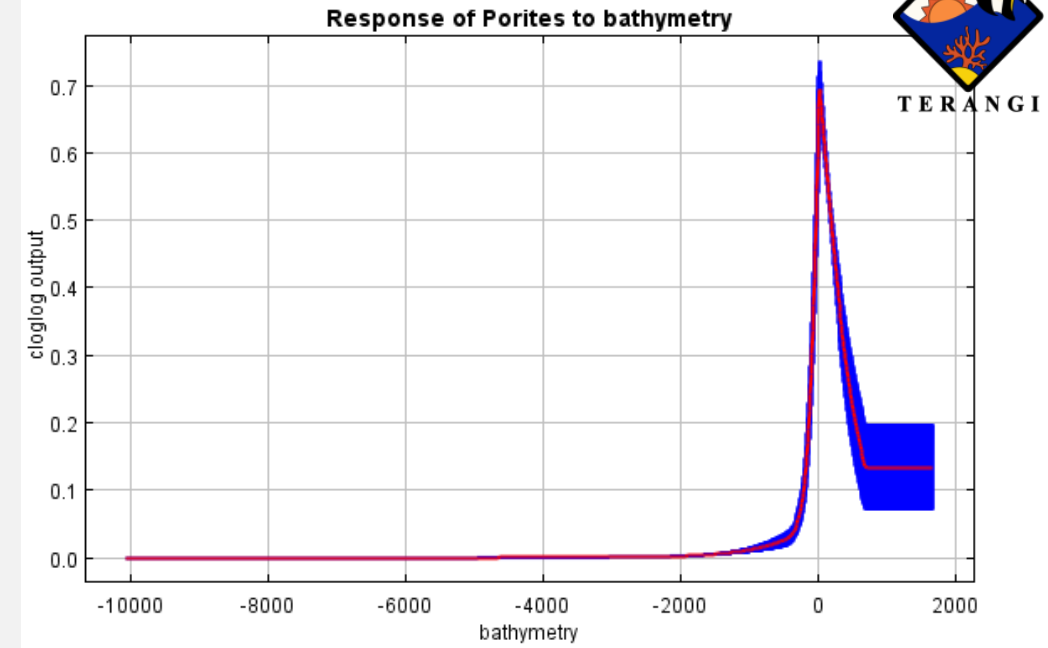
GARDINEROSERIS

- Almost entirely dependent on coral dominated reefs



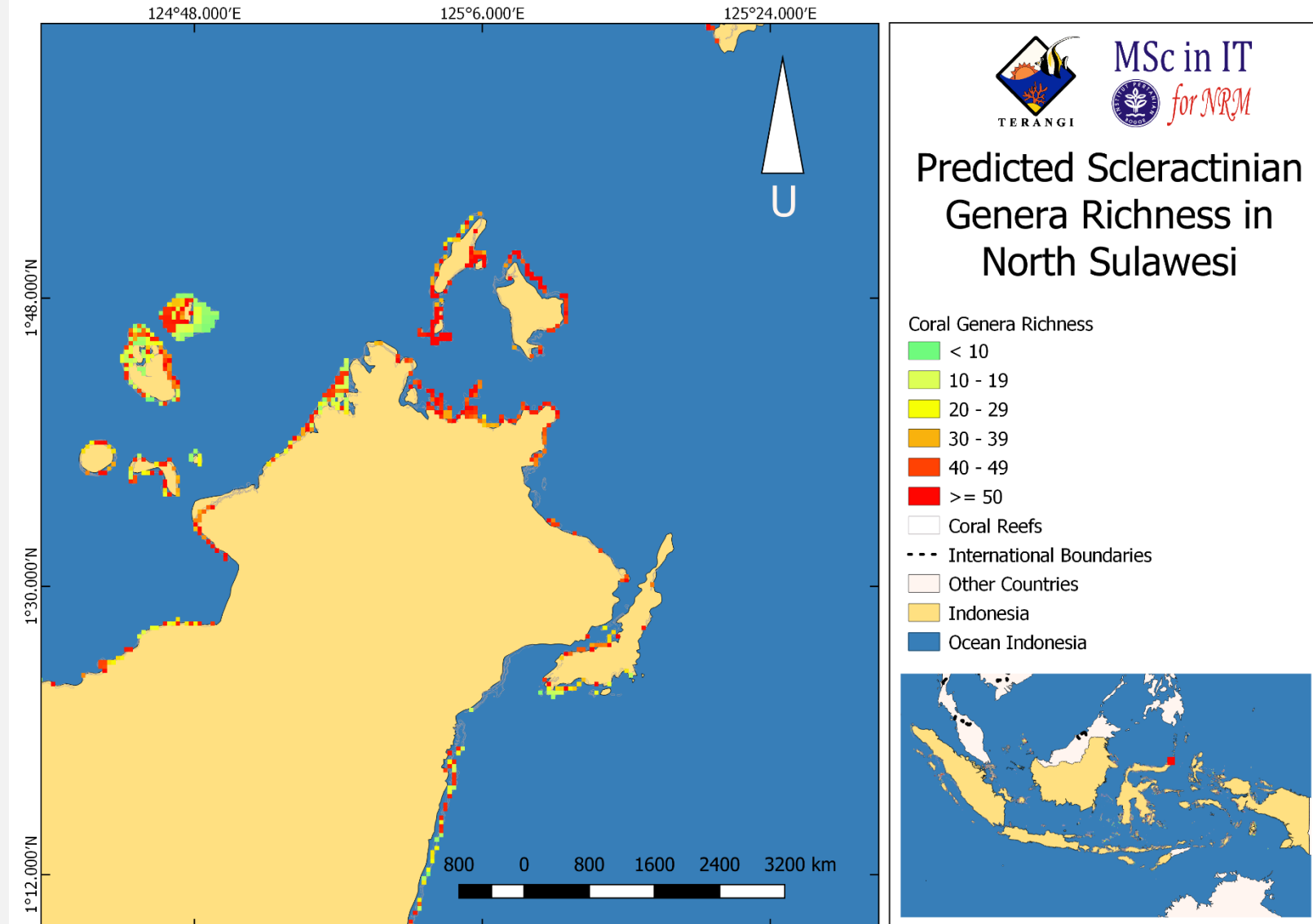
BATHYMETRY AND CURVATURE

- Most habitable is shallow water
- Most preferred is reefs with curvature from 0 - 1°

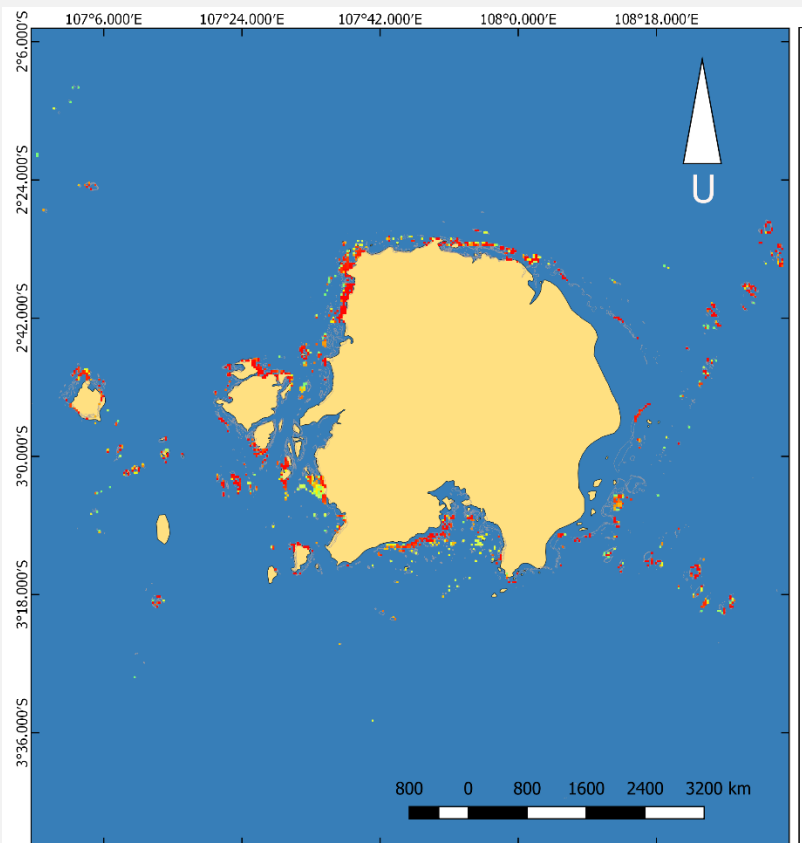


GENERA RICHNESS

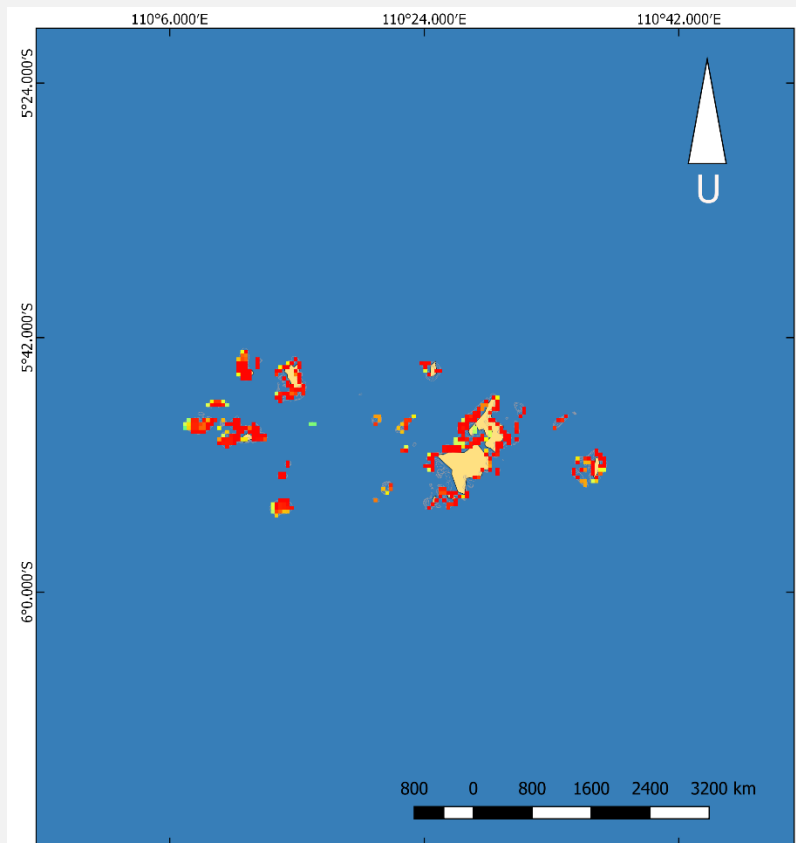
- The maximum genera richness in a location is 58 genera
- Can be found in several places, such as the middle part of Seribu Islands chain, Bangka, Gangga, and Lembeh Island in North Sulawesi, and Raja Ampat.



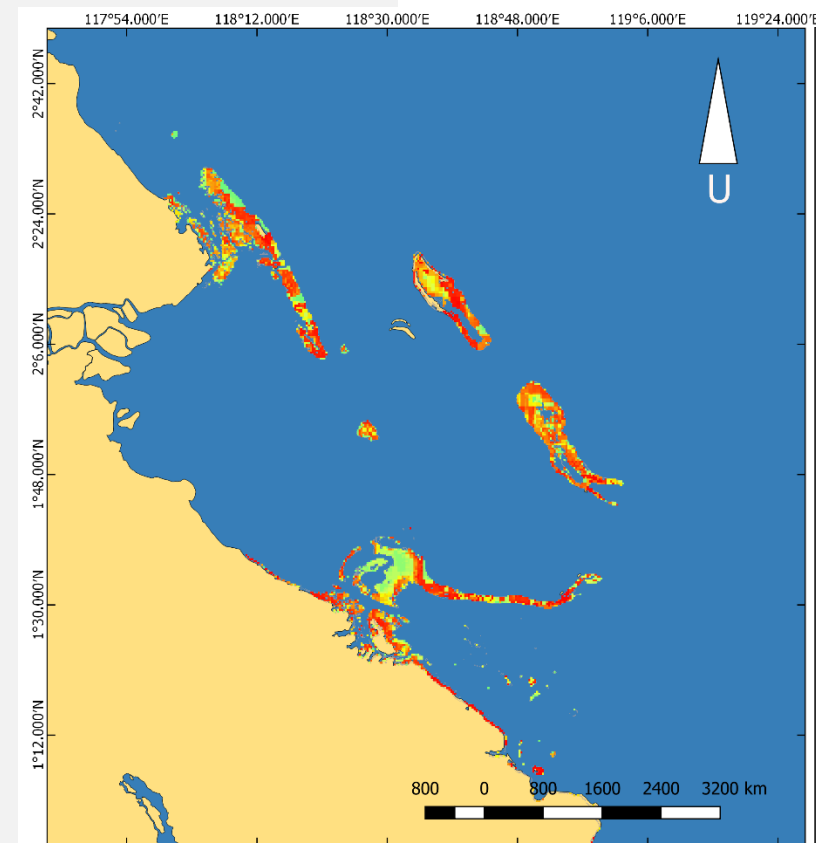
GENERA RICHNESS



Belitung Island

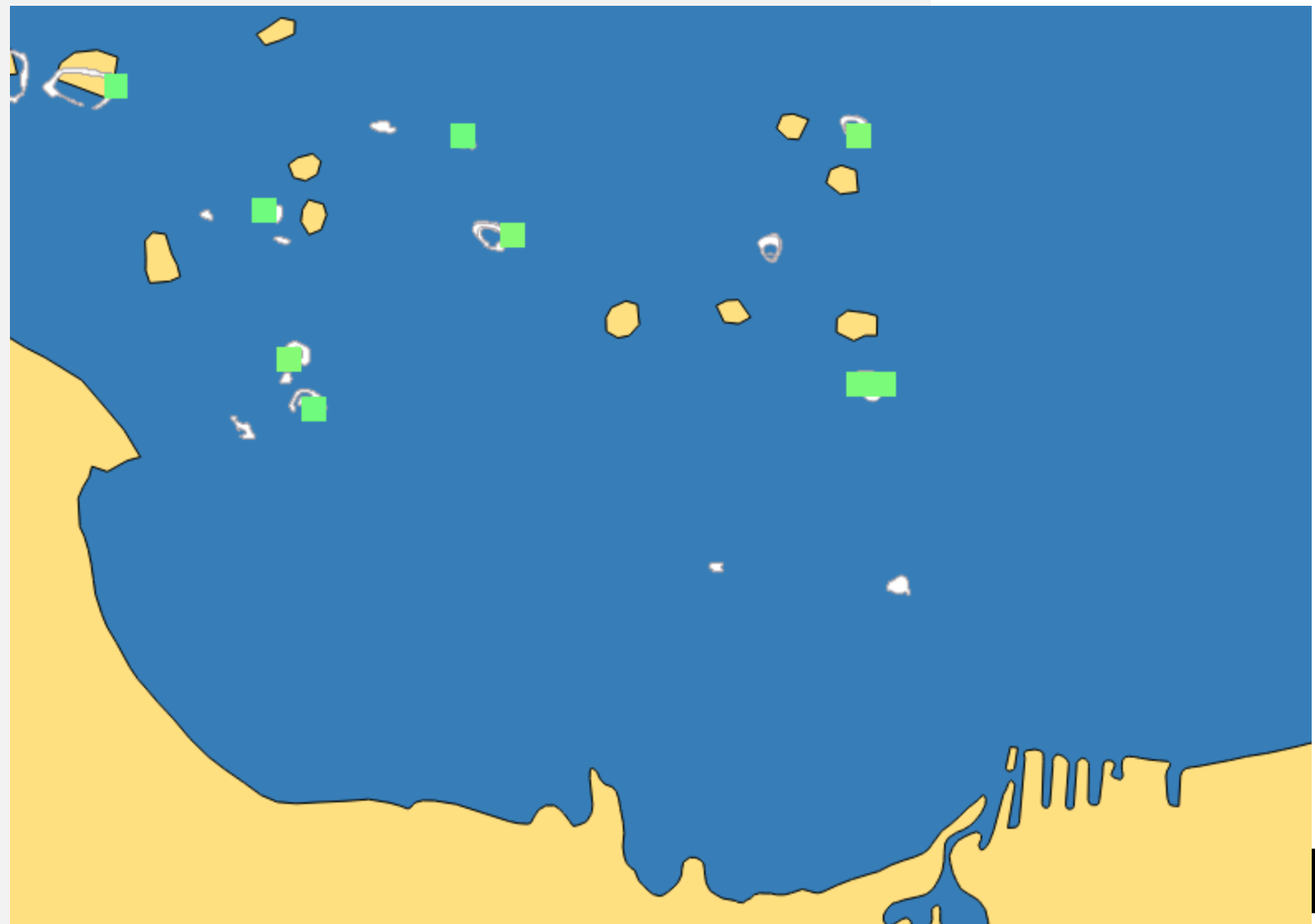
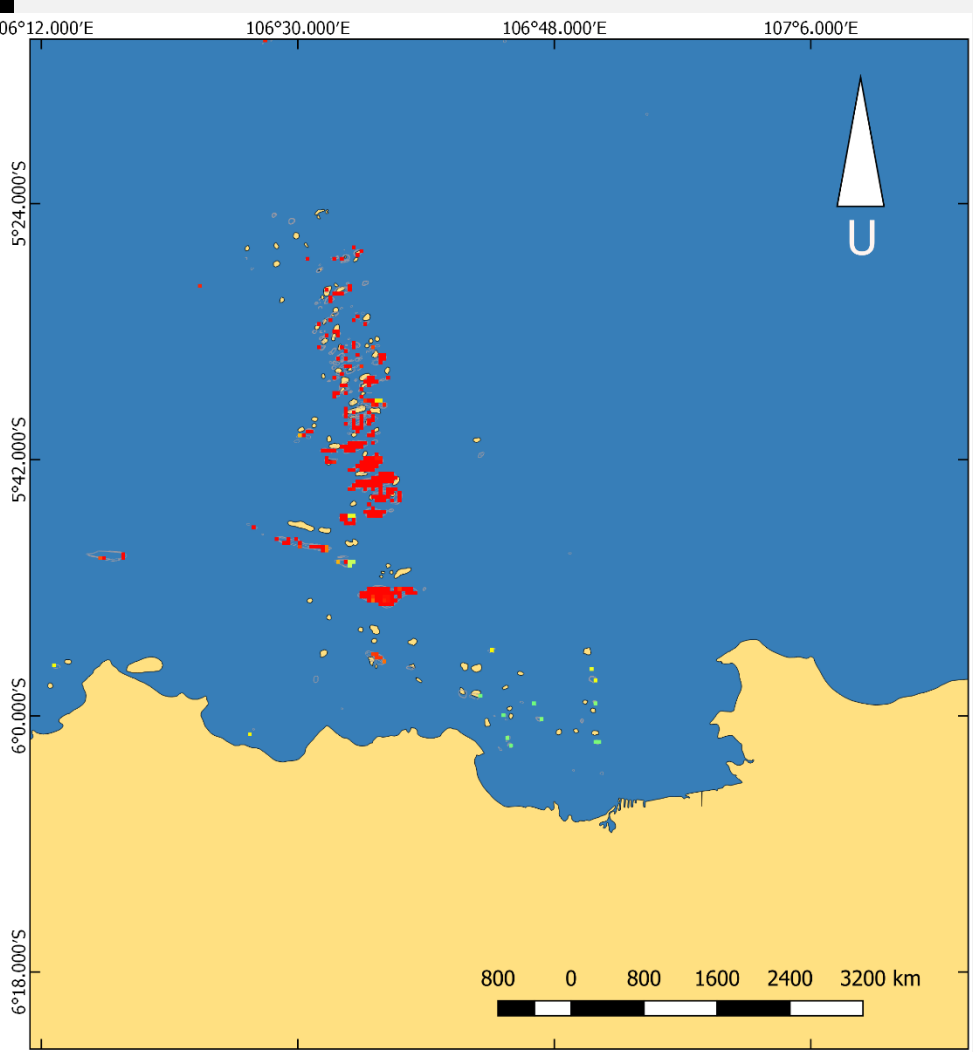


Karimun Jawa Islands



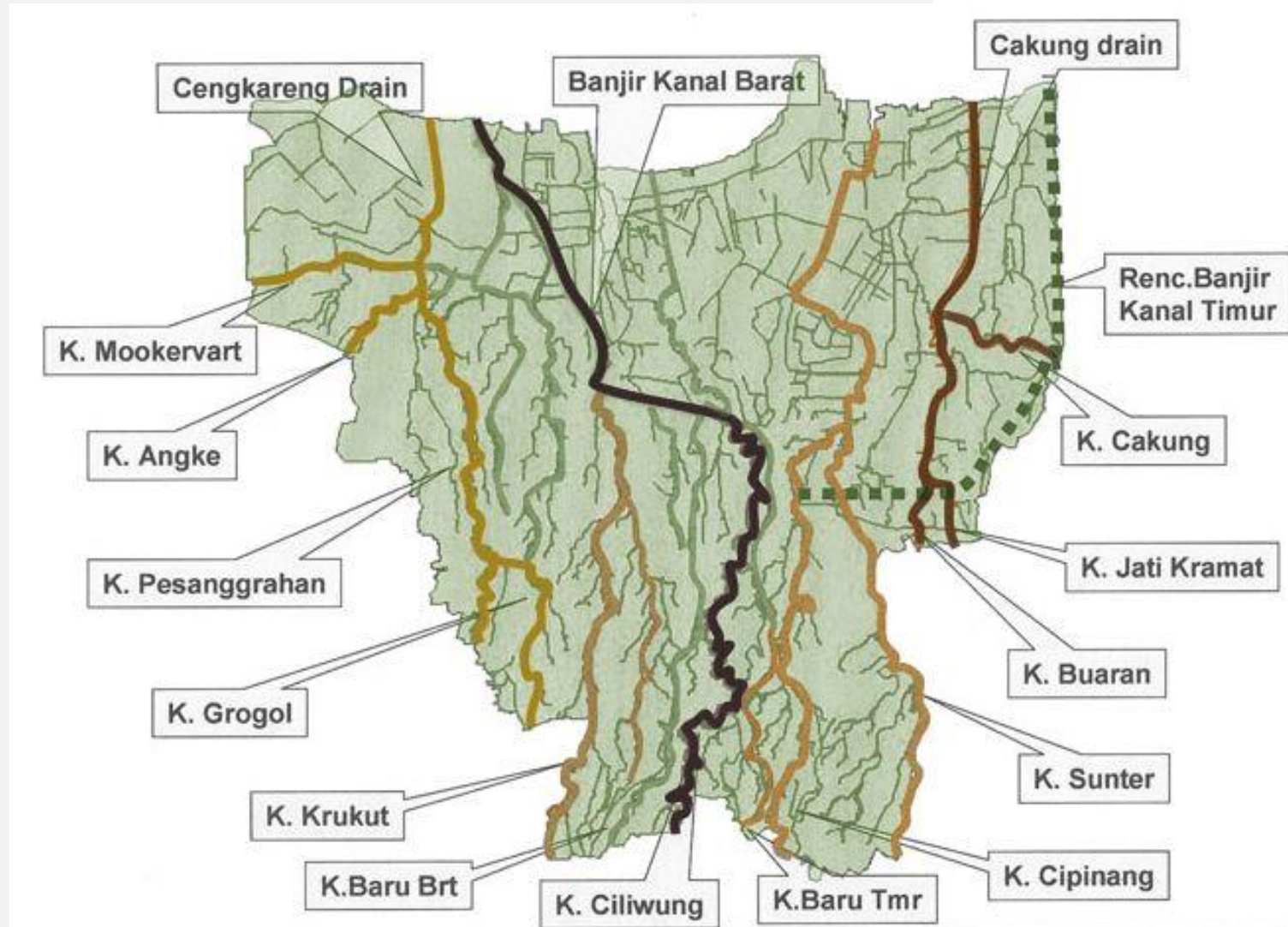
Derawan Islands

GENERA RICHNESS IN SERIBU ISLAND



CORAL ABSENCE IN JAKARTA BAY

- No preferable substrate type
- Both coral reefs and coral-sand reefs are smothered with sediment
- 13 polluted rivers dumping their sediment, heavy metal, liquid and solid waste altogether, this area has high sedimentation that made life hard for corals and they are unable to photosynthesize
- Sediment accumulation rate is up to 0.852 cm/year
- Jakarta will experience coastal reclamation, that will increase the benthic sediment thickness to 2.49 m compared to 0.84 m today



CONCLUSIONS

- Scleractinian distribution models can be built using openly available environmental data and occurrence records.
- Successful model can be built using as low as 7 + 1 training samples with cross validation, but recommended to be at least 33.
- Rare and cryptic species requires targeted surveys.
- Improvement in spatial accuracy can be done with higher resolution input

THANK YOU VERY MUCH



MSc in IT
for NRM



- Questions
- Critics
- Suggestions

