

Predictive Distribution Modeling as an Environmental Management Tool:

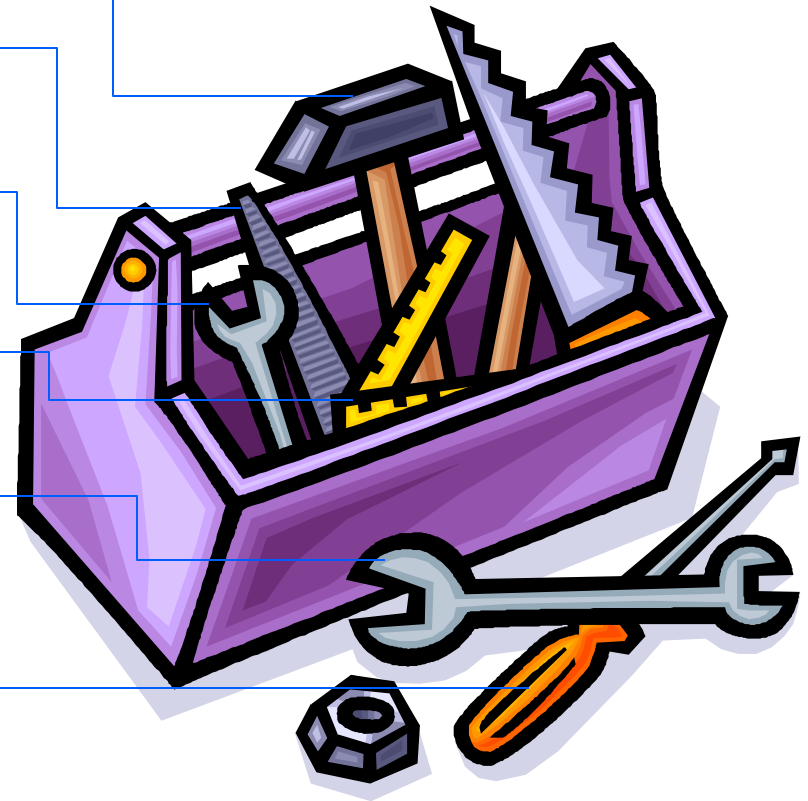
A Case Study of *Cherax quadricarinatus* in Jamaican Rivers



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Tools available to an Environmental Manager

- Quantitative Data
- Local Knowledge
- Past Experience
- Expert Opinion
- Simulated Models
- **SDMs**
- Etc.



Species distribution model (SDM)

(SDMs or 'ecological niche', 'environmental niche', 'habitat suitability' and 'bioclimate envelope' modeling)

A model which uses a species' observed distribution and/or biological characteristics to predict its actual (or potential) distribution

- **Observed** : range within which species has been sighted
- **Actual** : species' current distribution
- **Potential** : range within which the species could be found

Term is widespread but somewhat misleading since **it is actually the distribution of suitable environments that is being modelled, rather than the species' distribution per se**

Why model species distributions?

- Important component of conservation planning
- Improve our understanding of species-habitat relationships in space and time
- Predict patterns of biodiversity
- Identify areas of conservation significance
- **Predict species invasions and identify areas at risk**
- Identify suitable areas for reintroducing species
- Locating study sites.....etc

Determining Invasive Potential

- ⦿ Islands susceptible to invasion owing to small size and geographical isolation (see [Sax & Brown, 2000](#))
- ⦿ Jamaica - long history of species introductions (see [Espeut & Grant, 1990](#); [Mahon & Aiken, 1977](#))

Cherax quadricarinatus (redclaw crayfish)



Research Questions

- ① Which environmental variables are more important in the determination of redclaw distribution?
- ① Which of the modelling methods performed better at analysing redclaw distribution in the rivers selected?

Methodology

- ⊙ Statistical modeling (**Generalized Linear Model, GLM**)
 - Models the behavior of a random process
 - Utilizes samples of output data to construct a representation of the process
 - Predicts the future behavior of the process

Vs

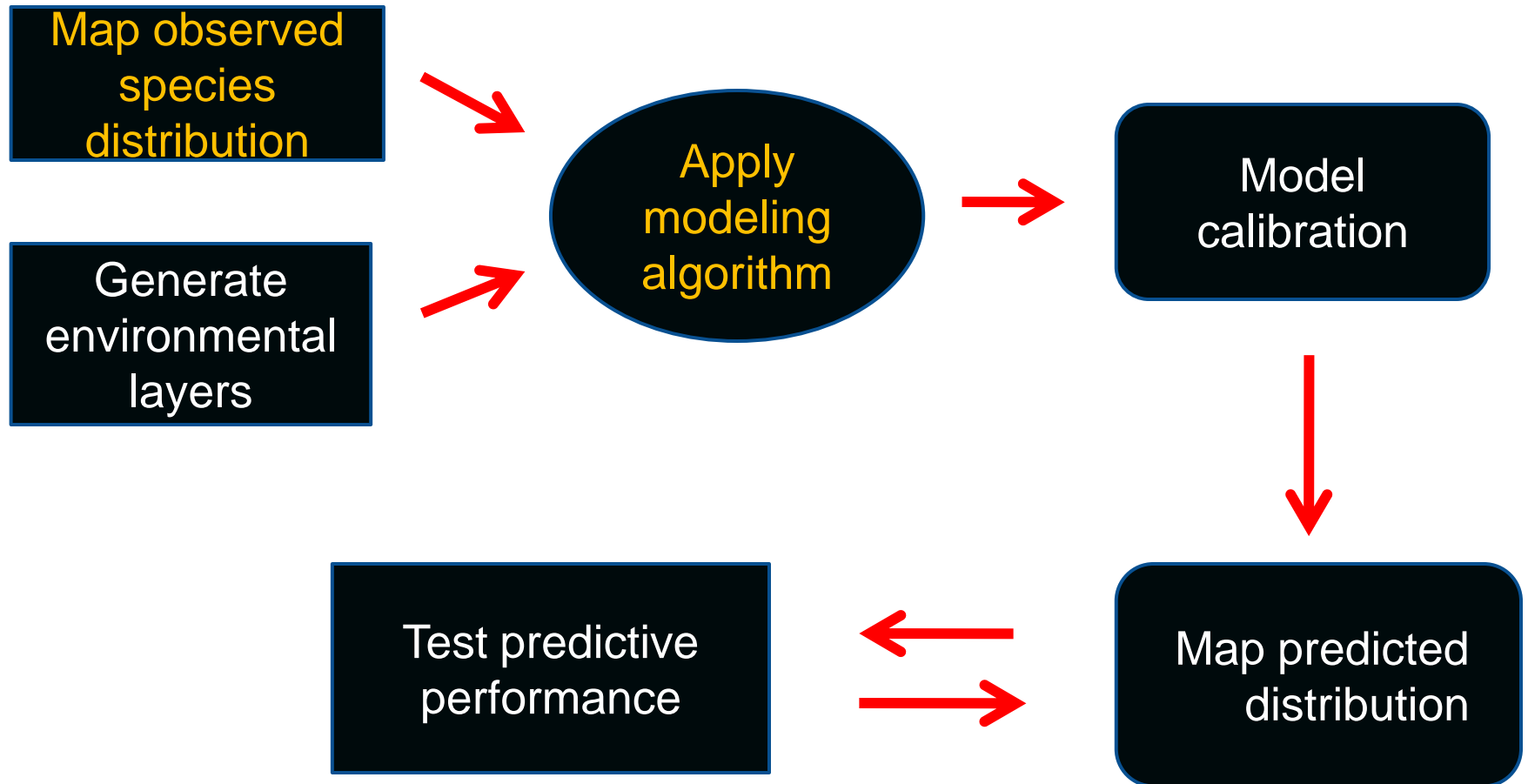
- ⊙ Maximum Entropy Models (**Maxent**)
 - A family of distributions within the class of exponential models for statistical modeling

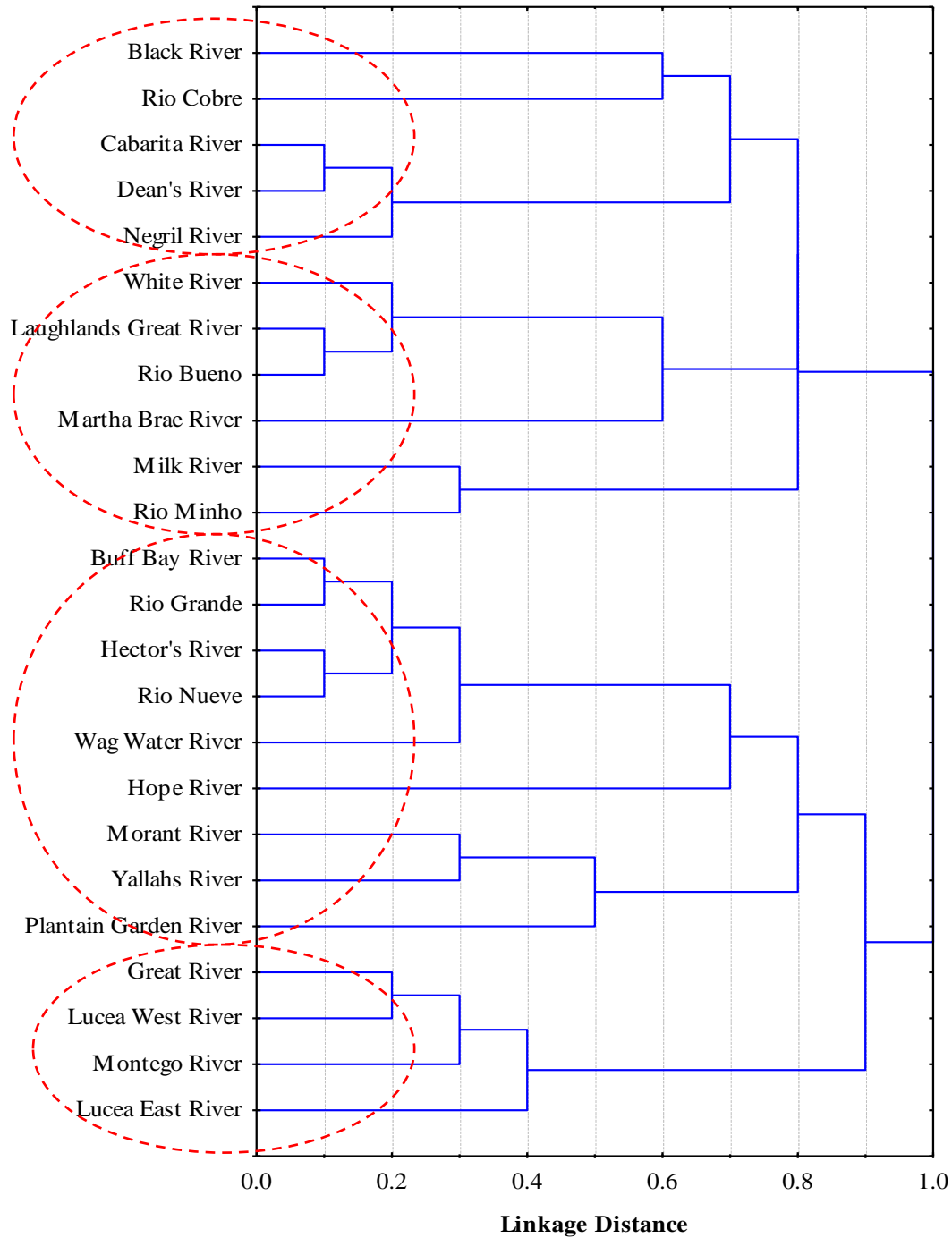
SDMs

Assume the following knowledge and skills:

1. **Ability to use GIS** (e.g. manipulate raster & ASCII files)
2. **Statistical skills**
3. **Understanding the ecological principles** of species' geographical range limits in order to carry out and interpret the modelling appropriately

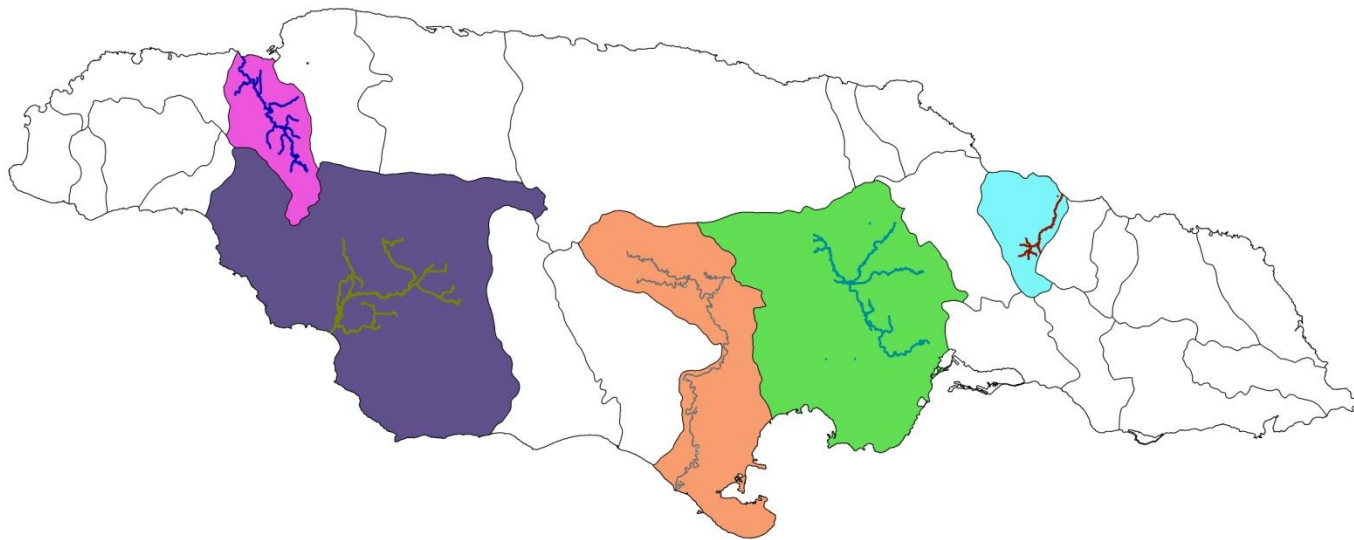
Logic flow for correlative SDMs





Linkage Distance

Sampled rivers in their respective watersheds



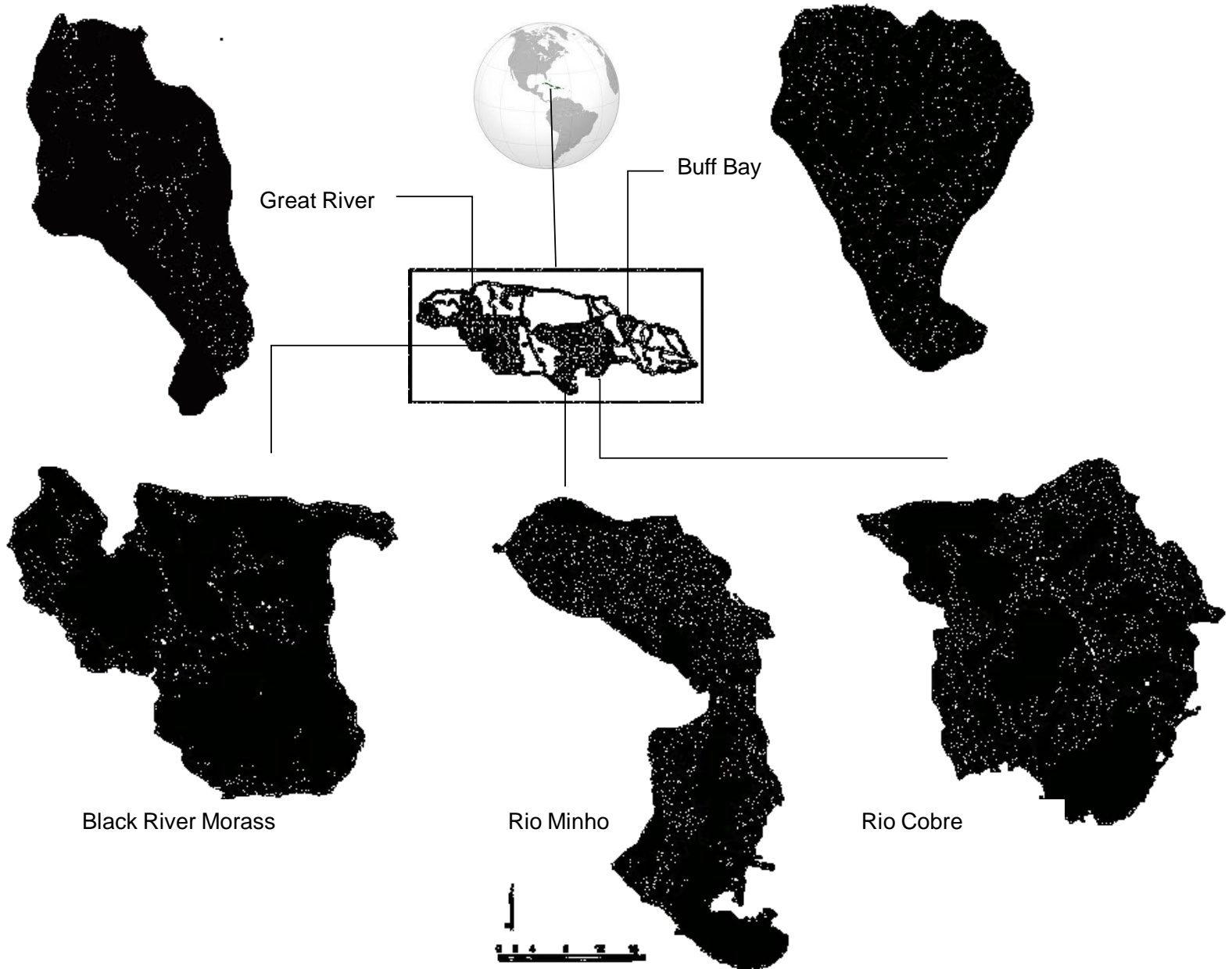
0 5 10 20 30 40
km



Water Shed

- Non sampled watersheds
- Black River
- Great River
- Rio Minho
- Buff Bay
- Rio Cobre

Model Sites



Physicochemical parameters used



- Total dissolved oxygen (mg L^{-1})
- Dissolved oxygen (% saturation)
- pH
- Conductivity ($\mu\text{S cm}^{-1}$)
- Redox potential/ORP
- Temperature ($^{\circ}\text{C}$)
- Flow rate (m/s)
- Salinity (pps)
- Turbidity
- Hardness (mgCaCo_3)
- Nitrates
- Water velocity (ms^{-1})
- Water depth (m)

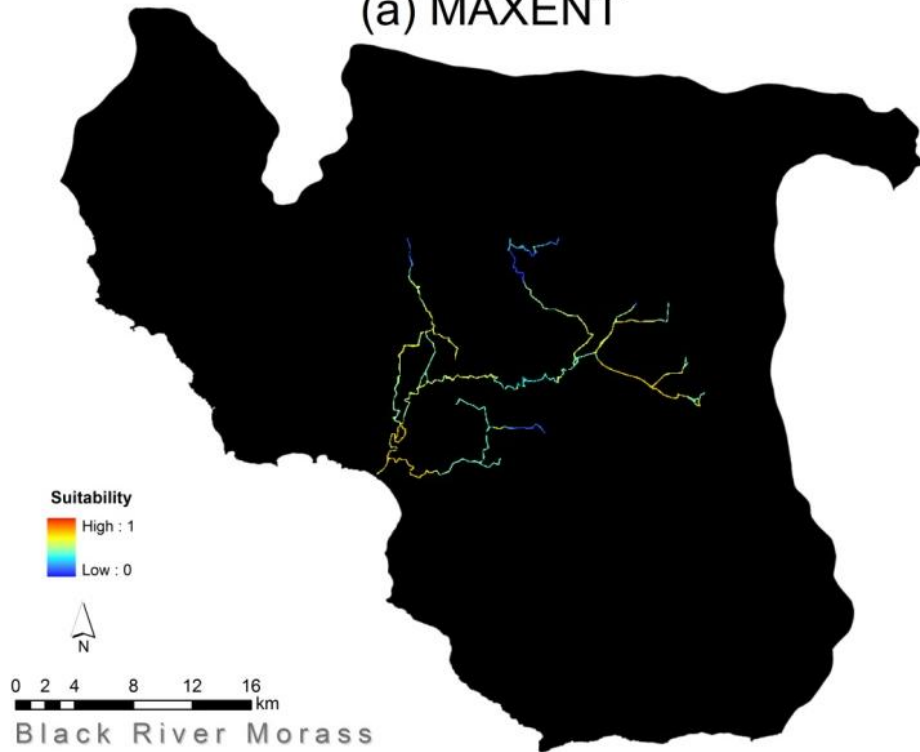


- Elevation (m)
- Climate
- Hydrogeology
- Soil texture

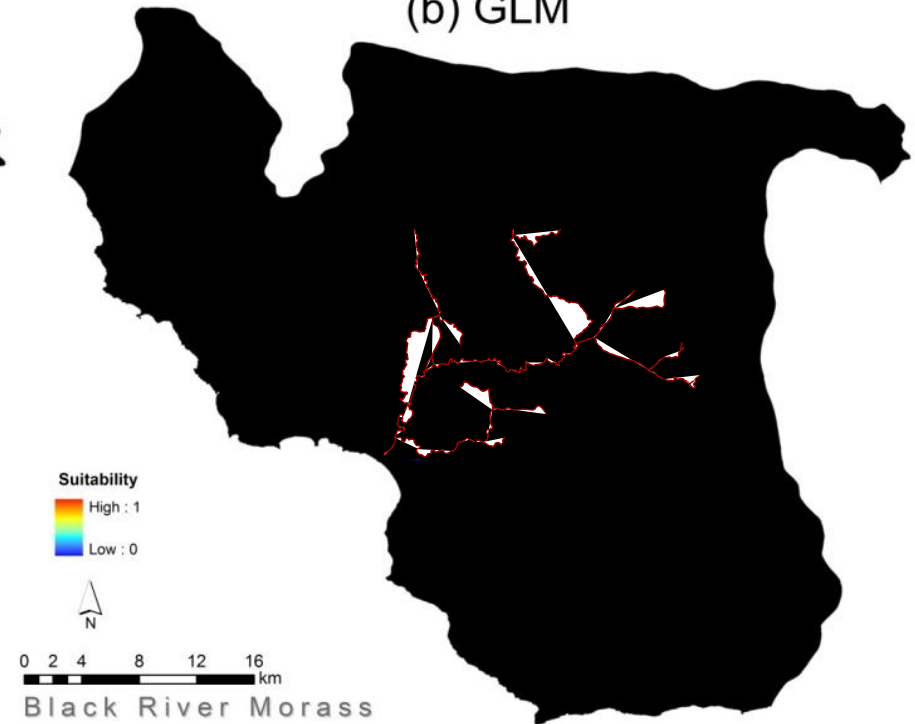
Results

Predictive models of *Cherax quadricarinatus* distribution in the Black River

(a) MAXENT

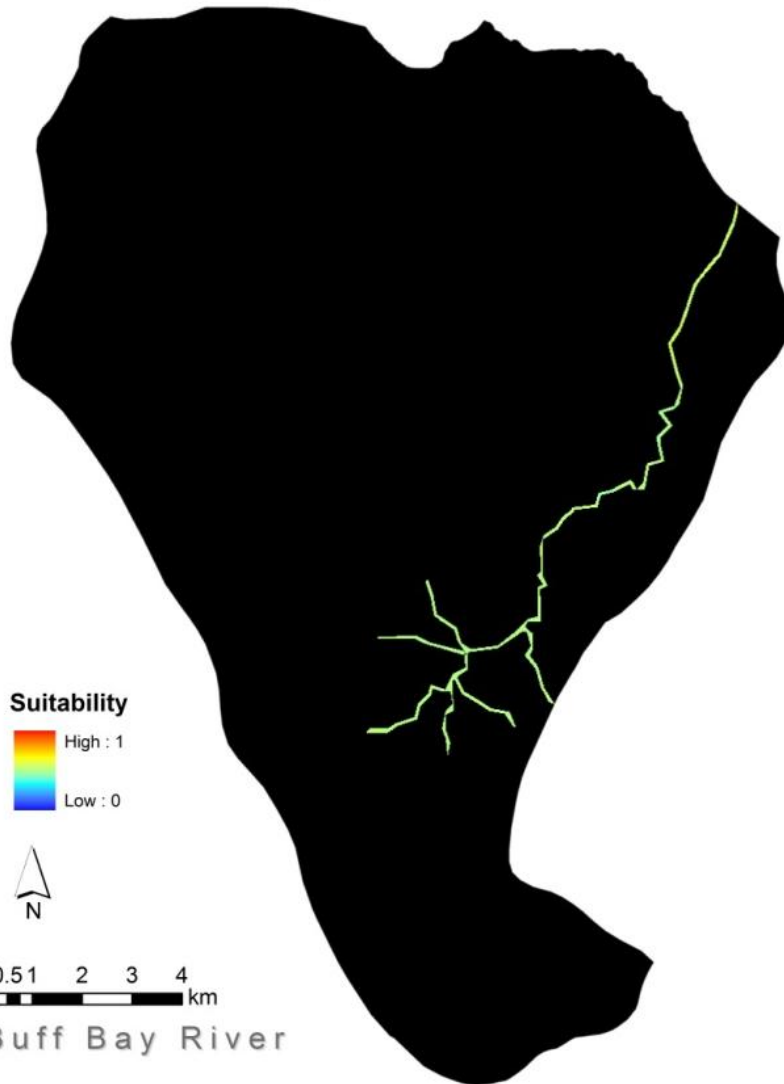


(b) GLM

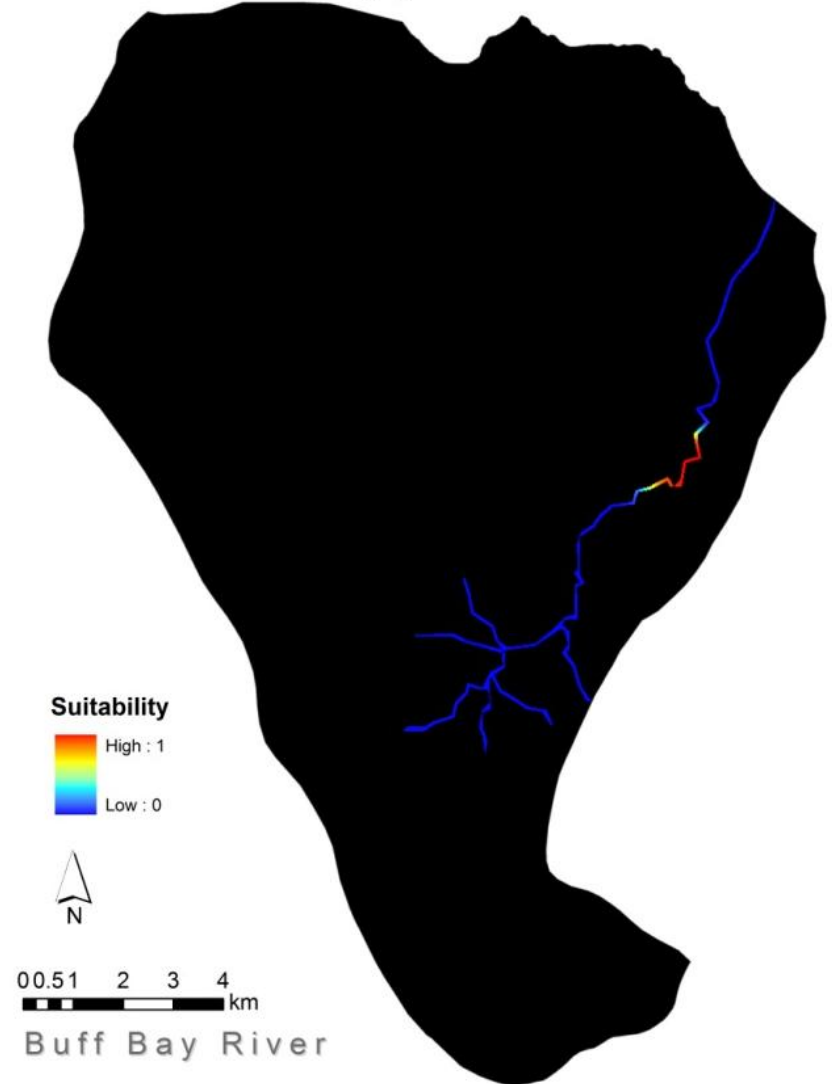


Predictive models of *Cherax quadricarinatus* distribution in the Buff Bay River

(a) MAXENT

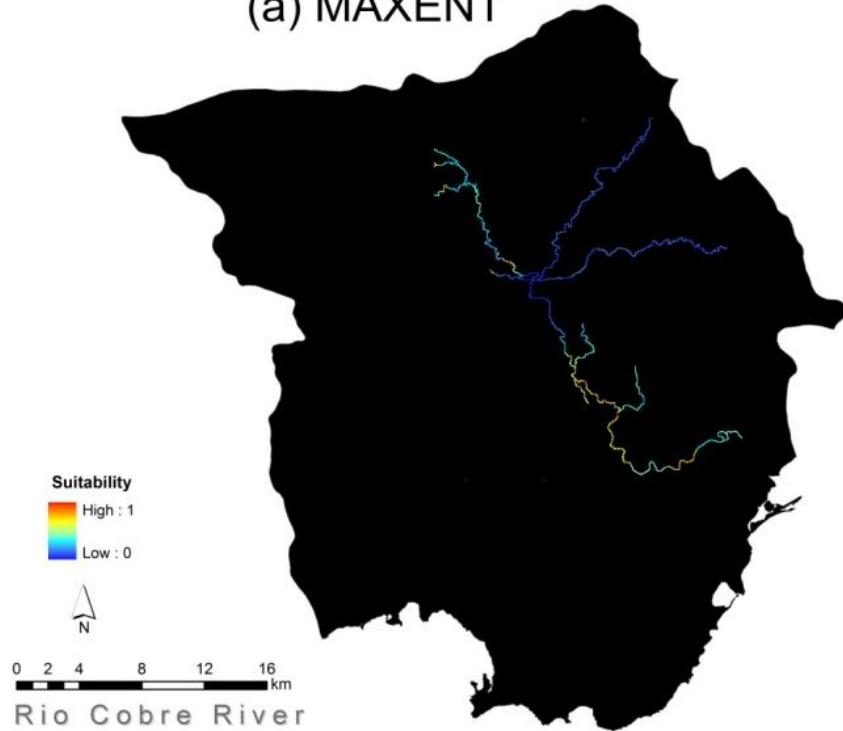


(b) GLM

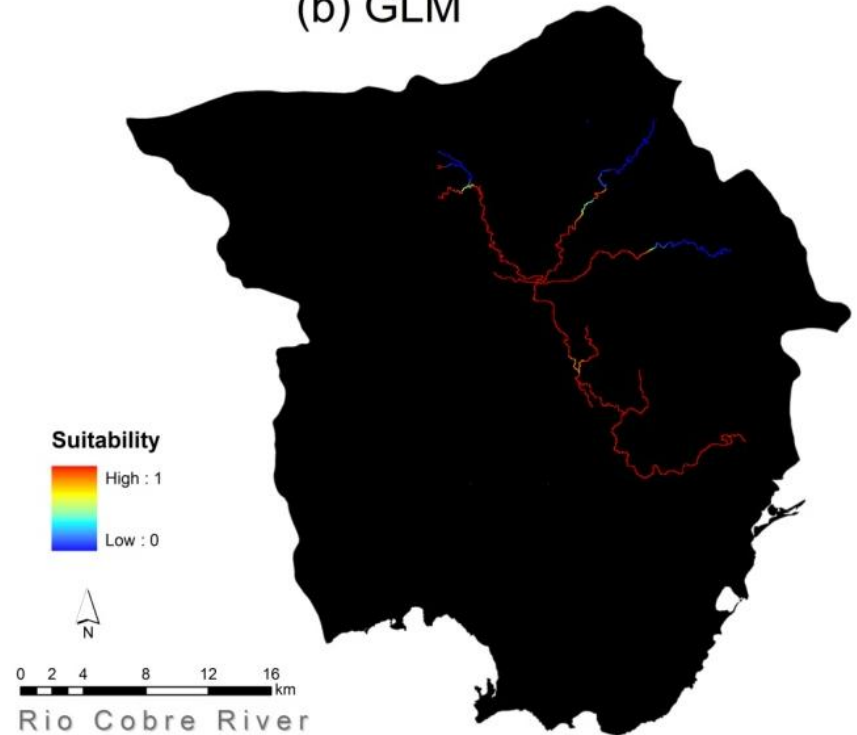


Predictive models of *Cherax quadricarinatus* distribution in the Rio Cobre

(a) MAXENT

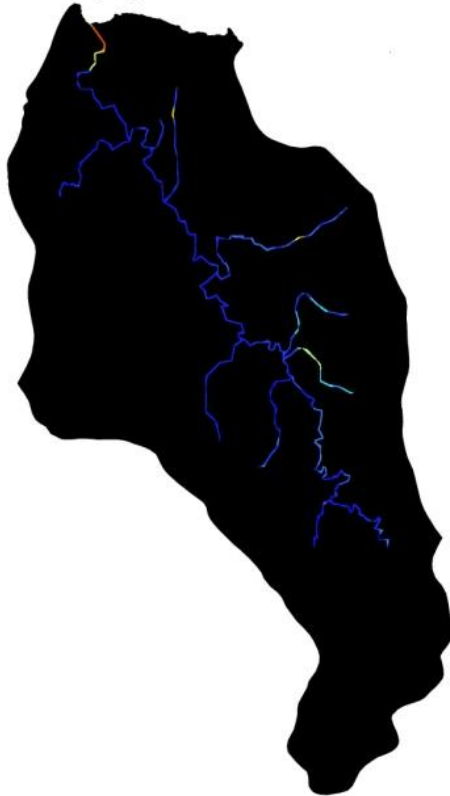


(b) GLM

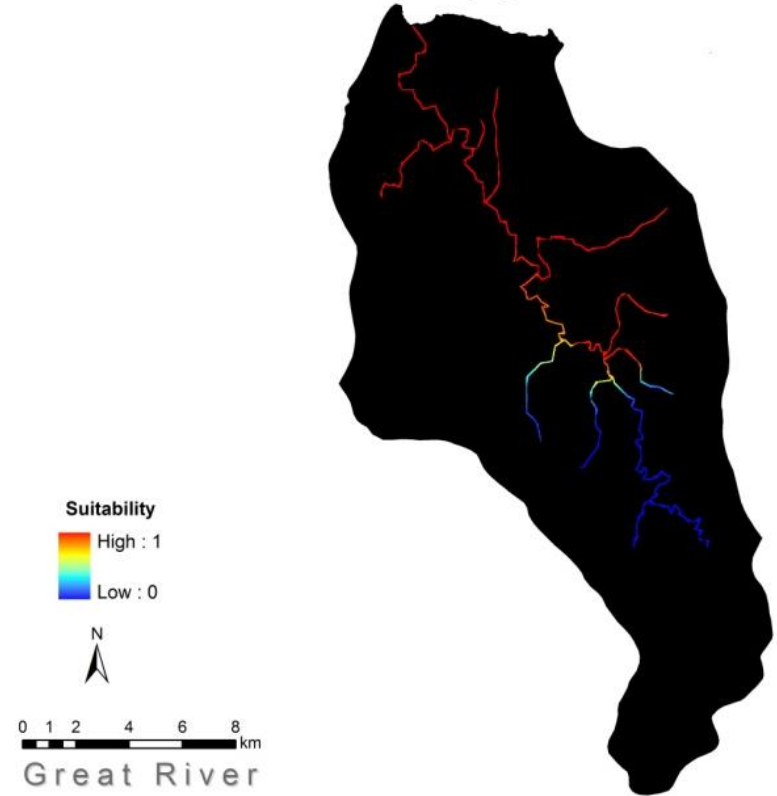


Predictive models of *Cherax quadricarinatus* distribution in the Great River

(a) MAXENT



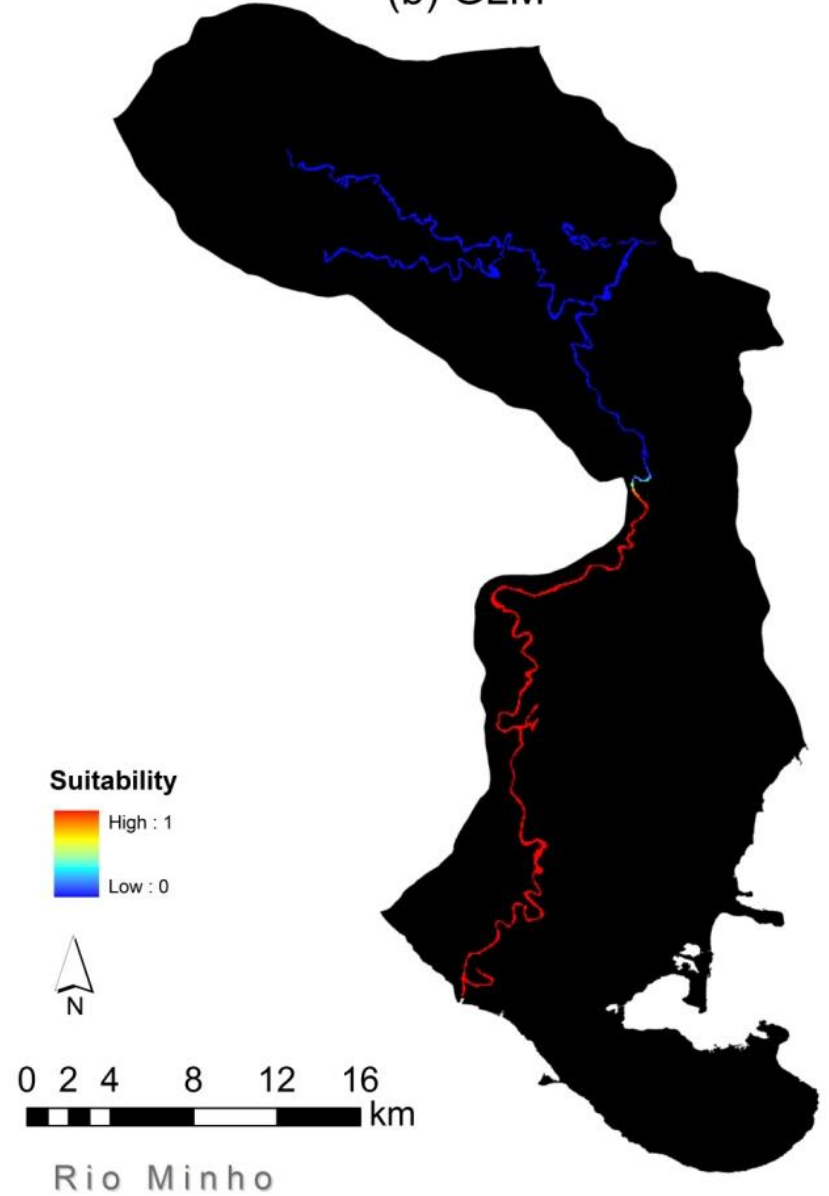
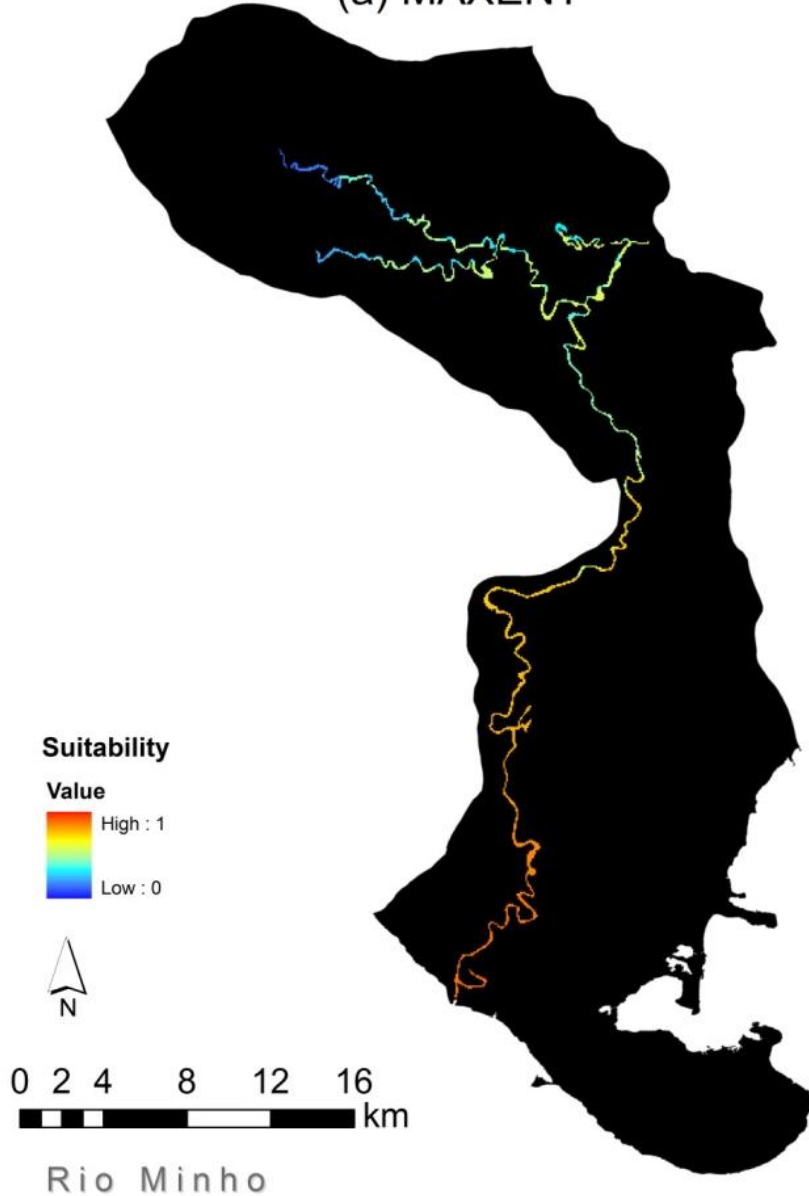
(b) GLM



Predictive models of *Cherax quadricarinatus* distribution in the Rio Minho

(a) MAXENT

(b) GLM



Habitat Suitability

- ① The red-claw has wide tolerance limits with respect to water quality
- ① Hydrogeology and soil texture, water velocity, elevation and nitrate most important predictors
- ① Irrespective of the classification, it appears that all Jamaican rivers are vulnerable to invasion by *Cherax quadricarinatus*

Classification useful in predicting the extent of the distribution of crayfish throughout river

- Low gradients and altitude - South and South-Western rivers vulnerable along entire lengths
- North-western, North-central and South-central rivers vulnerable at lowland stretches and close to coast
- North-eastern rivers least suitable

SDMs for Invasive Species

Applications

- ⦿ Risk assessment
- ⦿ Pre-screening for proposed introduced species

Challenges

- ⦿ Baseline data availability
- ⦿ Data quality
- ⦿ Adoptability
(Interpreting results for management & policies)

General Model Shortfalls

- ⊙ A premise of SDMs is that the species is in equilibrium with its environment (Elith & Graham, 2009)
 - Difficult to ascertain for invasive species
- ⊙ Does not deal with confounders
- ⊙ “*Garbage in garbage out*”
- ⊙ Model performance based on computed statistics (ROC, AUC, Kappa, etc)

Acknowledgments

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- ⦿ Water Resources Authority
- ⦿ Forestry Department

References

- Sax, D.F. & Brown J.H., 2000. The paradox of invasion. *Global Ecology & Biogeography*. 9: 363-371.
- Elith, J. & Graham C.H., 2009. Do they? How do they? Why do they differ? On finding reasons for differing performance of species distribution models. *Ecography*. 32: 66-77
- Espeut P.S., & Grant S., 1990. An economic and social analysis of small scale fisheries in Jamaica. 240pp. FAO. Jamaica.
- Mahon, R & Aiken K., 1977. Establishment of North American Bullfrogs, *Rana catesbeiana* (Amphibia, Anura, Ranidae) in Jamaica. *Journal of Herpetology*. 11: 197-199.

Thank you!

