



Modeling and Controlling the Spread of Invasive Species over Heterogeneous Landscapes

Julio Barragán-Arce¹, Wilfredo Robles²,
Iván Henríquez³, William Camacho³, Yetsabel Auccaille³

¹ Department of Agricultural Economics and Rural Sociology, University of Puerto Rico, Mayagüez Campus, P.O. Box 9000, Mayagüez PR 00681, mariojulio.barragan@upr.edu

² Department of Crop and Environmental Sciences, University of Puerto Rico, Mayagüez Campus

³ Department of Mathematics, University of Puerto Rico, Mayagüez Campus



Modelling the Spread of Invasive Species



Why did *Melaleuca* thrive in FL wetlands but not in those of PR?



Melaleuca

Major problem in PR

Not in FL

... and yet

Mimosa pigra

Major problem in PR

Why?





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Different Spreading Strategies



Melaleuca

Floats

Mostly downhill

Mimosa pigra

Clings

Can move up or downhill

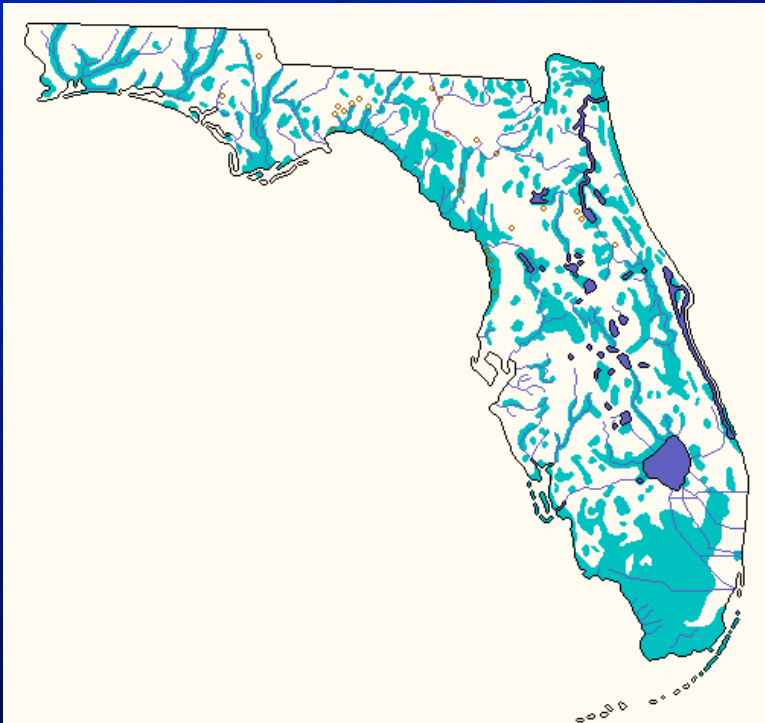




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Different Kinds of Wetlands

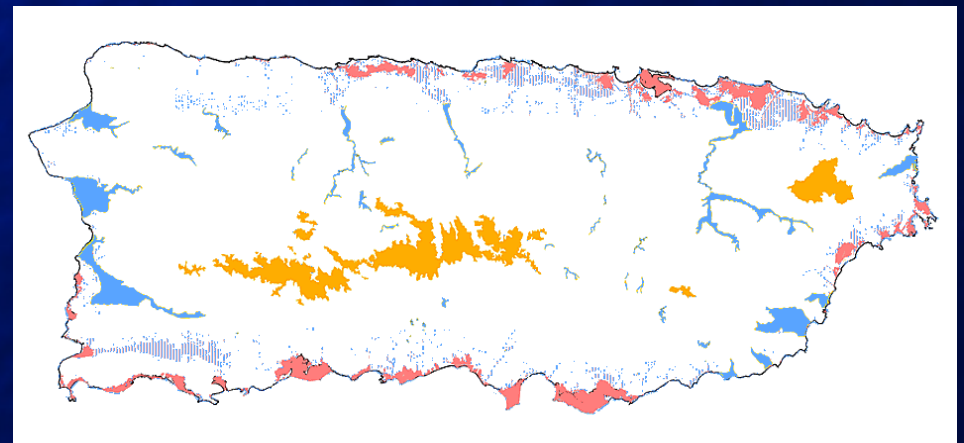


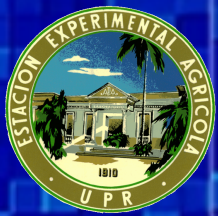
Florida

Contiguous

Puerto Rico

Patchy

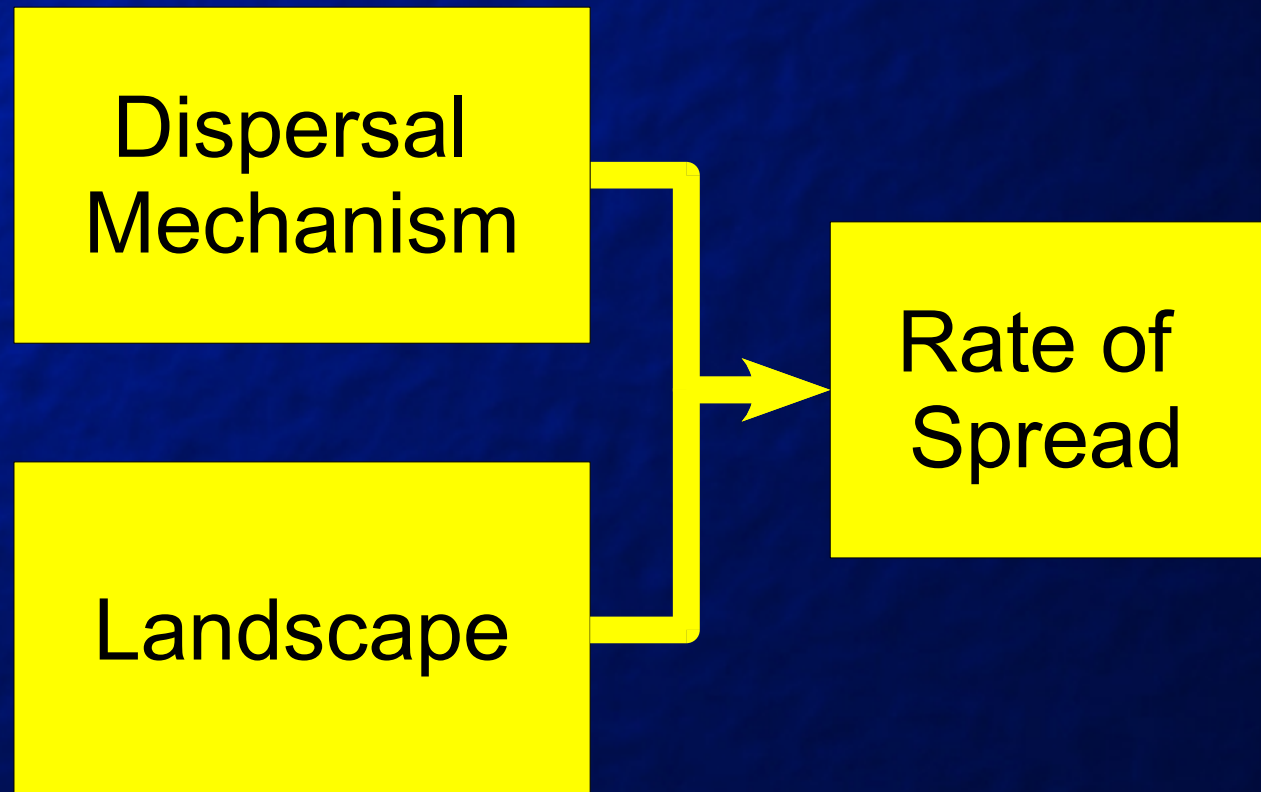




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Relations



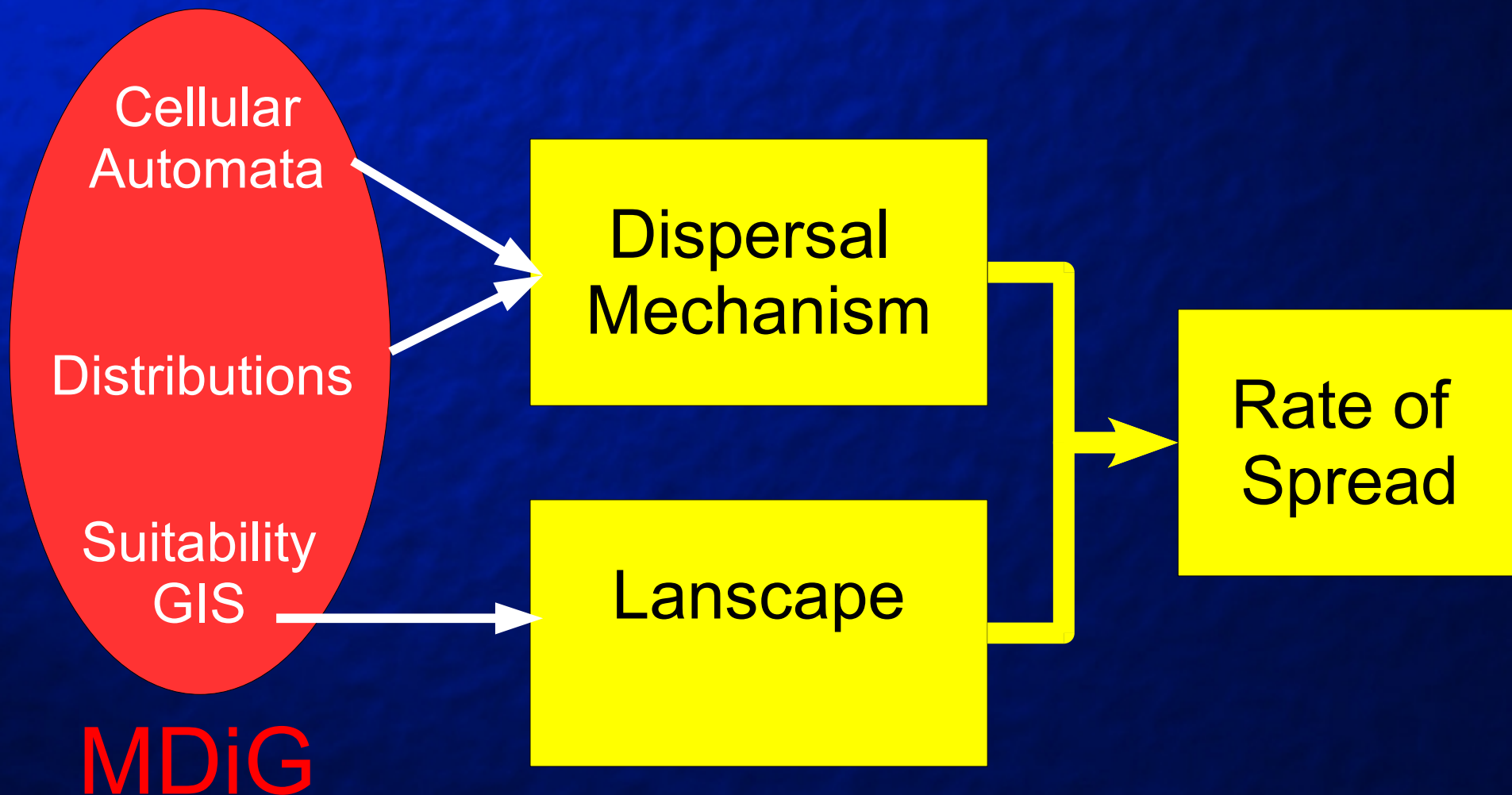


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Tools

Relations





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Cellular Automata to Model Diffusion

1. Presence/absence model
2. The state of each cell in period $t+1$ depends on the state of its neighboring cells in period t

0	1	0
1	1	1
0	1	0



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Distributions to Model Long-Distance Dispersal

1. Could have used coarser CA instead, followed by finer CA
2. Here, for each cell, three consecutive draws are made from the following distributions:
 1. **Poisson** to get the number of **LDD events**
 2. **Uniform** to get the **direction**
 3. **Cauchy** to get the **distance**



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GIS / Suitability Maps to Model Landscape

1. Each cell is assigned a number from 0 to 1 depending on how suitable it is for the species
2. These numbers are obtained by constructing a **suitability map**
3. In each occupied cell at time t , the likelihood of **survival** at time $t+1$ is assessed



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Simulating a Presence/Absence map for $t+1$

1. Start with presence/absence map for t
2. Run CA module
3. Run LDD module
4. Run Survival module
5. The resulting map is our simulated Presence/Absence map for period $t+1$

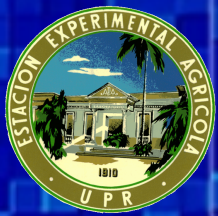


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Key Tasks

1. Compute suitability maps
2. Estimate model parameters
3. Obtain initial presence/absence for base year
4. Calibrate the model
5. Monte Carlo exercises
6. Policy scenarios
7. Write module for other spread mechanisms



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Where are we now?

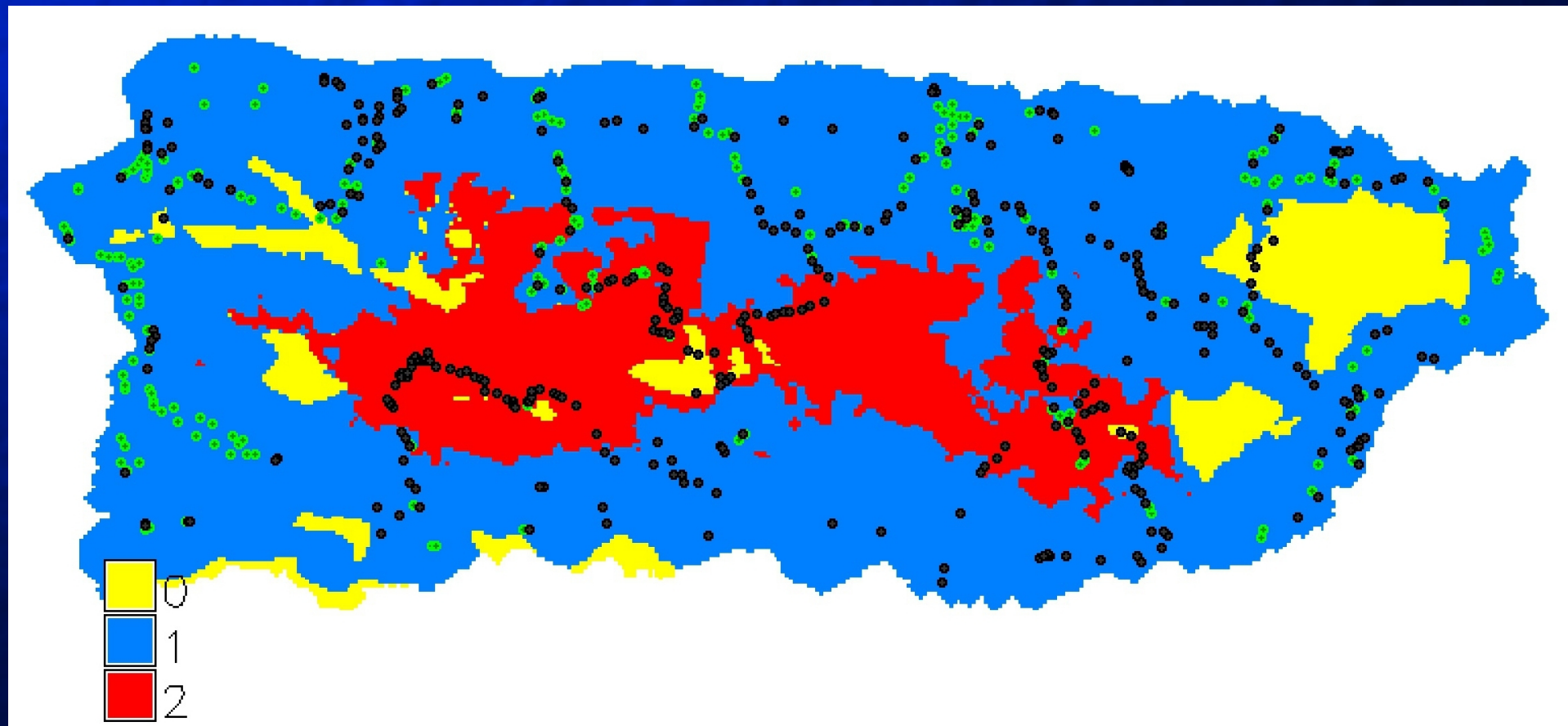
1. Collecting maps
2. Collecting presence/absence data
3. Learning ArcGIS and GRASS
4. First attempts at suitability maps using Temperature and precipitation
 1. Expert index based
 2. Statistical



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Expert Based Index / GRASS





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Statistical Based / ArcGIS

1. Logistic regression of presence/absence on minimum temperature, maximum temperature, and precipitation

Coefficients:

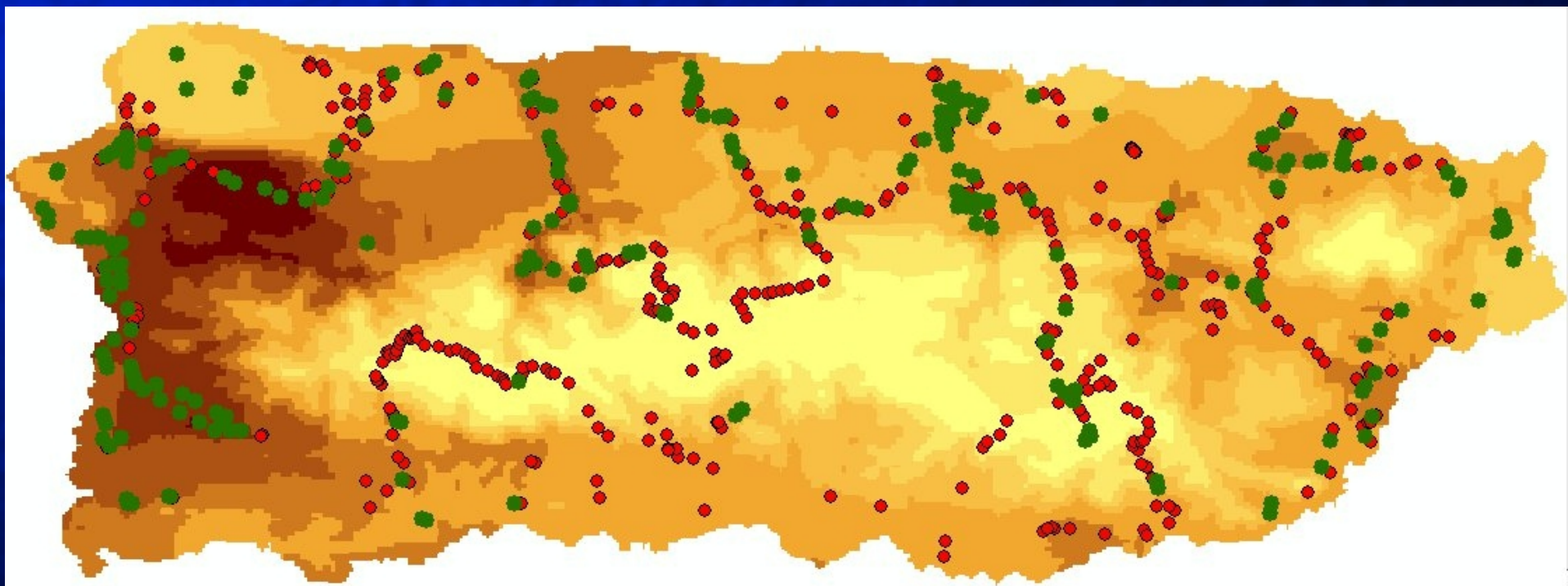
	Estimate	Std. Error	z value	Pr(> z)	
(Intercept)	-2.080e+01	2.680e+00	-7.761	8.44e-15	***
tempmin	-9.768e-04	6.911e-04	-1.413	0.1575	
tempmax	7.033e-03	8.919e-04	7.885	3.14e-15	***
precip	6.969e-06	3.228e-06	2.159	0.0308	*



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Statistical Based / ArcGIS





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Suitability Map – To Dos

1. Include other layers (e.g. wetlands)
2. Deal with sampling issues (nonrandom sampling, presence only)
3. Deal with statistical issues (Spatial correlation)
4. Introduce some index of model fit
5. Try other alternatives (algorithmic approaches)



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