# Optimal Temporal-Spatial Control of an Invasive Species over a Heterogeneous Landscape: Exploratory exercises for the case of *Mimosa*pigra in Puerto Rico

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# Acknowledgements

This material is based on research supported by USDA/NIFA
 Grant No. 2010 – 34135 – 21021 inTropical/ Subtropical
 Agriculture Research.

#### Introduction

- Invasive species move over time and space
- Not all space is suitable for the survival of an invasive species
- Suitable space has certain geometric and topological properties

#### Objective

We want to see how the characteristics of the space that is suitable for an invasive plant *Mimosa pigra* and the spatial location and dispersal pattern of the species can affect its optimal control.

### **Approach**

- We tried Dynamic Programming but the dimension of the problem was overwhelming.
- We decided to use instead Integer Programming along the lines of Epanchin et al. (2011).

#### Model

$$\operatorname{Min} \sum_{t \in T, t > 0} \beta_t * \left( \sum_{(i,j) \in C} x_{(i,j,t)} * d + \sum_{(i,j) \in C} y_{(i,j,t)} * e + \sum_{(i,j,k,l) \in N} z_{(i,j,k,l,t)} * b \right)$$

#### Subject to

$$x_{(i,j,t)} \geq x_{(i,j,t-1)} - y_{(i,j,t)}$$
 remains invaded  $x_{(i,j,t)} \geq x_{(k,l,t-1)} - z_{(i,j,k,l,t)} - y_{(i,j,t)}$  invaded if invaded neighbor

#### where:

x: State of cell d: Damage cost (per cell per time period)

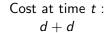
y: Eradication policy e: Eradication cost

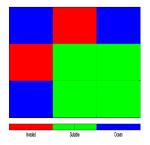
z: Barrier policy b: Barrier cost

 $\beta_t$ : Discount factor

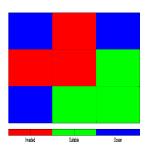


# Damage Cost

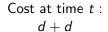


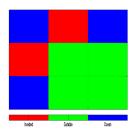


# Cost at time t+1: d+d+d

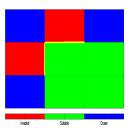


#### Barrier Cost



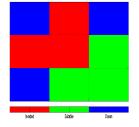


# Cost at time t + 1: d + d + b + b

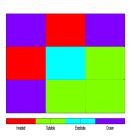


#### **Eradication Cost**

Cost at time 
$$t$$
:  $d + d + d$ 

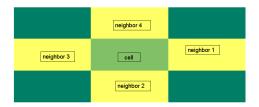


Cost at time 
$$t + 1$$
:  $d + d + e$ 



### Dispersion

If *cell* were invaded at time t, then neighbor cells 1, 2, 3, and 4 would be invaded at time t+1.



# Suitability map

We start with suitability map for Mimosa pigra (Barragán et al.)

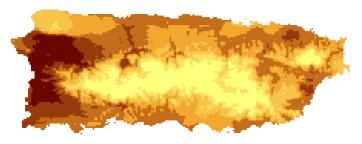
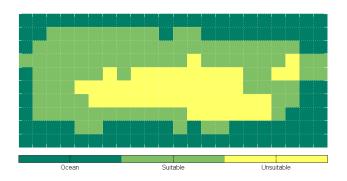


Figure : Probability of presence

# Suitable Space C

A grid on of square cell over which the invader could spread, bounded by the sea and the mountains (unsuitable).

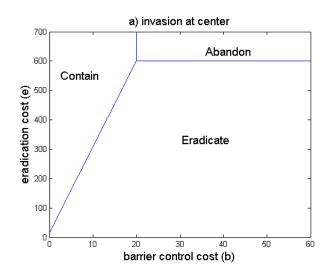


#### Exploratory exercise

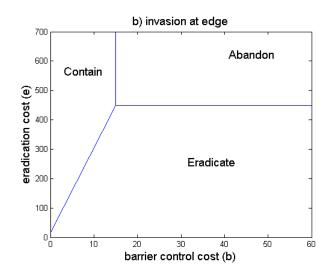
#### **Scenarios**

- At the center, at an edge, and at a corner of the landscape.
- For different barrier and eradication control costs.

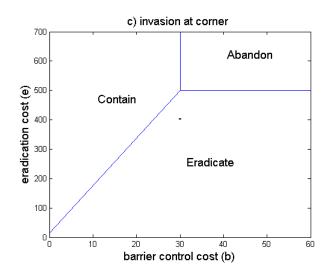
### Control strategies for center cell invasion



### Control strategies for edge cell invasion



### Control strategies for corner cell invasion



# Corner cell invasion (with e >> b)

# Center cell invasion (with e >> b)

# Edge cell invasion (with e >> b)

# Erradication cost greater than barrier cost $(e \gg b)$

Here optimal control strategy is to contain with barriers.

#### When we increase barrier cost

Here optimal control strategy is to eradicate.

#### When both barrier and eradication costs are high

Here optimal decision is to abandon control.

#### Conclusions

- Other things equal, we saw that corner invasions are easier to contain, while center invasions are easier to erradicate.
- Low barrier costs will result in containing invasion, low eradication costs will result in eradication, and high controls costs (barrier and eradication) will result in abandoning invasion.

# Suggestions

Some ideas we would like to try next:

- Increase number of cells.
- estimate real control and eradication costs for *Mimosa pigra*.