



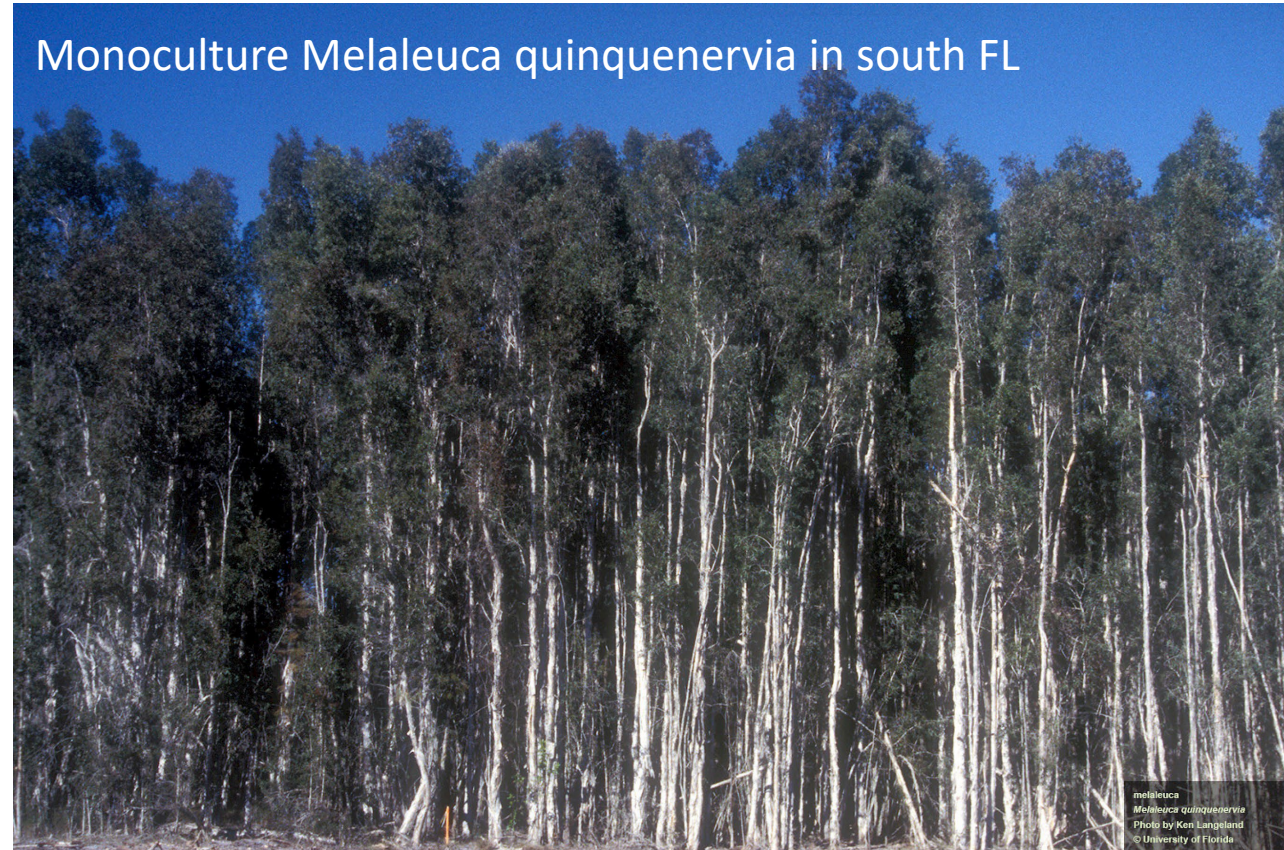
Improving Biocontrol in Invasive Species: Agent-Based Model Insights

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University of Florida

- ❖ Background: who, where and why
- ❖ Objectives: what we are interested in
- ❖ Methods: Agent-Based Model
- ❖ Results: why they're helpful
- ❖ Conclusion



Who, where and why



Melaleuca quinquenervia

melaleuca
Melaleuca quinquenervia
Photo by Ann Murray
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South Florida

Fire helps melaleuca spread
by dispersing more seeds.
Photo by Randall Stocker
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melaleuca
Melaleuca quinquenervia
Photo by Ann Murray
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Background	Objectives	Methods	Results	Conclusion
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Who, where and why



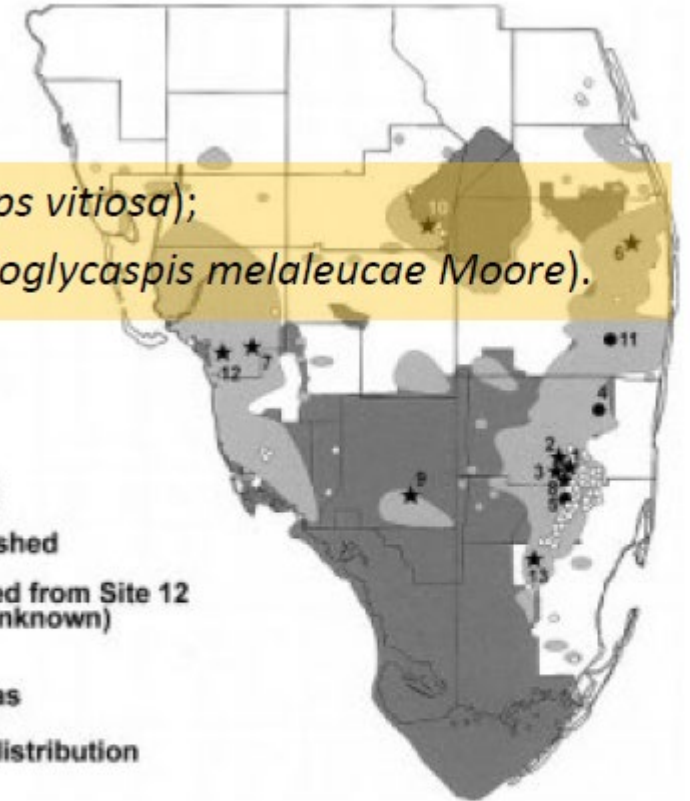
Herbicides applied to melaleuca using the "frill-and-girdle" technique. Application areas are dyed blue.

Bio-control

- 1997: Australian weevil (*Oxyops vitiosa*);
- 2002: Melaleuca psyllid (*Boreioglycaspis melaleucae* Moore).



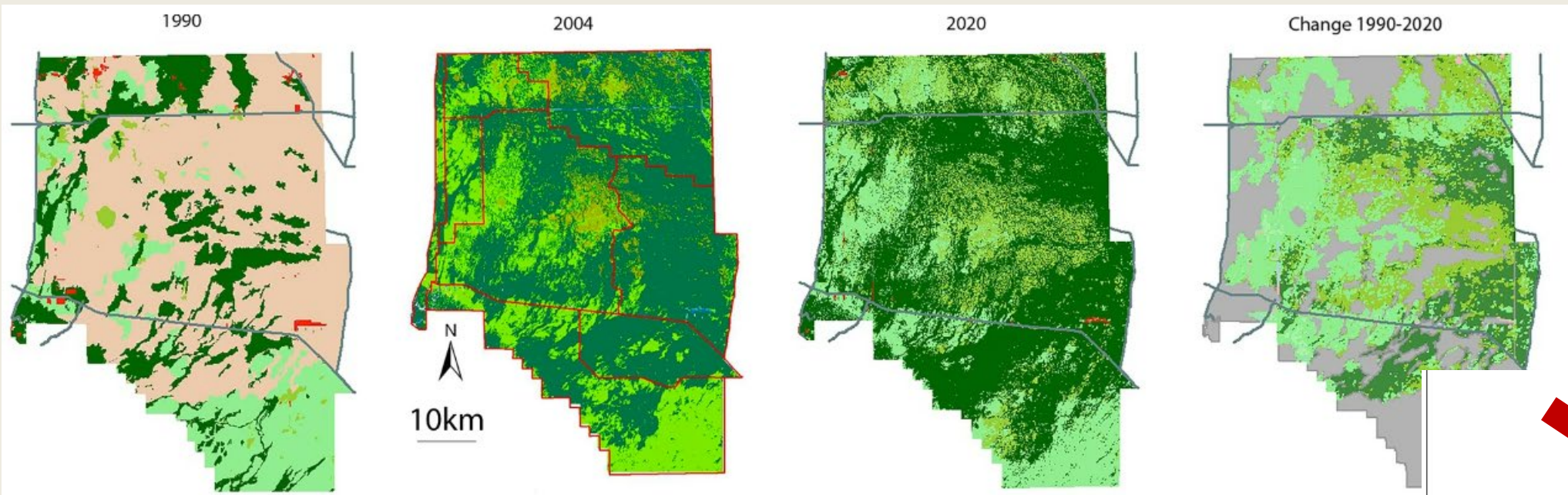
- ★ Established
- Non-established
- Redistributed from Site 12 (status unknown)
- Natural areas
- Melaleuca distribution



3.3 million individual biological control agents
407 locations
15 Florida counties

Background	Objectives	Methods	Results	Conclusion
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Effective control outcomes

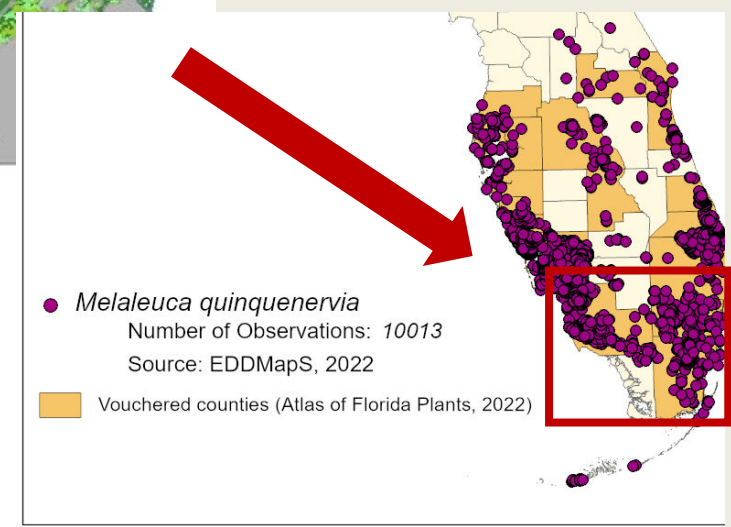


Generalized vegetation cover

- Water
- Anthropogenic
- melaleuca
- Prairie
- Upland forest
- Wetland forest

Vegetation change

- Other
- melaleuca to water
- melaleuca to anthropogenic
- melaleuca to melaleuca
- melaleuca to prairie
- melaleuca to Upland forest
- melaleuca to Wetland forest



● *Melaleuca quinquenervia*
 Number of Observations: 10013
 Source: EDDMapS, 2022
 Vouchered counties (Atlas of Florida Plants, 2022)

(Smith et al., 2023)

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Previous model version

Agent-based modeling of competition of *Melaleuca quinquenervia* and hardwood hammock has been studied using the model ManHam (Lu et al. 2022, 2023).

- Basic structure of model
- Major results

Lu, Y., DeAngelis, D.L., Xia, J. and Jiang, J., 2022. Modeling the impact of invasive species litter on conditions affecting its spread and potential regime shift. *Ecological Modelling*, 468, p.109962.

Lu, Y., Xia, J., Magee, L.J. and DeAngelis, D.L., 2023. Seed dispersal and tree legacies influence spatial patterns of plant invasion dynamics. *Frontiers in applied mathematics and statistics*, 9, p.1086781.

Background	Objectives	Methods	Results	Conclusion
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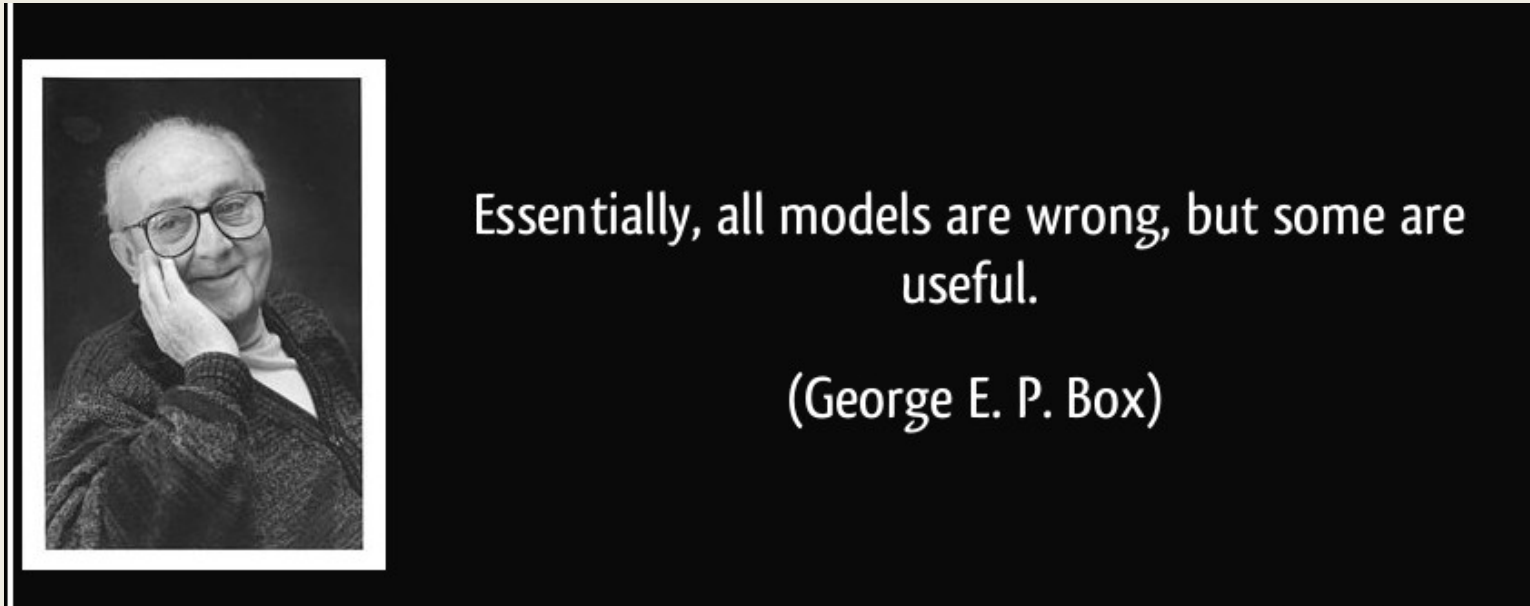
Objectives



- How can my model be made more realistic?
- Can the model be used to improve the way that biocontrol is applied to Melaleuca?

Background	Objectives	Methods	Results	Conclusion
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Agent-Based Model



- An initial distribution of native trees and a few invaders can be set.
- Growth, competition, litterfall and, when mature, seed dispersal, for each tree are followed.
- New saplings enter through stochastic simulation, depending on local litter and light conditions where seeds have fallen.
- Tree mortality depends on several factors, including chronic slow growth and density dependent.

(Lu et al., 2022)

Background	Objectives	Methods	Results	Conclusion
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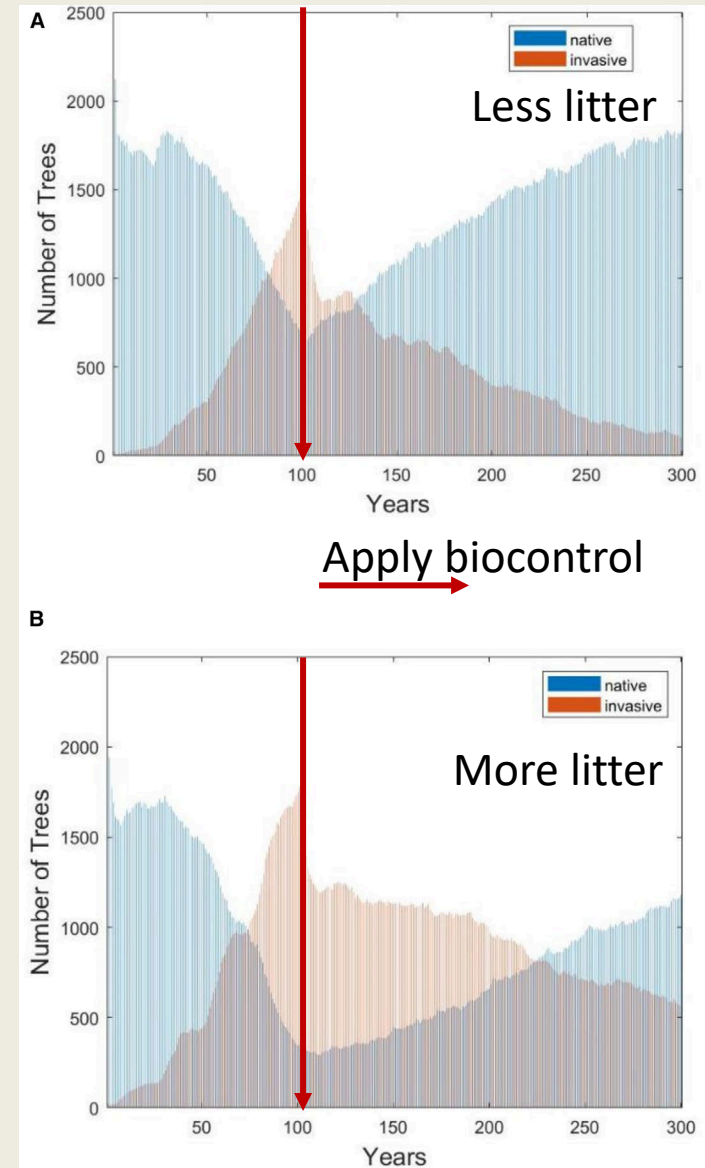
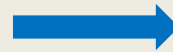
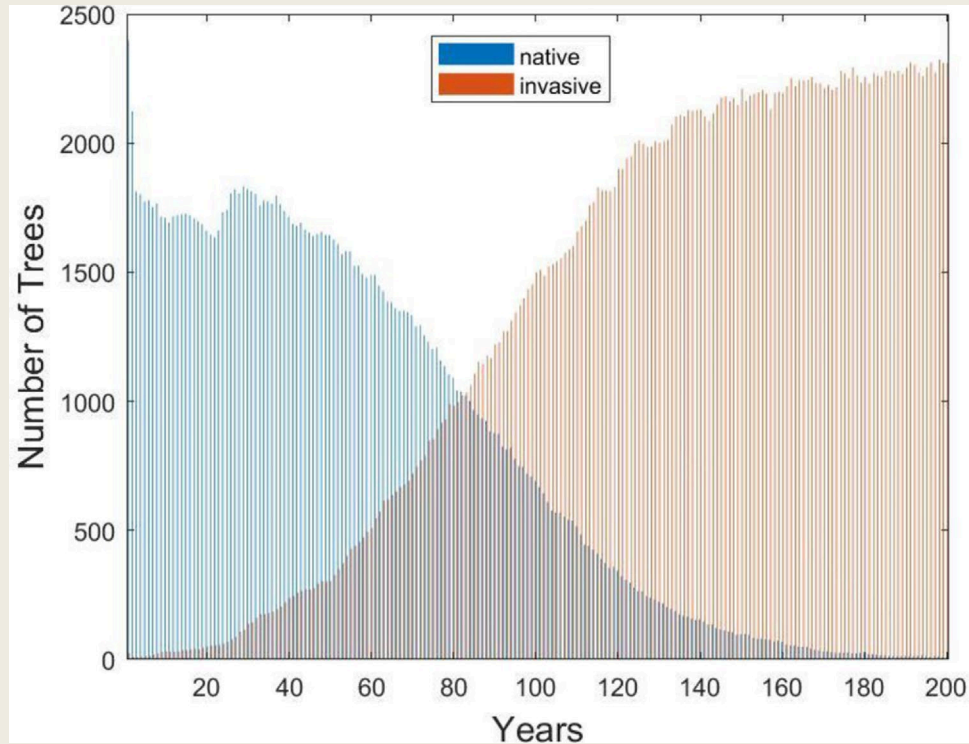
Previously in Lu et al., 2022...



→ Reductions of **growth** rate
And **birth rate** of 80%

Background	Objectives	Methods	Results	Conclusion
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Previously in Lu et al., 2022...

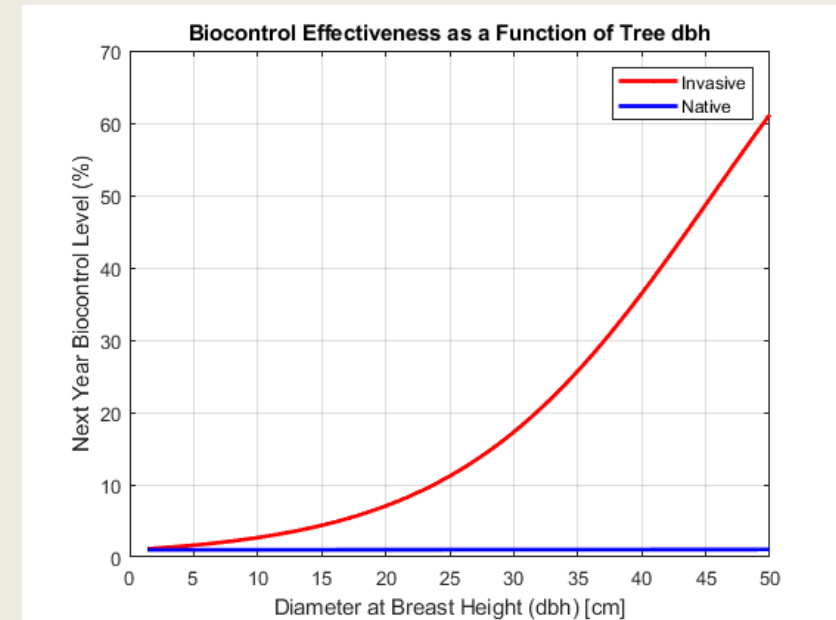
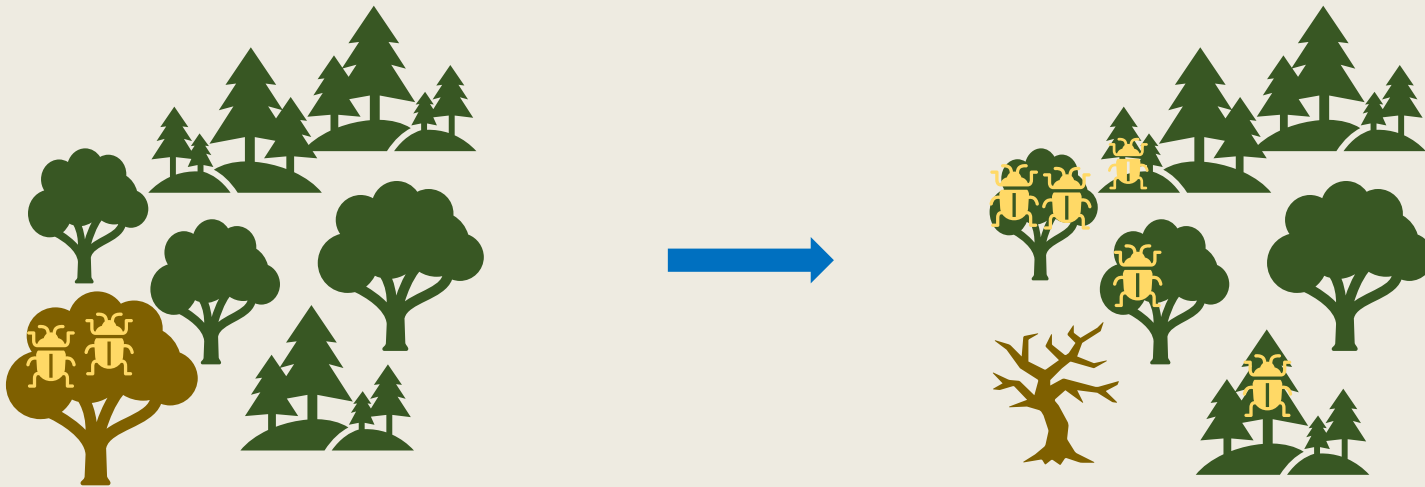


(Lu et al., 2022)

Background	Objectives	Methods	Results	Conclusion
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Biocontrol 2.0 beta

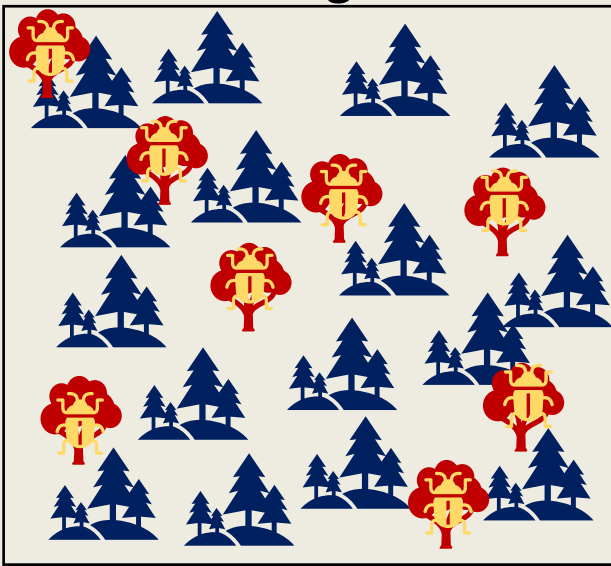
- Biocontrol causes NO harm to native species.
- Biocontrol accumulates more in invasive species.
- Larger dbh facilitates longer dispersal distance of biocontrol agents.
- Higher levels of biocontrol, lower reproduction rates.
- Higher levels of biocontrol, higher mortality rates.



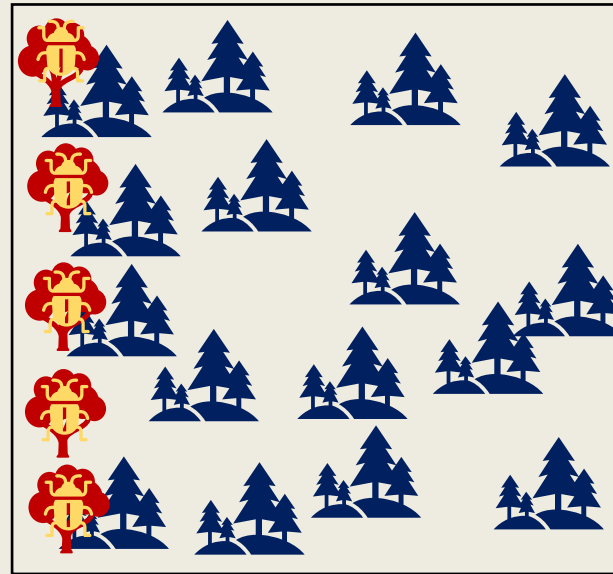
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Biocontrol 2.0 beta

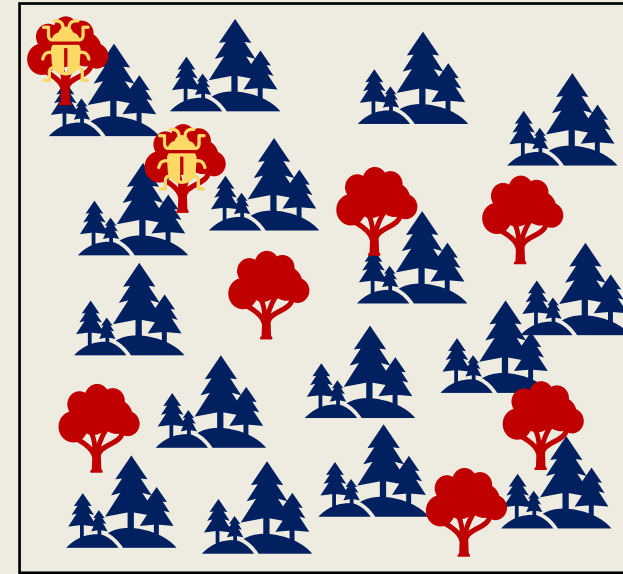
- Biocontrol measures kick in 65 years after the invasion begins.
- **Scenario 1** : Invasive species are randomly distributed, with biocontrol measures starting on each one.
- **Scenario 2**: Both invasive species and biocontrol measures start on the left side.
- **Scenario 3**: Invasive species are randomly distributed, with biocontrol measures are set in a limited region.



Scenario 1



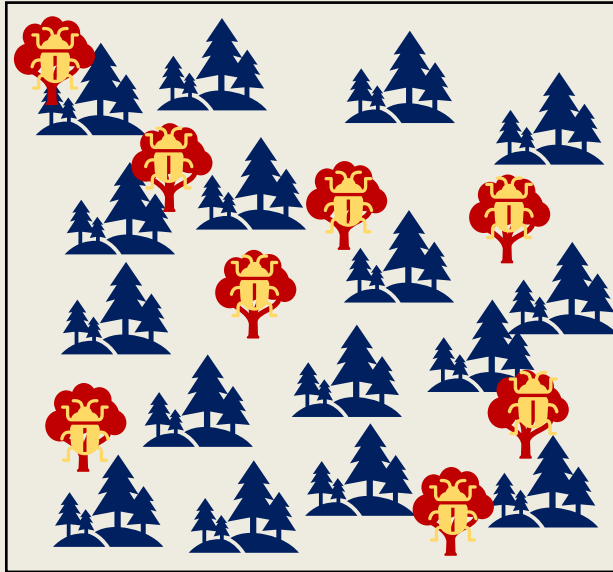
Scenario 2



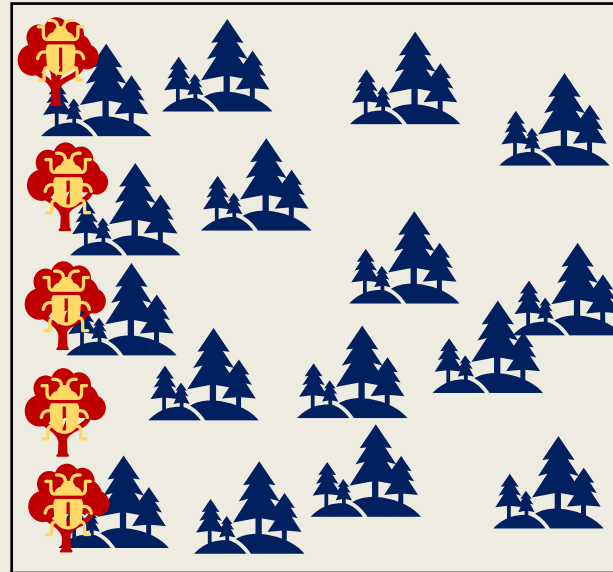
Scenario 3

Background	Objectives	Methods	Results	Conclusion
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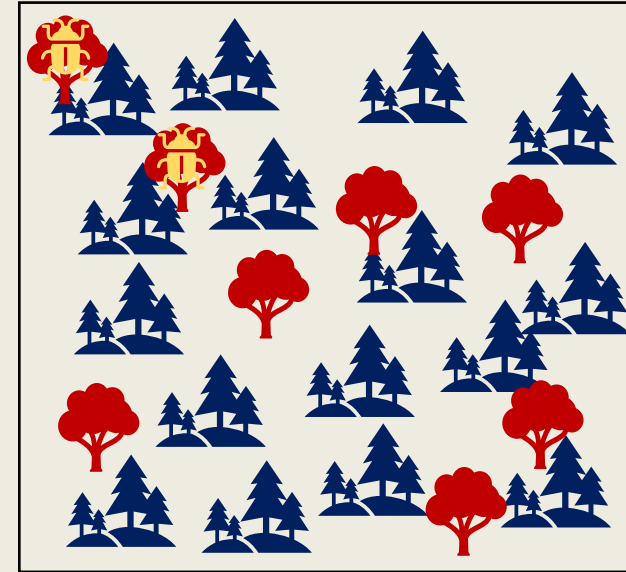
Biocontrol 2.0 beta



Scenario 1



Scenario 2



Scenario 3

Initial setting:

Native species population = 3000 individuals

Invasive species population = 100 individuals

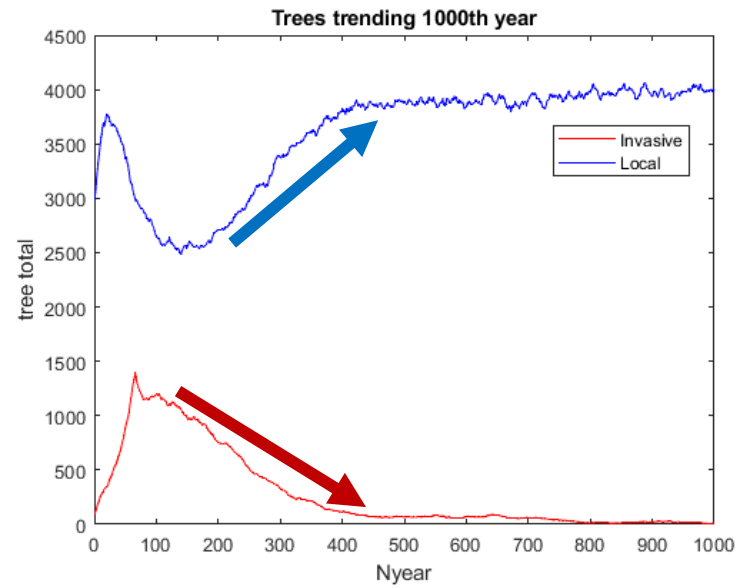
Biocontrol setting:

Timing of application = 65 years post invasion

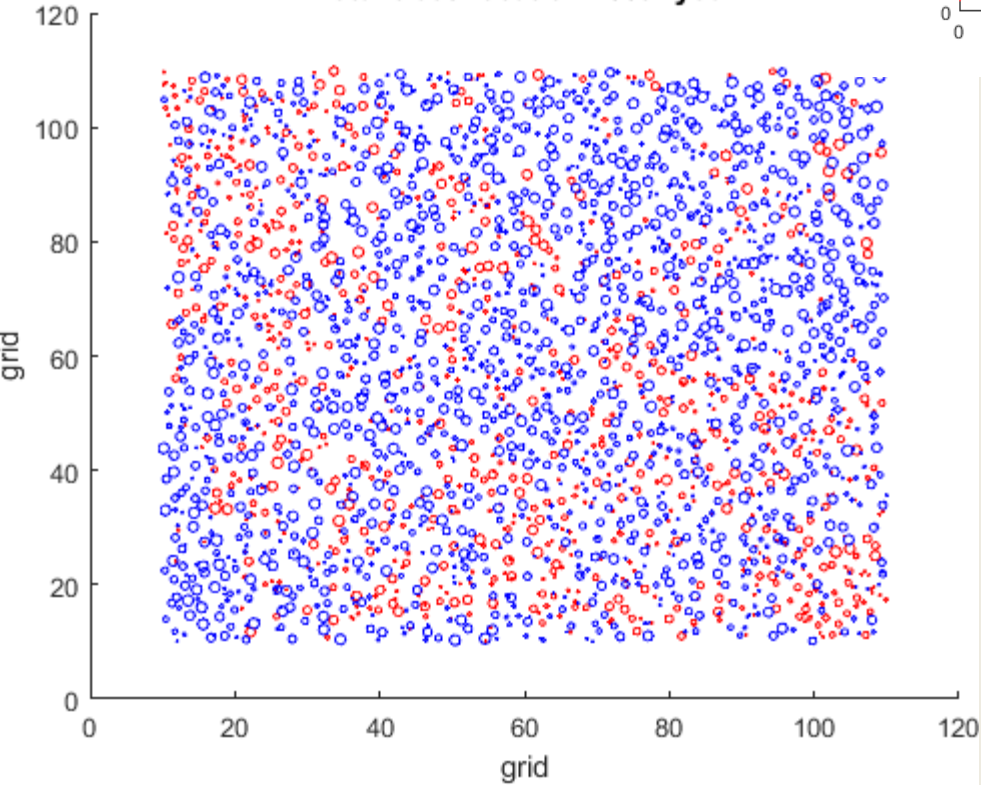
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Results

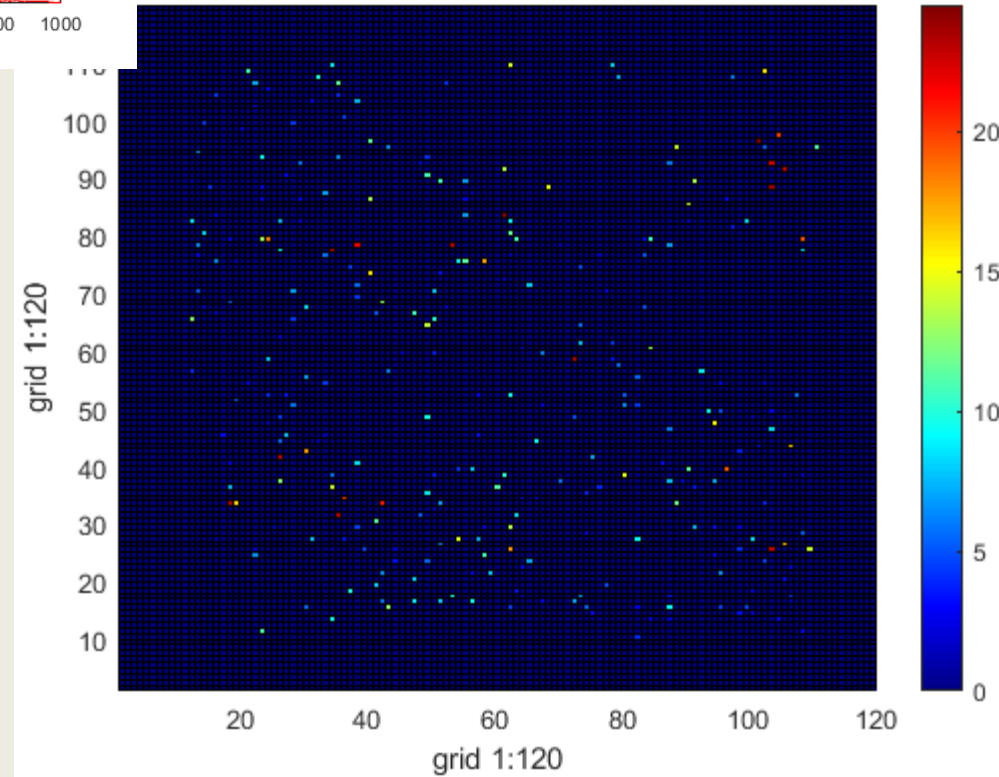
- Scenario 1



Total trees location 100th year

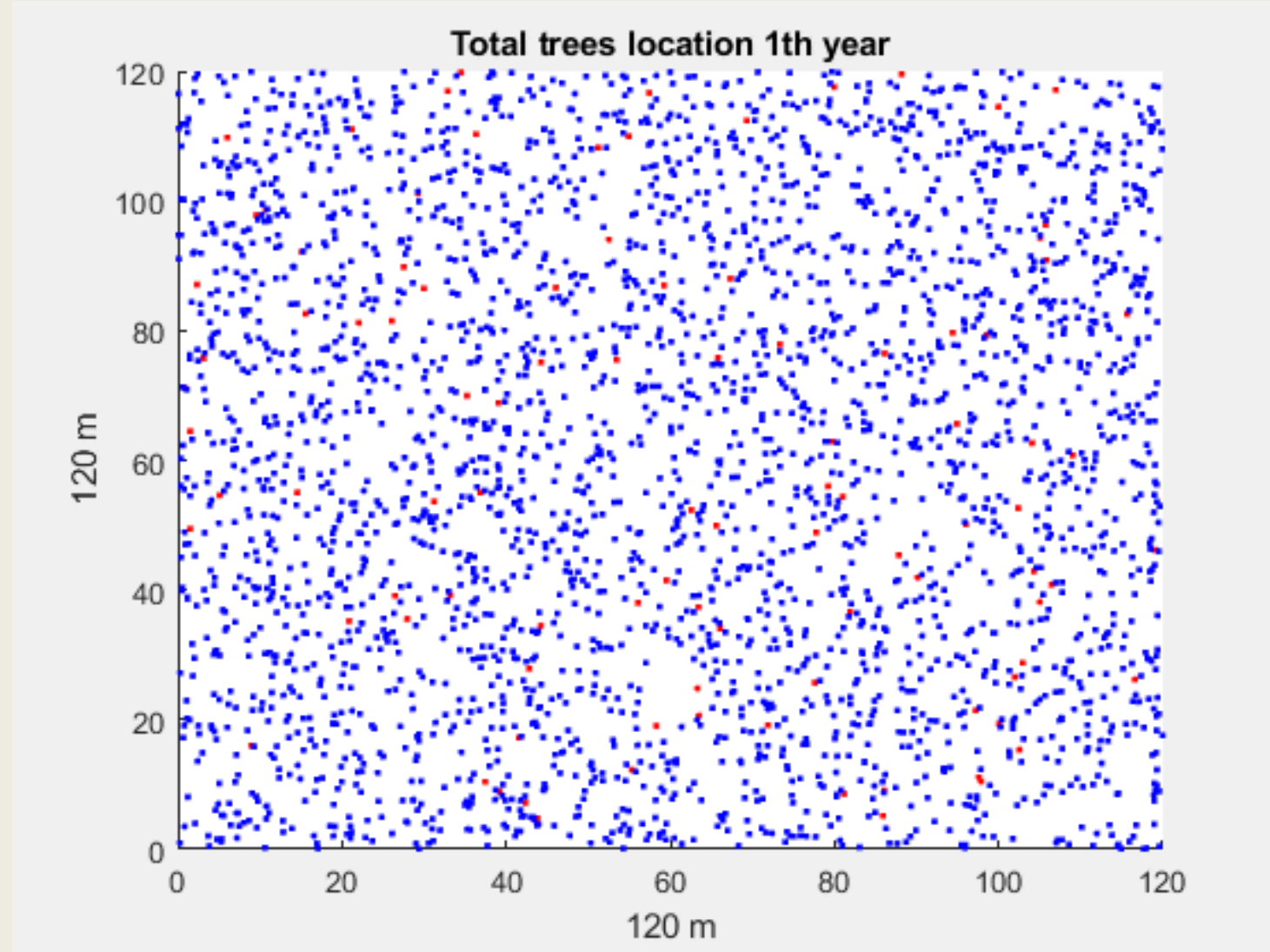


Biocontrol level of invasive tree for 100 year



Results

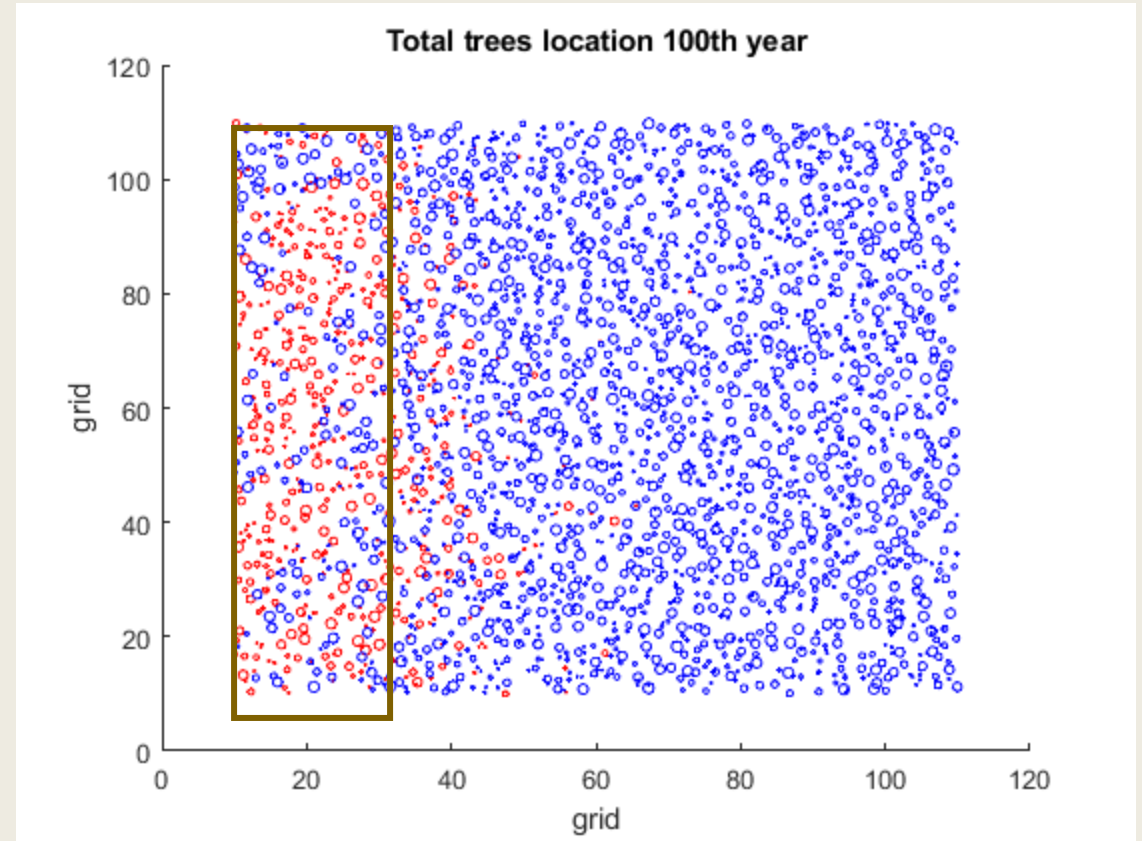
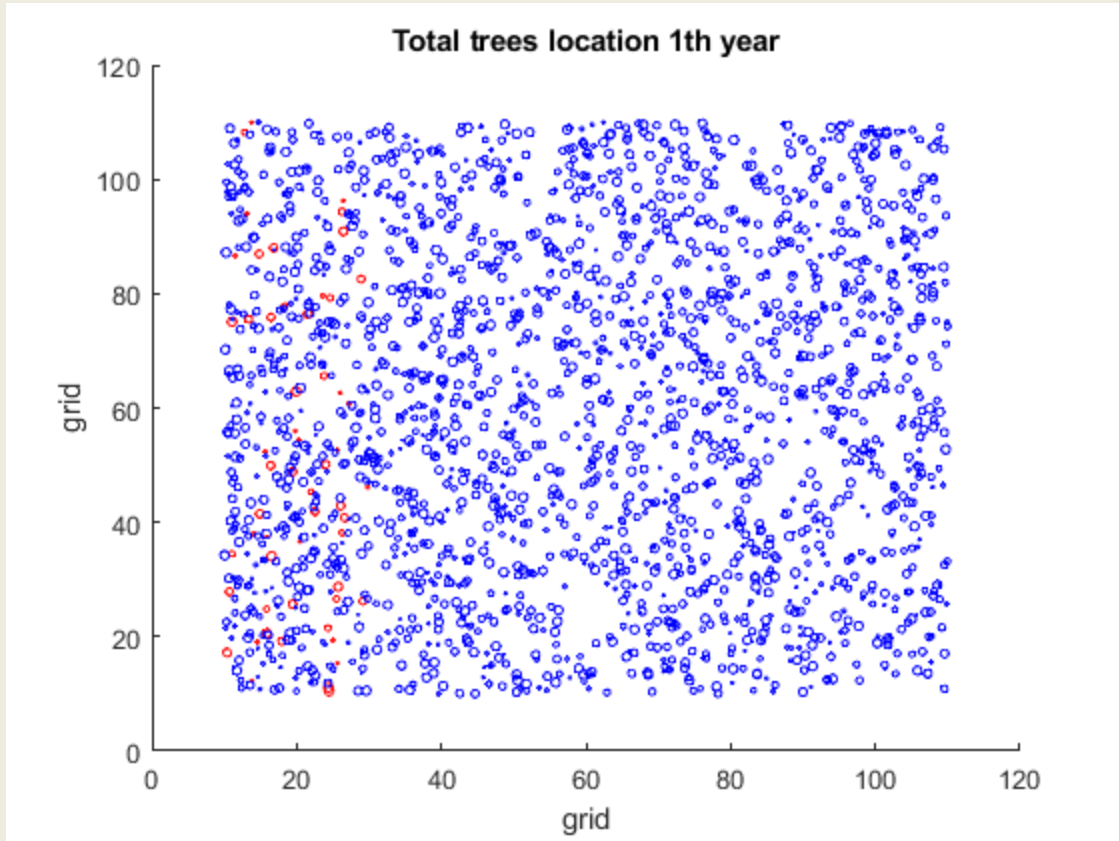
– Scenario 1



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Results

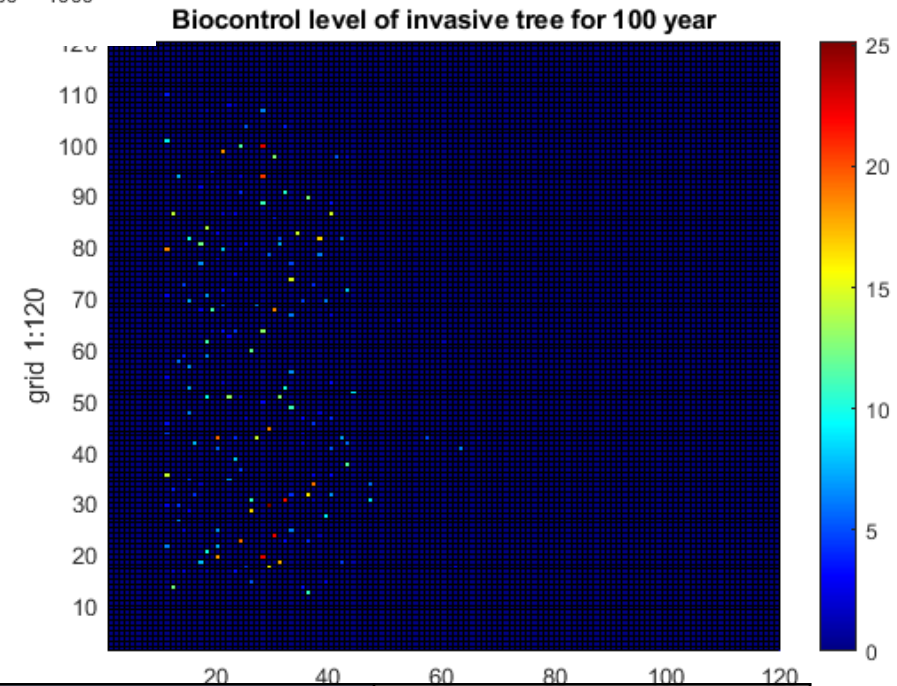
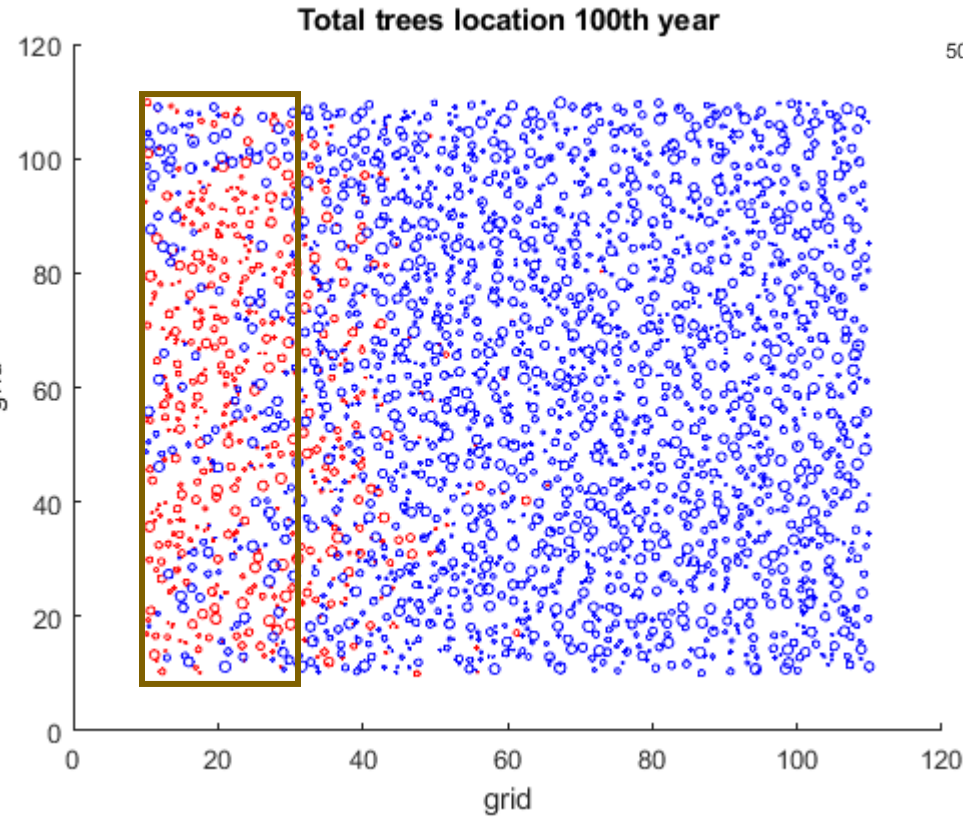
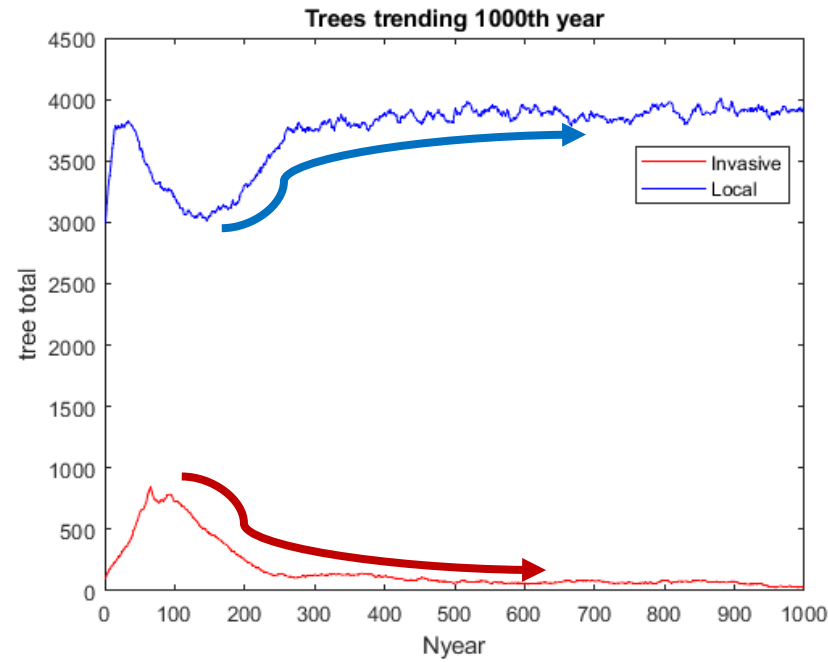
– Scenario 2



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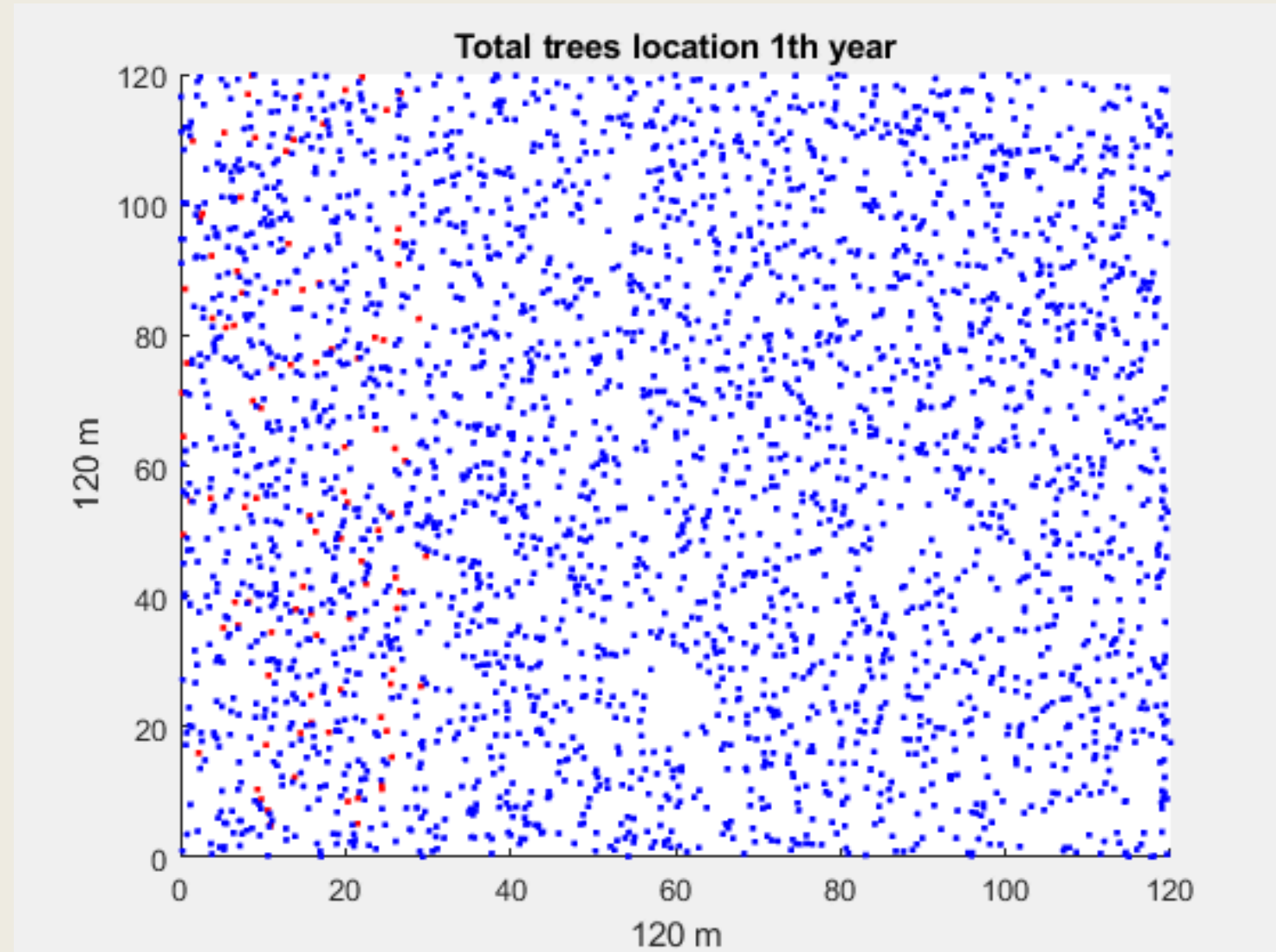
Results

- Scenario 2



Results

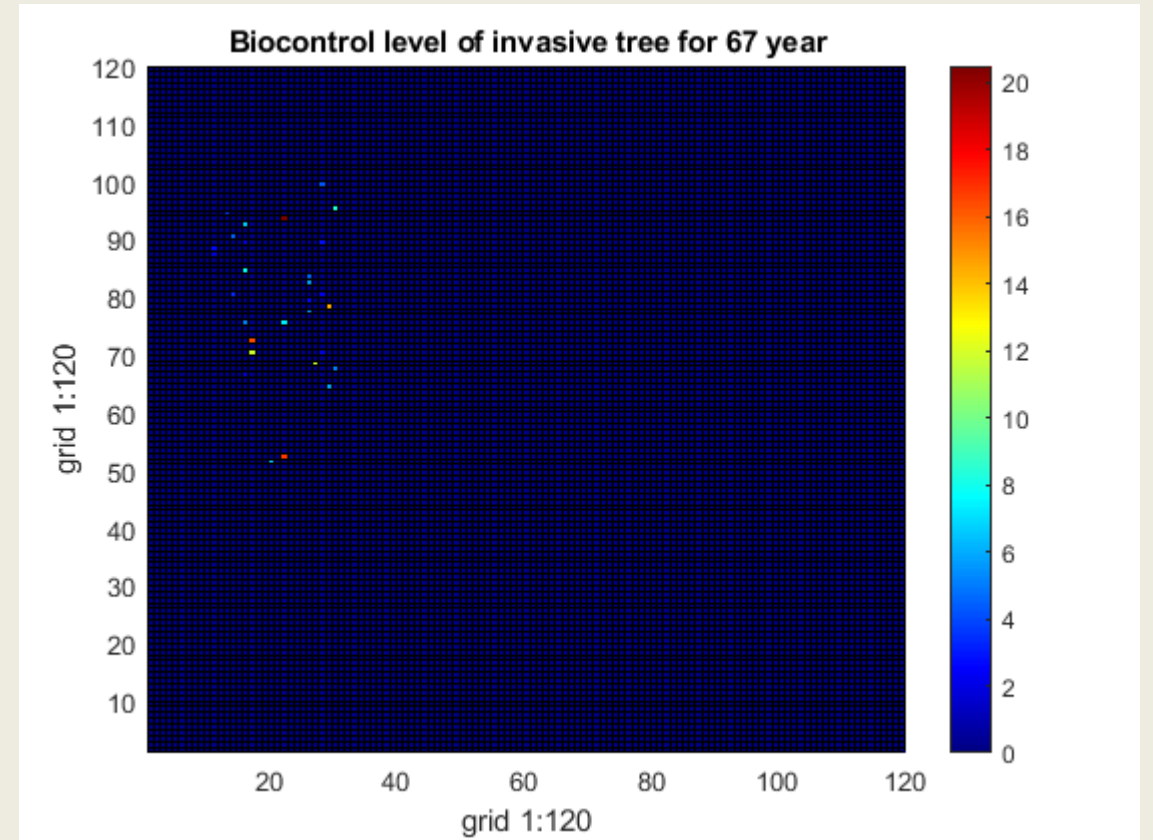
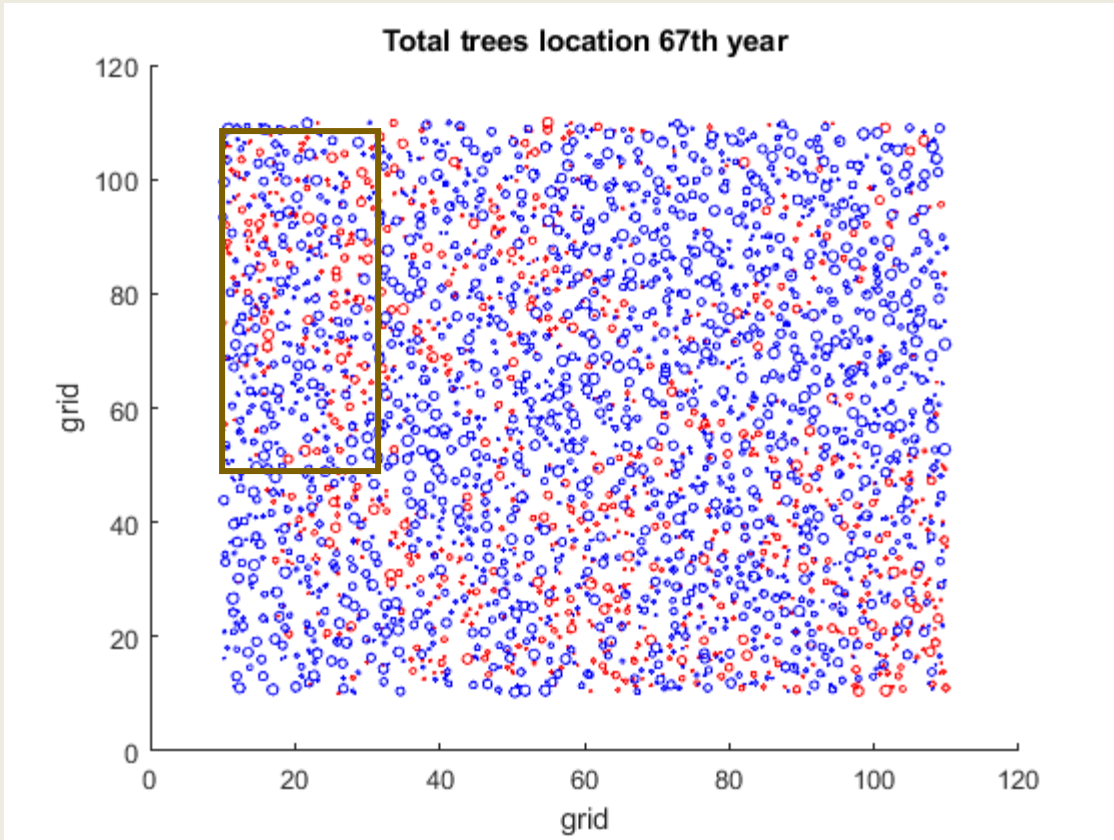
– Scenario 2



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Results

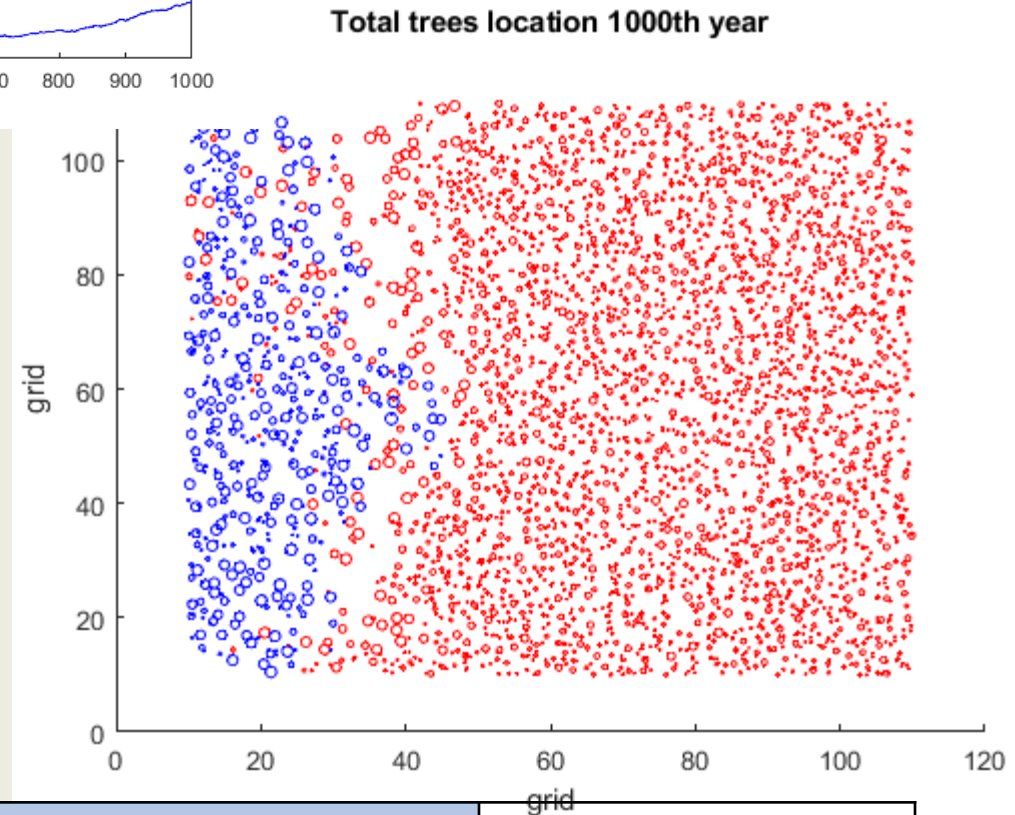
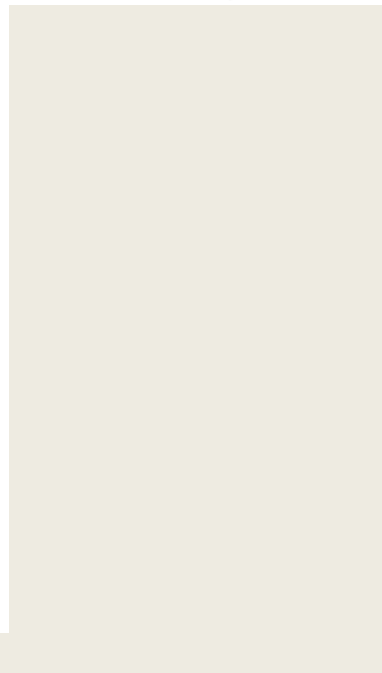
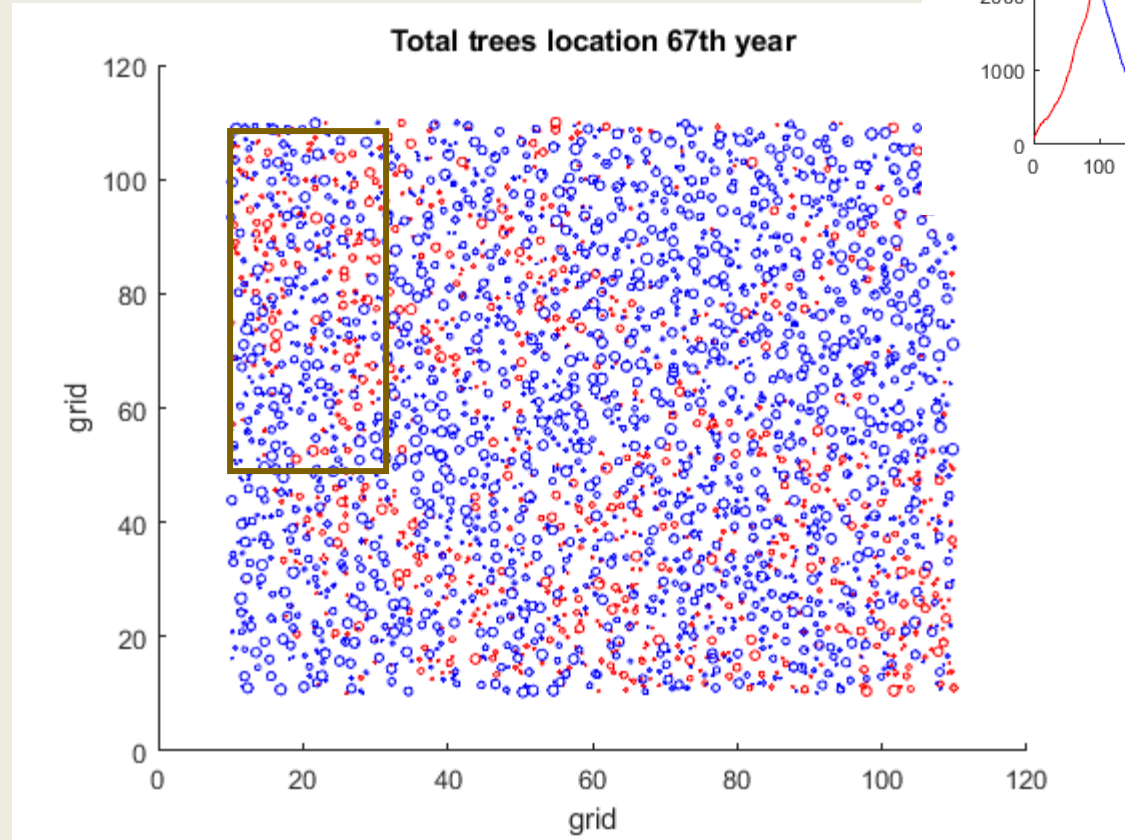
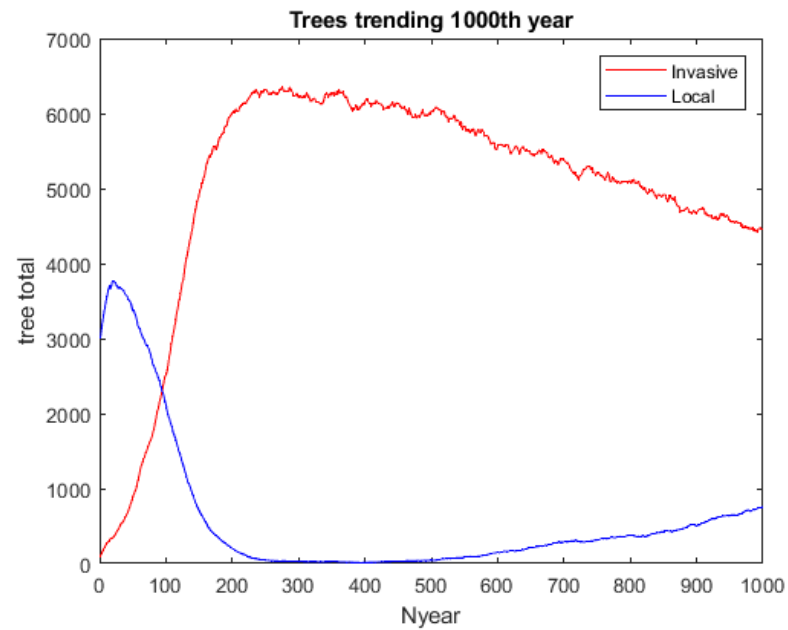
– Scenario 3



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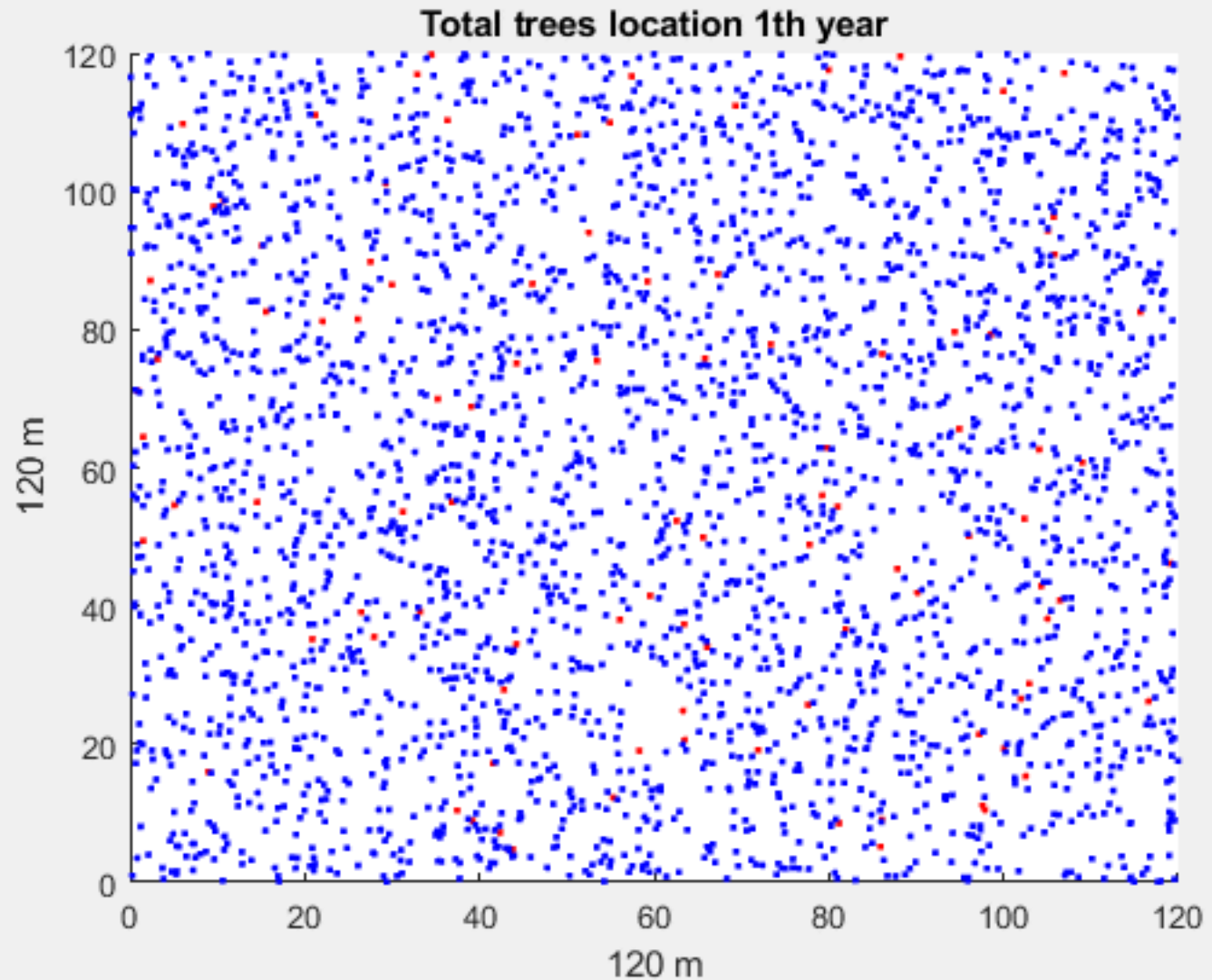
Results

– Scenario 3



Results

– Scenario 3



Background

Objectives

Methods

Results

Conclusion

Conclusion

- The best control results are achieved by uniformly spread biocontrol agents on invasive species.
- Insufficient biocontrol establishment in the vegetation leads to poor outcomes.
- Regularly reapplying biocontrol will boost the control outcomes.

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Acknowledgments

- Funding resources: Greater Everglades Priority Ecosystem Science (GEPES)
- UF CLAS Biology Department
- DeAngelis's lab
- Holt's lab

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```
bio_control_individual = true;  
bio_control_dispersal_range = 2.2; %  
biocontrol disperse range  
bio_control_increase_coeff = 1.001; %  
biocontrol infectious level
```

```
% settings for the region  
x_len = 120; y_len = 120; % settings for the simulation grid  
Nyear = 1000; % Time span in years  
  
% settings for the species  
Nspec = 2; % Number of species;  
phi = 0.2; % Light extinction coefficient  
G = [400 267]; % Growth constants for the two species  
D_max=[90 100]; % Maximum d.b.h. for the two species(cm)  
H_max=[2540 4000]; % Maximum height for the two species (cm)  
AGE_max=[200 250]; % Maximum age for the two species (year)  
b2=[53.4 77.26]; % Constant in height to d.b.h. relationship  
b3=[0.3 0.396]; % Constant in height to d.b.h. relationship  
cLW=[38.90 27.55]; % Constant in leaf weight to d.b.h. relationship  
cLF=[5.4 0.74]; % Leaf fall coefficient  
bLW=[1.79 1.79]; % Constant in leaf weight to d.b.h. relationship  
cLA=6.181; % leaf area to leaf weight, both species  
bLA=0.9726; % leaf area to leaf weight, both species  
cRT=0.1193; % tree biomass to dbh  
bRT=2.393; % tree biomass to dbh  
eta = 0.3; % allocate to root biomass  
turnover_invasive = 0.65; % turnover rate for invasive  
turnover_local = 0.90; % turnover rate for local  
c1 = 10; % coefficient for ZOI  
c2 = 0.5; % coefficient for ZOI
```

```
if Bio_Control(j)>0
    while di(k)~=0 & di(k)< (bio_control_dispersal_range * 0.05*dbh(j))

        if Ntype(j) == 1
            Bio_Control_nextyear(j) = 100 / (1 + ((100 - Bio_Control(j)) / Bio_Control(j)) * exp(-bio_control_increase_coeff * dbh(j)*0.1));
            %Bio_Control_nextyear(j) = (bio_control_increase_coeff + 0.005*dbh(j)) * Bio_Control(j);
        else
            Bio_Control_nextyear(j) = 100 / (1 + ((100 - Bio_Control(j)) / Bio_Control(j)) * exp(-bio_control_increase_coeff * dbh(j)*0.001));
        end

        if Bio_Control_nextyear(j) > Bio_Control_nextyear(Neib(k,j))
            Bio_Control_nextyear(Neib(k,j)) = Bio_Control_nextyear(Neib(k,j)) + (bio_control_increase_coeff-1) * Bio_Control(j);
        end
    end
end
```

```
if Birthrate_control && (t > BRc_year) && Bio_Control(j) >= 1
    %brate = birth_rate(1)*0.1;
    individual_br_effect = 1/Bio_Control(j);
    brate = birth_rate(1) * individual_br_effect;
end
```

```
case 1
    if Deathrate_control && (t > DRc_year) && Bio_Control(j) >= 10
        mc3 = 0.042*0.5*Bio_Control(j)*exp(-10.0*DNC(j)); % mortality due to poor growth rate
    else
        mc3 = 0.042*exp(-10.0*DNC(j)); % mortality due to poor growth rate
    end
end
```