

SPECIES DISTRIBUTION MODELLING WITH GBIF, MAXENT, AND GOOGLE EARTH ENGINE

Safran Yusri



WORKSHOP CONTENT

Accessing occurrence datasets from GBIF

Preparation of species data in Spreadsheets

Understanding and assembling environmental data for model input for analysis

Pre-processing of environmental data layers in a Google Earth Engine

Running models on MaxEnt and manipulating settings

Interpreting results



ACCESSING OCCURRENCE DATASETS FROM GBIF

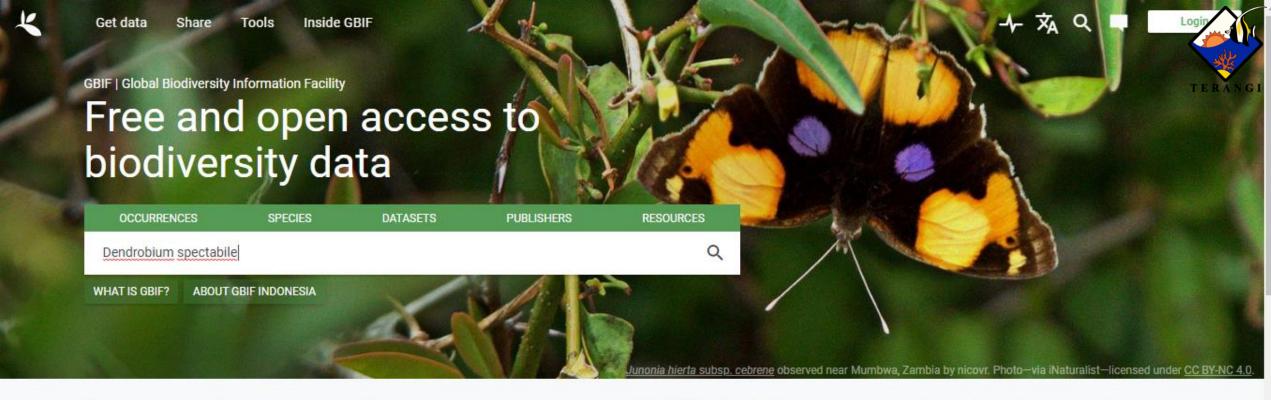
Go to https://gbif.org

Enter species name

Select occurrence records

Choose records with tolerable GBIF issues

Download dataset as CSV



Occurrence records 1,090,679,138

Datasets 42,882



Funding awarded to four mobilization projects in European Russia

11 March 2019



Global survey shows genetic structure predicted by range size and latitude

18 March 2019

Publishing institutions 1,369



Dr Joe Miller named new GBIF **Executive Secretary** 4 February 2019

Peer-reviewed papers using data 3,564



Call for nominations to the 2019 GBIF Young Researchers Award GBIF Secretariat deadline: 15 May 2019.



Get data Share Tools Inside GBIF

→ 🔻 🤄





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EVERYTHING

OCCURRENCES

SPECIES DATASETS

PUBLISHERS

RESOURCES

Dendrobium spectabile Miq.

Species

Classification: Plantae > Tracheophyta > Liliopsida > Asparagales > Orchidaceae > Dendrobium

Accepted Species 81 occurrences



SPECIES 2 RESULTS

Dendrobium spectabile f. aurea Christenson

Form

Synonym of: Dendrobium spectabile Miq.

Classification: Plantae > Tracheophyta > Liliopsida > Asparagales > Orchidaceae > Dendrobium > Dendrobium spectabile

Synonym Form 0 occurrences

Cannot find what you are looking for?

Try specifying a type

OCCURRENCES

SPECIES

DATASETS

PUBLISHERS

RESOURCES

Kingdom

Phylum

Class

Order

Family

Genus

Get data

Plantae

Tracheophyta

Liliopsida

Asparagales

Orchidaceae

Share

Tools

Inside GBIF

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Classification

Select a species

Dendrobium spectabile Miq.

SPECIES | ACCEPTED

Published in: Fl. Ned. Ind. 3:645. 1859 source: Catalogue of Life

METRICS

81 OCCURRENCES

26 OCCURRENCES WITH IMAGES

OVERVIEW

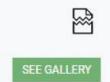




REFERENCE TAXON ₪







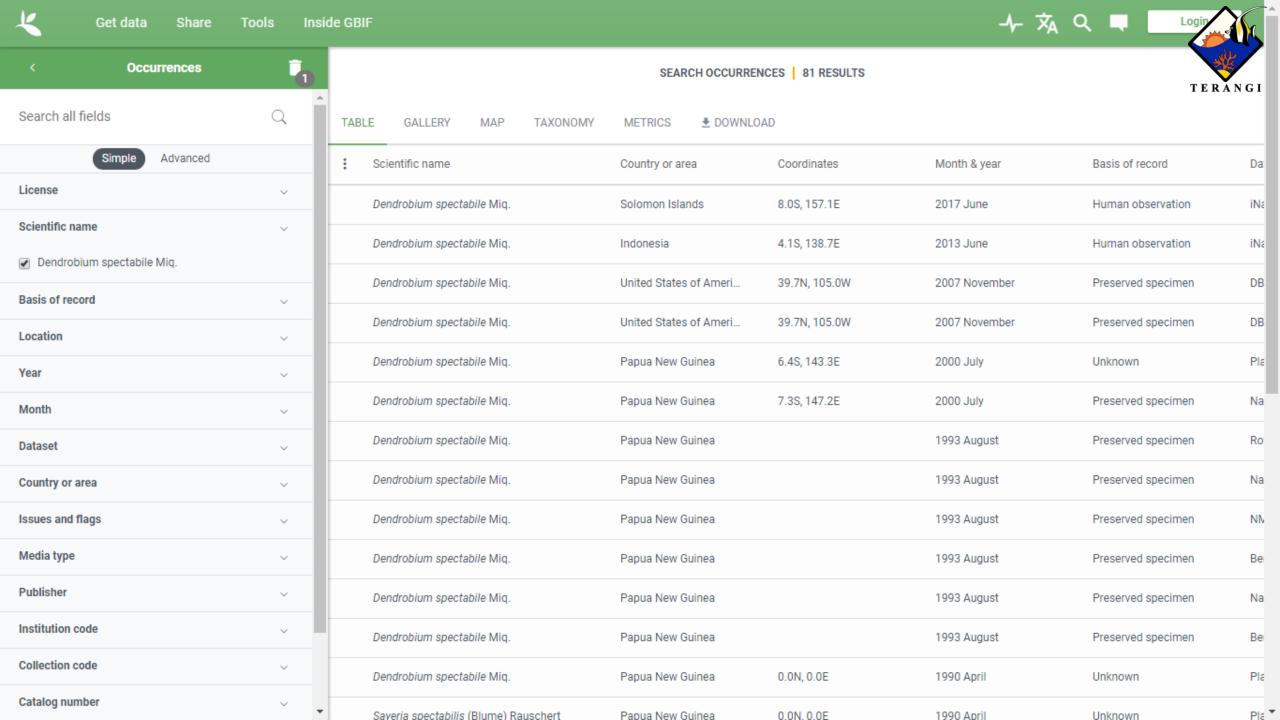
17 GEOREFERENCED RECORDS





Dendrobium Sw.

- = Callista spectabilis (Blume) Kuntze
- = Dendrobium spectabile f. aurea Christenson
- ≡ Dendrobium tigrinum Rolfe
- Dendrobium tigrinum Rolfe ex Hemsl.
- = Latourea spectabilis Blume
- = Latouria spectabilis Blume
- Latourorchis spectabilis (Blume)
 Brieger
- = Saveria spectabilis (Blume)



Issues and flags

Zero coordinate

Coordinate out of range
 Coordinate invalid
 Coordinate rounded
 Geodetic datum invalid

Coordinate reprojected

Geodetic datum assumed WGS84

Coordinate reprojection failedCoordinate reprojection suspicious

Coordinate accuracy invalid
 Coordinate precision invalid

Country coordinate mismatch

Country derived from coordinatesContinent country mismatch

Continent derived from coordinates
 Presumed swapped coordinate
 Presumed negated longitude
 Presumed negated latitude
 Recorded date mismatch
 Recorded date invalid
 Recorded date unlikely

Country mismatchCountry invalid

Continent invalid

Coordinate uncertainty meters invalid

Coordinate precision uncertainty mismatch









TERANGI

SEARCH OCCURRENCES | 11 RESULTS

^	•	TABLE GALLERY MAP TAXONOMY METRICS & DOWNLOAD									
5 0		:	Scientific name	Country or area	Coordinates	Month & year	Basis of record	Da			
0			Dendrobium spectabile Miq.	Indonesia	4.1S, 138.7E	2013 June	Human observation	iNa			
0 10			Dendrobium spectabile Miq.	Papua New Guinea	6.4S, 143.3E	2000 July	Unknown	Pla			
0			Dendrobium spectabile Miq.	Papua New Guinea	0.0N, 0.0E	1990 April	Unknown	Pla			
0			Sayeria spectabilis (Blume) Rauschert	Papua New Guinea	0.0N, 0.0E	1990 April	Unknown	Pla			
0			Dendrobium spectabile Miq.	Papua New Guinea	4.6S, 142.6E	1990 September	Preserved specimen	Be			
0			Dendrobium spectabile Miq.	Papua New Guinea	4.6S, 142.6E	1990 September	Preserved specimen	Tro			
5			Dendrobium spectabile Miq.	Papua New Guinea	0.0N, 0.0E	1982 November	Unknown	Pla			
0			Dendrobium spectabile Miq.	Papua New Guinea	6.2S, 141.3E	1971 August	Unknown	Pla			
0			Dendrobium spectabile Miq.	Papua New Guinea	0.0N, 0.0E	1907 April	Unknown	Pla			
0			Dendrobium spectabile Miq.	Papua New Guinea	0.0N, 0.0E		Unknown	Pla			
0			Dendrobium spectabile Miq.	Papua New Guinea			Preserved specimen	Na			
0								+			
0 2											







DOWNLOAD | 19 MARCH 2019

Under processing

DOI 10.15468/dl.lrltit

Preparing

CANCEL

FILTER APPLIED 19 MARCH 2019 RERUN QUERY

The download has been started and is currently being processed.

Please expect up to 3 hours for the download to complete. Most downloads will complete within 15 minutes.

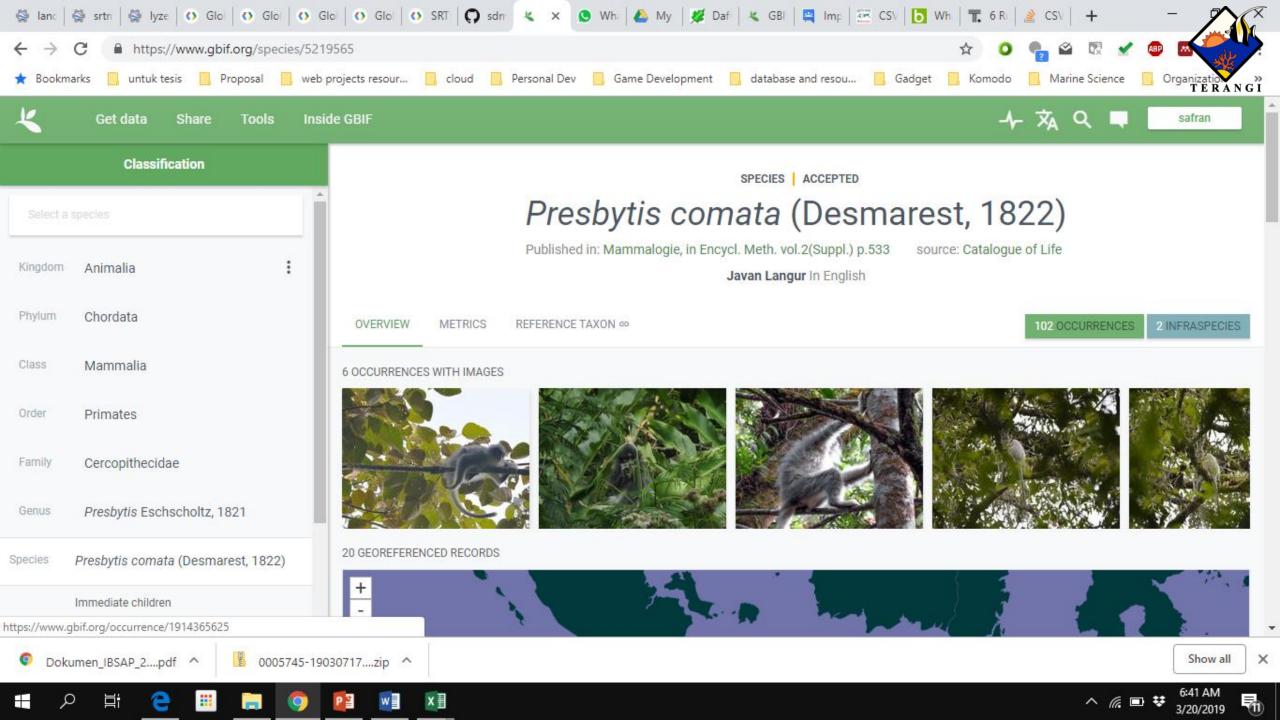
A notification email with a link to download the results will be sent to the following address once ready:

Citation: GBIF.org (19 March 2019) GBIF Occurrence Download https://doi.org/10.15468/dl.lrltit

License: Unspecified

Make sure to read the data user agreement and citation guidelines.

API And Country or area Indonesia . Papua New Guinea Issues and flags Geodetic datum assumed WGS84 . Coordinate rounded . Country coordinate mismatch . Recorded date invalid Scientific name Dendrobium spectabile Miq.





PREPARATION OF SPECIES DATA IN SPREADSHEETS

Extract archive

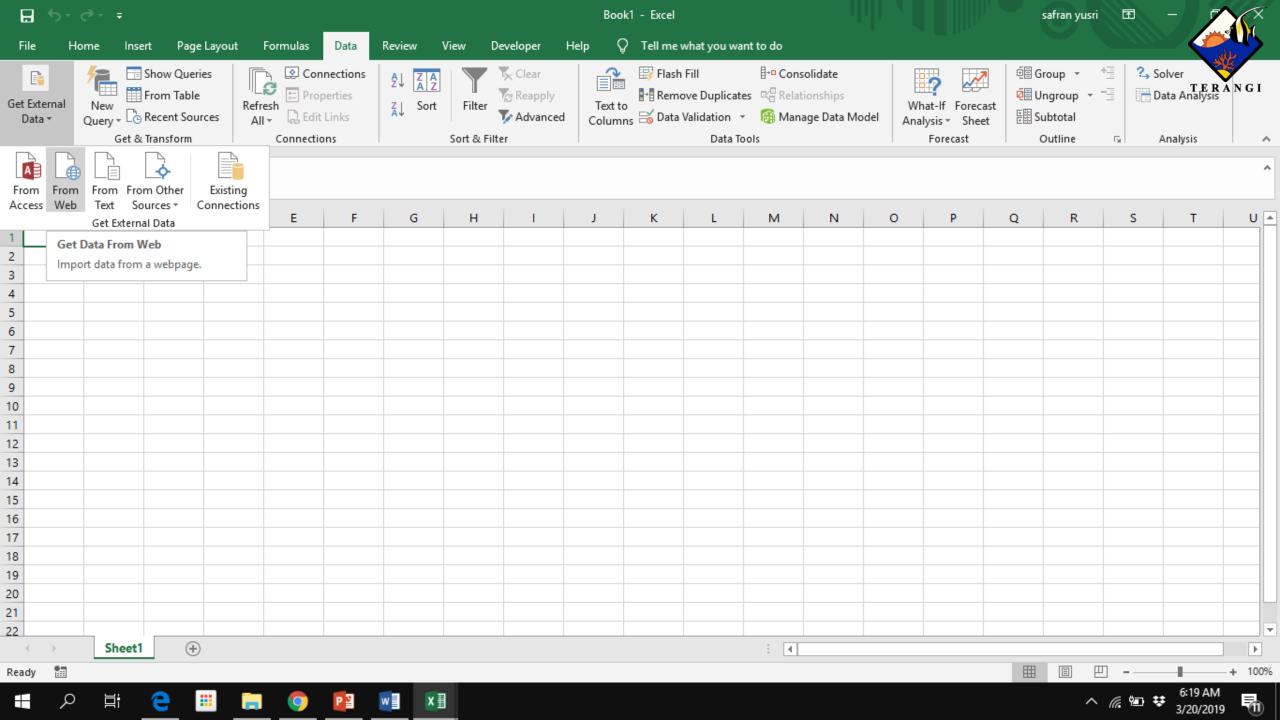
Open with spreadsheet application (Excel, OpenOffice Calc, etc.)

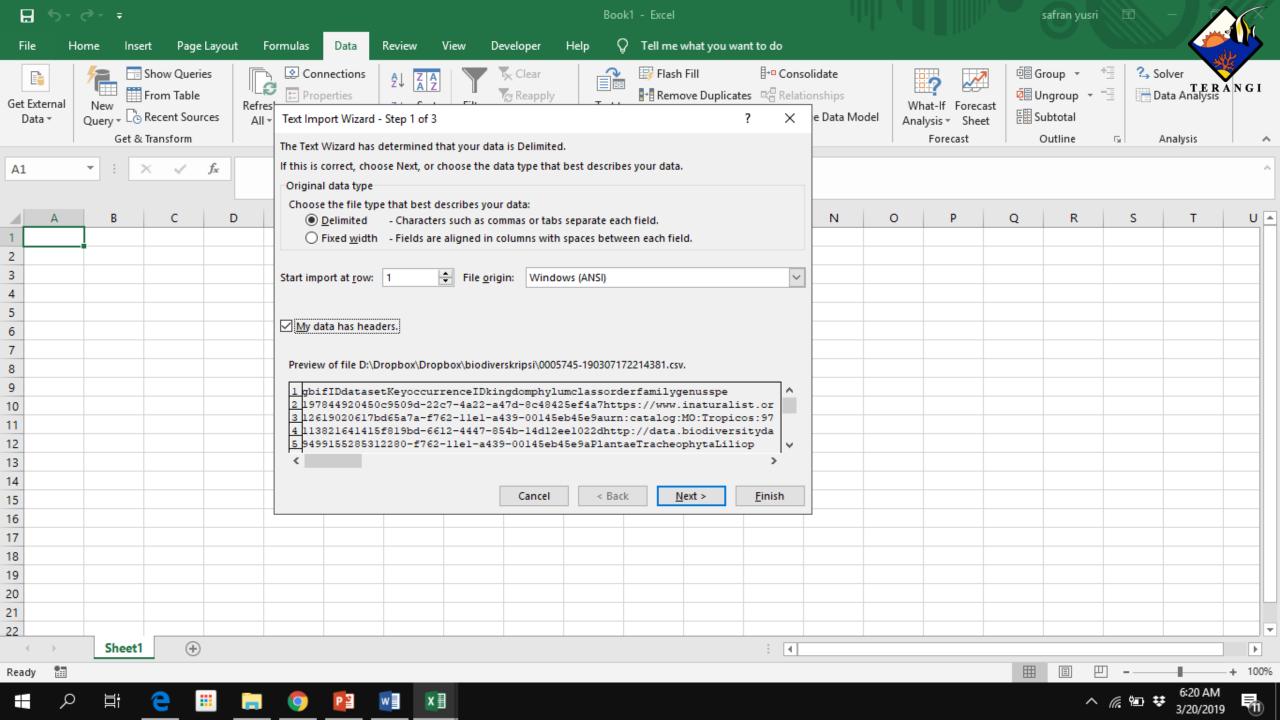
Data > Import from text (Excel)

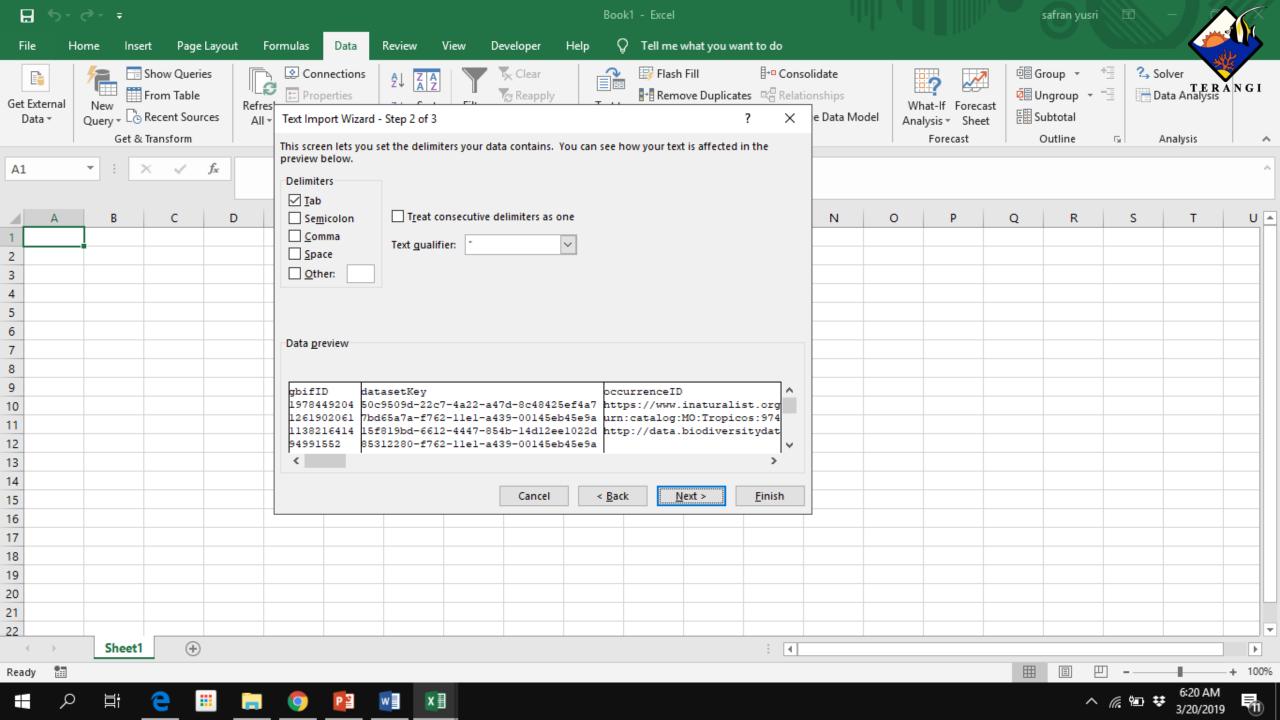
Check the data for possible errors

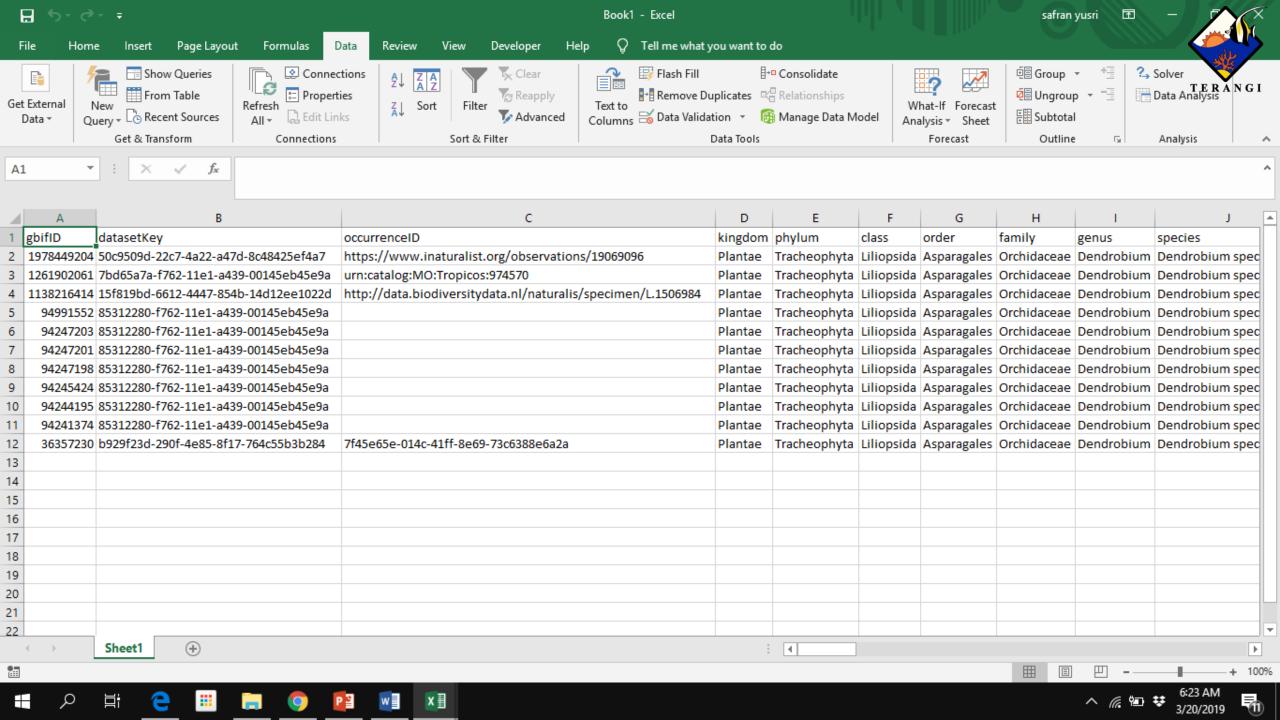
Delete all columns except decimallat, decimallon, and species

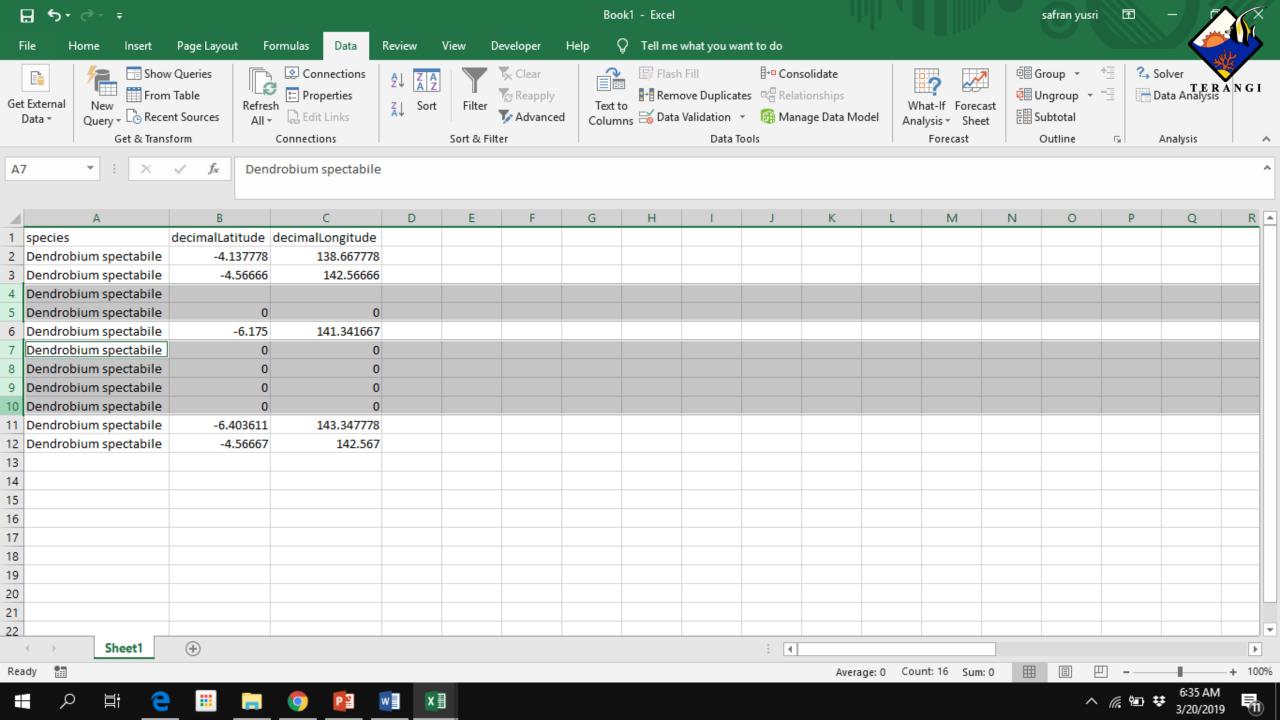
Save as new .CSV











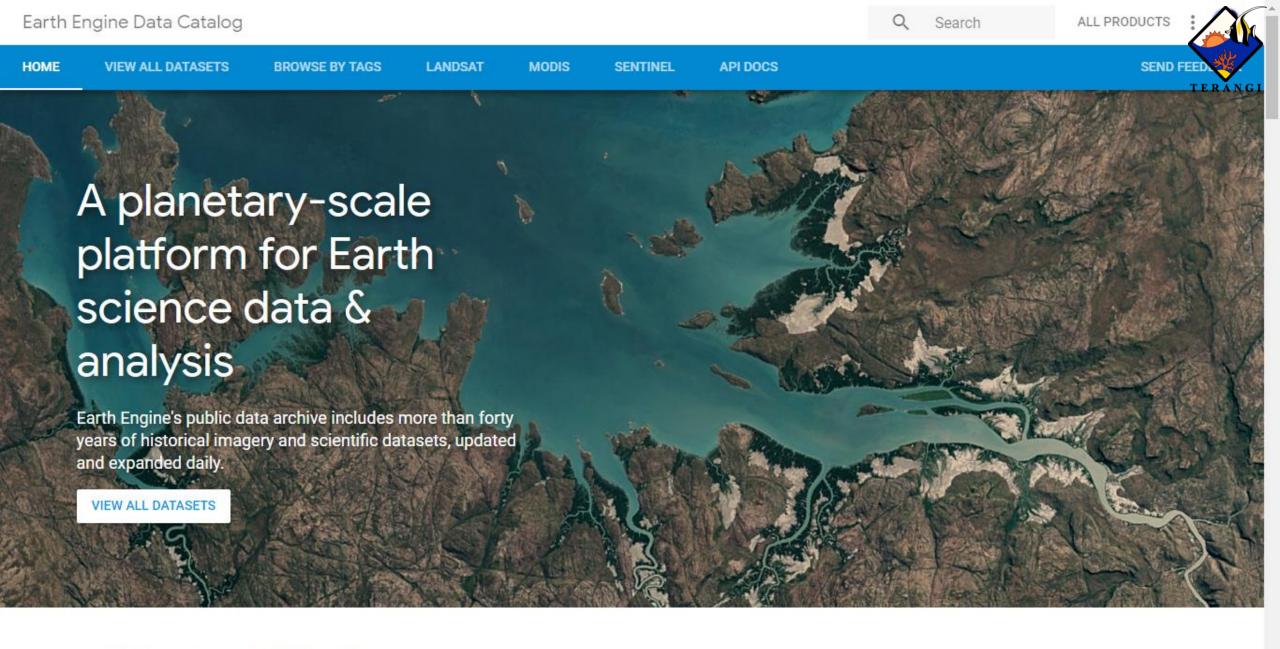


UNDERSTANDING AND ASSEMBLING ENVIRONMENTAL DATA FOR MODEL INPUT FOR ANALYSIS

Open https://code.earthengine.google.com/

Sign up and login

Review environmental variables that correlate with species presencein https://developers.google.com/earth-engine/datasets/



Climate and Weather

MODIS



Earth Engine Data Catalog

Earth Engine's public data catalog includes a variety of standard Earth science raster datasets. You can import these datasets into your script environment with a single click. You can also upload your own raster data or vector data for private use or sharing in your scripts.

Looking for another dataset not in Earth Engine yet? Let us know by suggesting a dataset.

Filter list of datasets

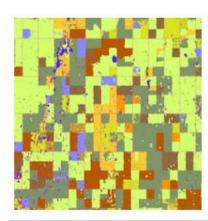
Canada AAFC Annual Crop Inventory

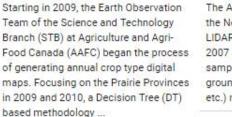


AHN Netherlands 0.5m DEM, Non-Interpolated



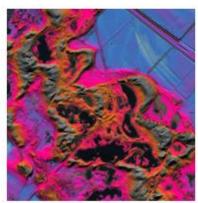
ASTER L1T Radiance







The AHN DEM is a 0.5m DEM covering the Netherlands. It was generated from LIDAR data taken in the spring between 2007 and 2012. It contains ground level samples with all other items above ground (such as buildings, bridges, trees etc.) removed. This version is ...



The AHN DEM is a 0.5m DEM covering the Netherlands. It was generated from LIDAR data taken in the spring between 2007 and 2012. It contains ground level samples with all other items above ground (such as buildings, bridges, trees etc.) removed. This version is ...



The AHN DEM is a 0.5m DEM covering the Netherlands. It was generated from LIDAR data taken in the spring between 2007 and 2012. This version contains both ground level samples and items above ground level (such as buildings, bridges, trees etc). The point cloud ...



The Advanced Spaceborne Thermal Emission and Reflection Radiometer (ASTER) is a multispectral imager that was launched on board NASA's Terra spacecraft in December, 1999. ASTER can collect data in 14 spectral bands from the visible to the thermal infrared. Each scene covers an area of ...

lidar elevation netherlands

lidar elevation netherlands

dem geophysical ahn

ar elevation netherlands em geophysical ahn

vnir tir swir nir



PRE-PROCESSING OF ENVIRONMENTAL DATA LAYERS IN A GOOGLE EARTH ENGINE

Sample script for extracting environmental variables:

Safran Yusri. (2019, March 16). safranyusri/sdm_predictors: SDM Predictors With GEE (Version V.01-pre-alpha). Zenodo. http://doi.org/10.5281/zenodo.2595966

Copy and paste selected snippet

Open GEE

Deliniate area of interest (aoi)

Export, download, and convert to .ASC

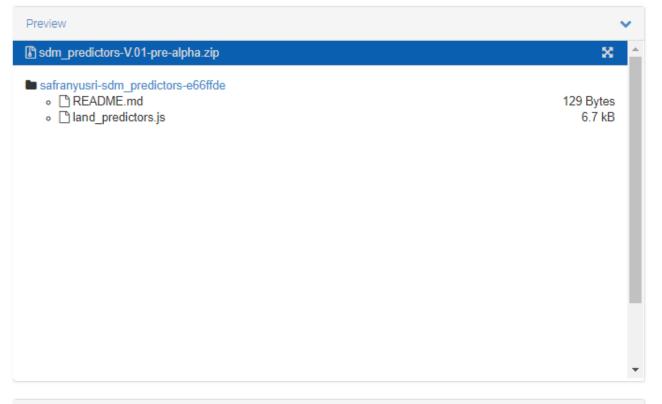


March 16, 2019 Software Open Access

safranyusri/sdm_predictors: SDM Predictors With GEE

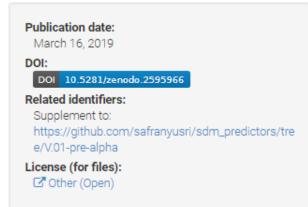
Safran Yusri

SDM Predictors With GEE

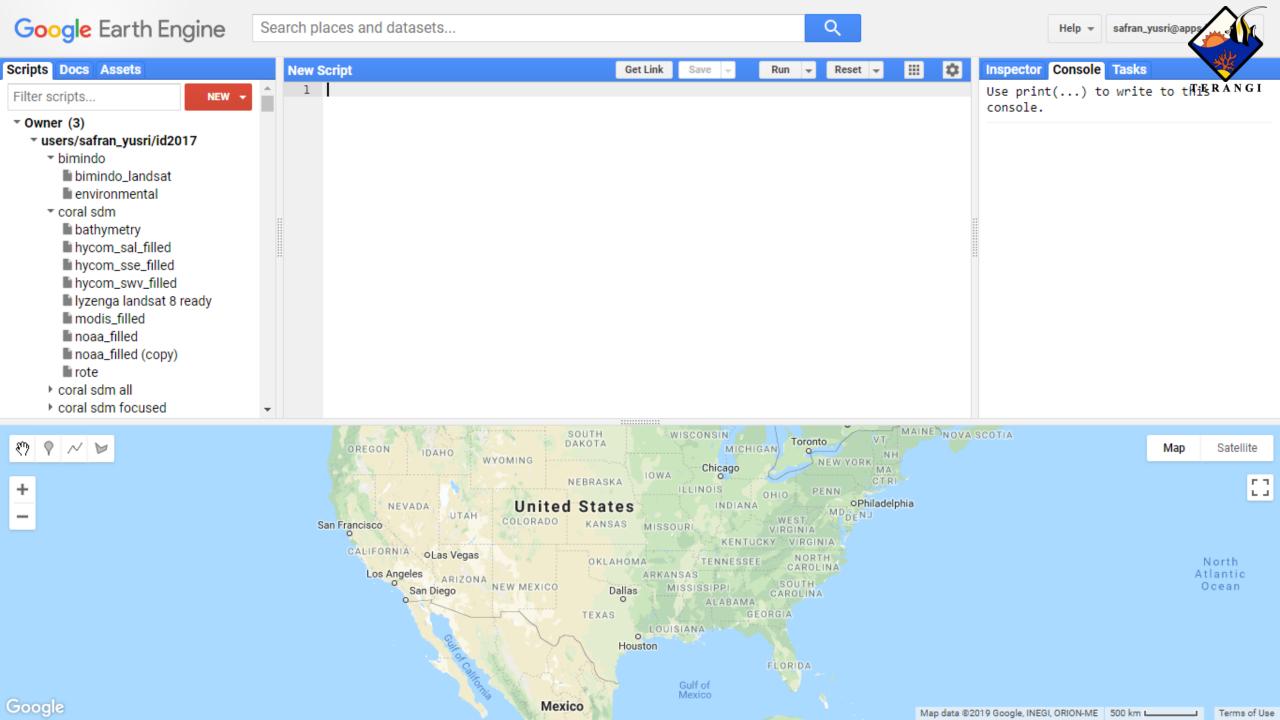


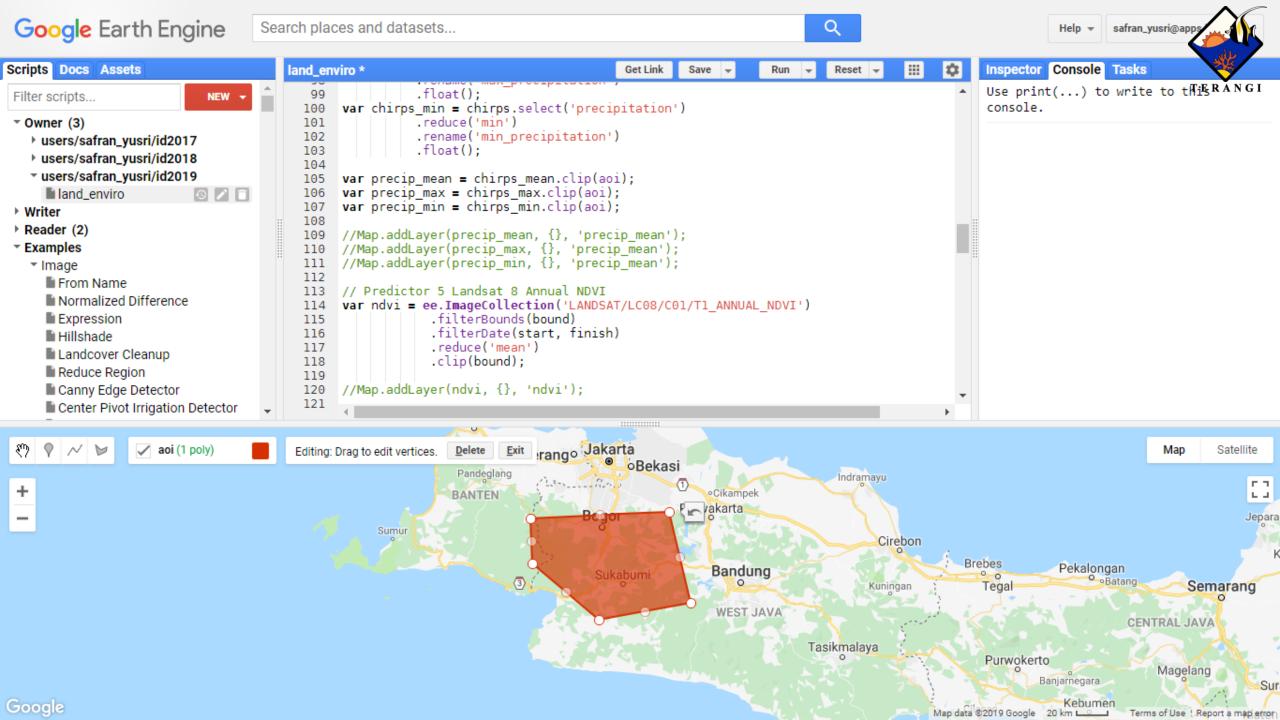
Size





Files (2.8 kB)







EXPORT REGION

```
Edit and replicate this line to export necessary environmental variables
// Step 3. Export the images, specifying scale and region.
Export.image.toDrive({
 image: npp,
 description: 'npp',
 maxPixels: 1e11,
 scale: 100,
 region: bound,
 folder: 'bio_enviro'
});
```



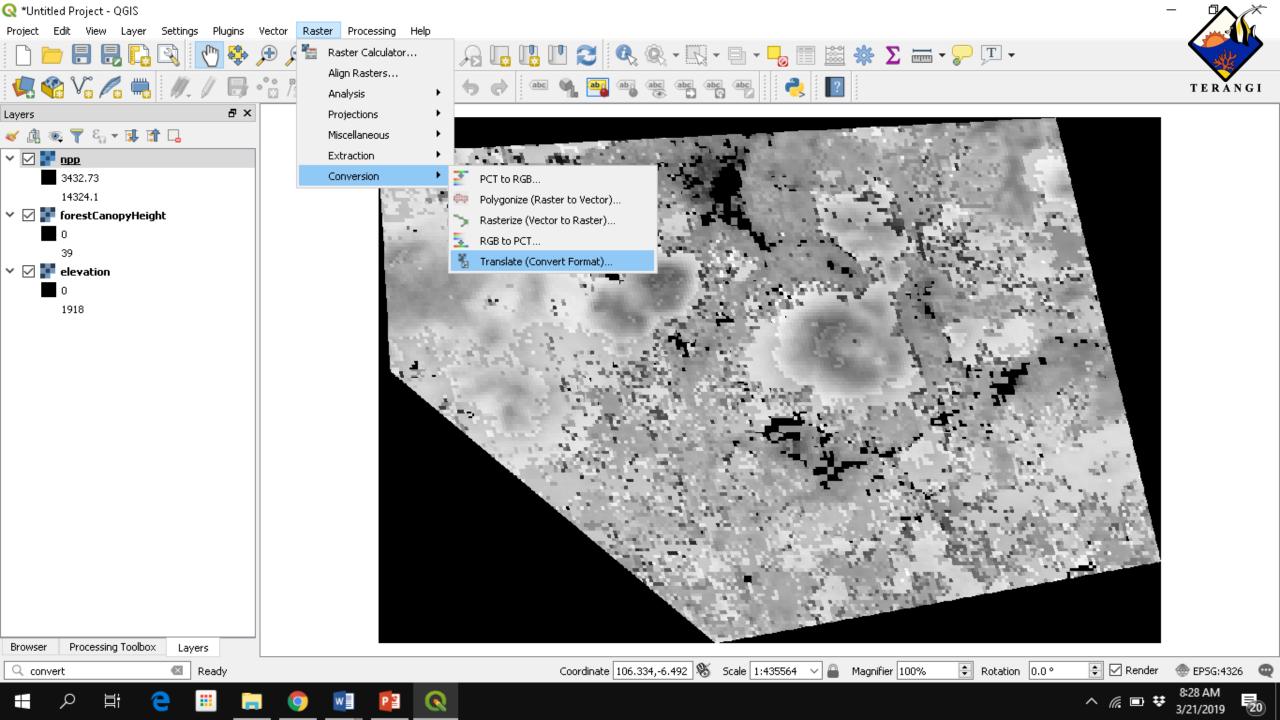
CONVERT .TIF TO .ASC IN QGIS

Open the file you wish to convert by selecting Layer >> Add Raster Layer.

Open the raster translator by selecting Raster >> Conversions >> Translate.

Set the input layer and in the Output file press the Select Button.

In the save dialogue, drop the file type down and select Arc/Info ASCII Grid (*.asc *.ASC).





CONVERT .TIF TO .ASC IN R

```
setwd("D:\\Dropbox\\Dropbox\\biodiverskripsi\\bio_enviro_new")
library(raster)
#read your file
r1 <- raster("npp.tif")
r2 <- raster("canopy.tif")
r3 <- raster("elevation.tif")
#export it to asc (ESRI ASCII)
writeRaster(r1, filename="npp.asc", format = "ascii", datatype='FLT4S', overwrite=TRUE)
writeRaster(r2, filename="canopy.asc", format = "ascii", datatype='FLT4S', overwrite=TRUE)
writeRaster(r3, filename="elevation.asc", format = "ascii", datatype='FLT4S', overwrite=TRUE)
```



RUNNING MODELS ON MAXENT AND MANIPULATING SETTINGS

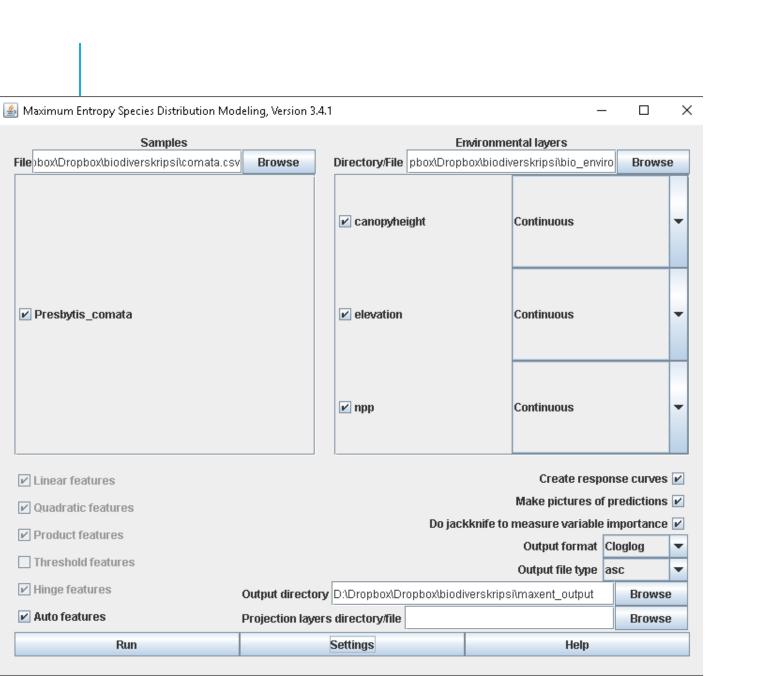
Download Maxent at https://biodiversityinformatics.amnh.org/open_source/maxent/

Input occurrence and environmental variables

Settings: Default model parameters were used as they have performed well in other studies and validated on a wide range of datasets (a convergent threshold of 10-5, maximum iteration value of 500 and a regularization multiplier of 1) (Phillips and Dudik 2008).

Threshold feature used was 10 percentile training presence. Models were ran with three fold cross validation, where presence locations were split into training data for model fitting and test data for model evaluation, and then averaged (Merow et al. 2013).

Run model



Maxin	mum Entropy	Parameters		_			R							
Basic	Advanced	Experimen	ıtal											
						with the								
Rand	om seed				TE.	DANG!								
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✓ Show	v tooltips													
✓ Ask I	efore overwi	riting												
Skip if output exists														
✓ Reme	ove duplicate	presence re	cord	s										
✓ Write	e clamp grid v	vhen projecti	ing											
✓ Do M	ESS analysis	when projec	ting											
Random			0											
Regularia	zation multipli	ier					1							
Max nun	nber of backg	round points				100	00							
Replicate	es						3							
Replicate	ed run type		Сгоз	ssvalidate			¥							
Test san	nple file					Browse								
Basic	Advanced	Experime	ntal											
☑ Add	d samples to I	ackground												
Add	Add all samples to background													
□ Wr	☐ Write plot data													
✓ Ext	rapolate													
∠ Do	clamping													
Wr	ite output grid	ls												
Write plots														
Append summary results to maxentResults.csv file														
☑ Ca	che ascii files													
Maxim	um iterations					51	00							
Conver	gence thresh	old				0.0000	01							
1	sample radius	S					0							
Log file						maxent.le	og							
Default	prevalence					C).5							
Apply t	hreshold rule	10 percer	ıtile t	raining presence	1		*							
Bias fil	е					Browse								



INTERPRETING RESULTS

In folder maxent output, find the corresponding .html file

Check the value of Area Under the Curve for model evaluation

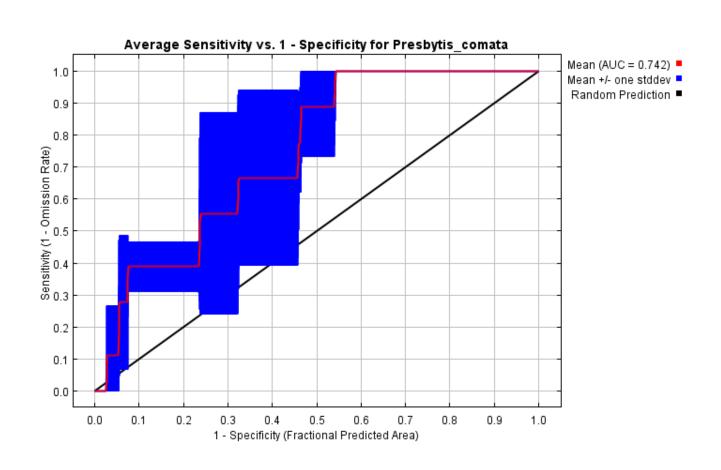
Find the map of predicted distribution (.asc)

Interpreting Jackknife analysis

Interpreting Response curves

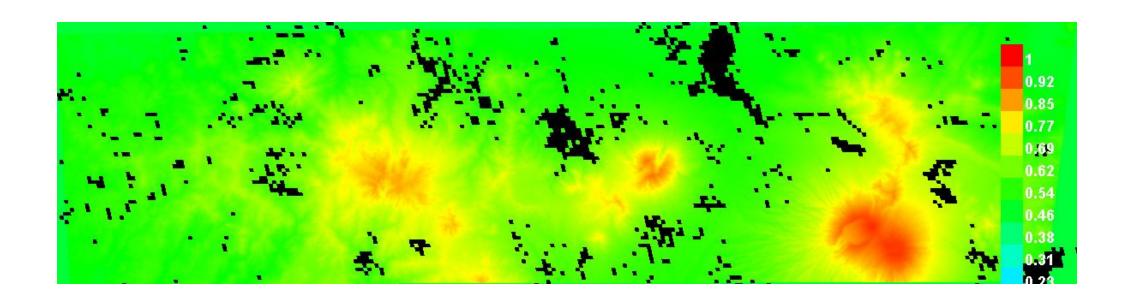


MODEL EVALUATION



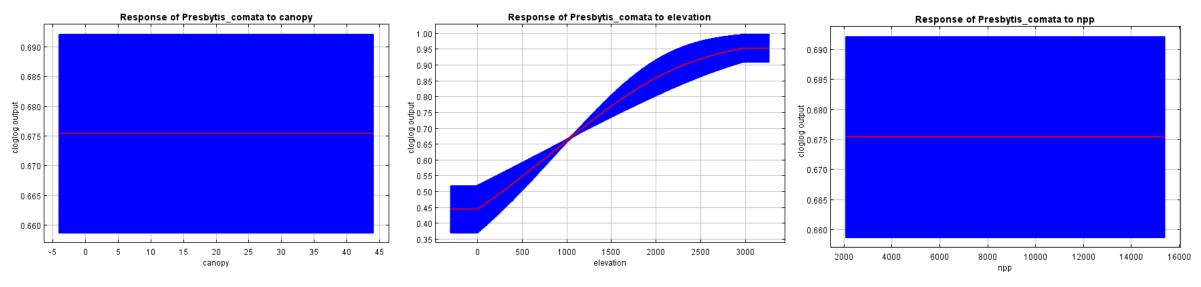


PREDICTED DISTRIBUTION





JACKNIFE AND RESPONSE CURVE







FURTHER READING

Yusri, S. V.P. Siregar, and Suharsono. In press. Using Publicly Available Remote Sensing Imageries, Oceanographic Models, and Species Occurrence to Predict the Distribution of Hard Coral (Scleractinia) Genera in Indonesia. Frontiers in Mar. Sci.

Yusri, S. E. Retnowati, M.P.S. Widodo, Idris, and Fakhrurrozi. In press. Combining Participatory Mapping, Cloud Computing and Machine Learning for Mapping Climate Induced Landslide Susceptibility in Lembeh Island, North Sulawesi. IOP Conf. Ser.

Yusri, S. V.P. Siregar, and Suharsono. 2019. Generating Biologically Relevant Environmental Data From Remote Sensing Imageries And Oceanographic Models To Support Spatial Prioritization Of Marine Biodiversity Conservation And Management In Indonesia. Prosiding Semnas Geomatika 2018.

Yusri, S. V.P. Siregar, and Suharsono. In press. Distribution Modelling of the Porites (Poritidae), in Indonesia. IOP Conf. Ser.