# An Age Structured Model of the Impact of Buffelgrass on Saguaro Cacti and their Nurse Trees

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- The saguaro is also important for the tourism industry and has cultural significance to the Papago and Pima nations.



www.wildsonora.com/image-content/saguaros-andnurse-tree

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- Nurse trees increase the chance of germination and survival for juvenile saguaros.
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- A palo verde typically cannot out-compete a saguaro.



 $www.desertmuseum.org/invaders/invaders\_buffelgrass.php$ 

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www.nps.gov/articles/buffelgrass-management-saguaro.htm



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- Buffelgrass,a fire-adapted plant, is able to survive fires and quickly regrow.



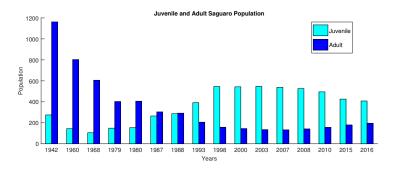
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- Buffelgrass,a fire-adapted plant, is able to survive fires and quickly regrow.
- Buffelgrass acts as a fuel for fires, quickly burning native plants like saguaros and nurse trees and replacing them within weeks.

## The Saguaro Population has Begun to Decline



Data provided by Orum et.al. shows the changes in the distribution of adult and juvenile saguaro populations from 1942 to 2016 [1].

#### The Question

Under what conditions will buffelgrass propagated wildfires interrupt the natural life cycle between the saguaro cactus and its nurse trees?



mpers.wordpress. com/tag/saguaro

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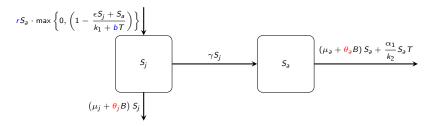
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- Nurse trees increase the available space for juvenile saguaros.

#### Flow Chart Diagram of the Model

#### Species interactions:

- Commensalism between juvenile saguaros and nurse trees
- Competition between adult saguaros and nurse trees
- Buffelgrass propagated wildfire.





#### Parameters of the Model

Parameter values were estimated through review of existing literature.

Parameter	Description	Parameter	Description	
r	Germination rate	$k_1$	Adult saguaro carrying capacity	
$\epsilon$	Converts juveniles to adults	Ь	Average juveniles under nurse tree	
γ	Maturation rate	$\mu_j$	Juvenile death rate	
$\alpha_1$	Saguaro death rate by competition	k <sub>2</sub>	Carrying capacity of adults and trees	
$\mu_a$	Adult death rate	φ	Growth tree population	
ρ	Tree competition death rate	σ	Proportion carrying capacity	
$\theta_j$	Grass fire frequency effect- juvenile	$\theta_a$	Grass fire frequency effect-adult	
$\theta_t$	Grass fire frequency effect-tree	3	Grass growth rate	
μв	grass harvesting	k <sub>3</sub>	Carrying capacity of grass	

#### The Model

$$\begin{split} \frac{dS_{j}}{dt} &= rS_{a} \cdot \max \left\{ 0, \left( 1 - \frac{\epsilon S_{j} + S_{a}}{k_{1} + bT} \right) \right\} - \gamma S_{j} - \mu_{j} S_{j} - \theta_{j} B S_{j}, \\ \frac{dS_{a}}{dt} &= \gamma S_{j} - \frac{\alpha_{1}}{k_{2}} S_{a} T - \mu_{a} S_{a} - \theta_{a} B S_{a}, \\ \frac{dT}{dt} &= \phi T \left( 1 - \frac{T}{k_{2}} \right) - \rho S_{a} T - \theta_{T} B T, \\ \frac{dB}{dt} &= \omega B \left( 1 - \frac{B}{k_{3}} \right) - \mu_{B} B \end{split}$$

Buffelgrass grows independently of nurse trees and saguaros, so the model can be redimensionalized into a 3 compartment system by redefining 5 parameters,  $\mu_j$ ,  $\mu_a$ ,  $\phi$ ,  $k_2$ , and  $\alpha_1$ , as  $\tilde{\mu}_j$ ,  $\tilde{\mu}_a$ ,  $\tilde{\phi}$ ,  $k_4$ , and  $\tilde{\alpha}_1$ .

## Buffelgrass Independence

$$ilde{\mu_a} = \mu_a + B\theta_a$$
 $ilde{\mu_j} = \mu_j + B\theta_j$ 
 $ilde{\phi} = 1 - \frac{\theta_T B}{\phi}$ 
 $ilde{\kappa_4} = k_2 \tilde{\phi}$ 

$$\frac{dS_{j}}{dt} = rS_{a} \cdot \max \left\{ 0, \left( 1 - \frac{\epsilon S_{j} + S_{a}}{k_{1} + bT} \right) \right\} - \gamma S_{j} - \tilde{\mu}_{j} S_{j} \qquad (1)$$

$$\frac{dS_{a}}{dt} = \gamma S_{j} - \frac{\tilde{\alpha}_{1}}{k_{4}} S_{a} T - \tilde{\mu}_{a} S_{a} \qquad (2)$$

$$\frac{dT}{dt} = \tilde{\phi} T \left( 1 - \frac{T + \sigma S_{a}}{k_{4}} \right) \qquad (3)$$

## Demographic Reproductive Numbers

$$R_{di} = \begin{pmatrix} \text{Proportion of juvenile} \\ \text{saguaros that become} \\ \text{adults} \end{pmatrix} \cdot \begin{pmatrix} \text{Average number of juvenile} \\ \text{saguaros produced in an} \\ \text{adult's life} \end{pmatrix}$$

= The average number of adult saguaros produced by one adult saguaro during its lifetime.

	Without Trees	With Trees
Without	$R_{d1} = \frac{\gamma}{\cdot \cdot $	$R_{d2} = \frac{\gamma}{} \cdot \frac{r}{}$
Buffelgrass	$N_{d1} = \frac{1}{\gamma + \mu_j} \cdot \frac{1}{\mu_a}$	$\Lambda_{d2} = \frac{1}{\gamma + \mu_j} \cdot \frac{1}{\mu_a + \alpha_1}$
With	$R_{d3} = \frac{\gamma}{\sqrt{r}} \cdot \frac{r}{r}$	$R_{d4} = \frac{\gamma}{\sqrt{\gamma}} \cdot \frac{r}{\sqrt{\gamma} + r}$
Buffelgrass	$\Lambda_{d3} = \frac{1}{\gamma + \tilde{\mu}_j} \cdot \frac{1}{\tilde{\mu}_a}$	$ \Lambda_{d4} = \frac{1}{\gamma + \tilde{\mu}_j} \cdot \frac{1}{\tilde{\mu}_a + \tilde{\alpha}_1} $

## Buffelgrass Extinction Equilibria and Stability

For all stability of equilibria without buffelgrass,  $\omega < \mu_{B}$ 

	Equilibrium	Existence	Stability
	$E_1 = (0,0,0,0)$	always	unstable
$B_1^*=0$	$E_2 = (0, 0, T_2^*, 0)$	always	$R_{d2} < 1$
	$E_3 = (S_{j3}^*, S_{a3}^*, 0, 0)$	$R_{d1} > 1$	$ ho \mathcal{S}_{a}^* > \phi$
	$E_4 = (S_{j4}^*, S_{a4}^*, T_4^*, 0)$	$ ho \mathcal{S}_{\sf a}^* < \phi$ and $R_{\sf d2} > 1$	Stable(numerical)

## Equilibria and Stability with Buffelgrass

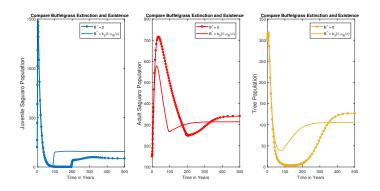
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	Equilibrium	Existence	Stability
	$E_5 = (0, 0, 0, B_2^*)$	always	unstable
$B_2^* = k_3 \left( 1 - \frac{\mu_B}{\omega} \right)$	$E_6 = (0, 0, T_2^*, B_2^*)$	always	$R_{d4}<1$
	$E_7 = (S_{j7}^*, S_{a7}^*, 0, B_2^*)$	$R_{d3} > 1$	$ ho \mathcal{S}_{a}^* >  ilde{\phi}$
	$E_8 = (S_{j8}^*, S_{a8}^*, T_8^*, B_2^*)$	$ ho \mathcal{S}_{a}^* <  ilde{\phi}$ and $R_{d4} > 1$	Stable (numerical)

#### When is Coexistence Possible?

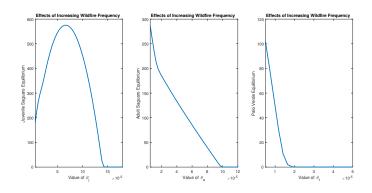
**Theorem**: If 
$$\frac{\tilde{\phi}}{\rho} > \frac{k_1}{1 + \tilde{E}} \left( 1 - \frac{1}{R_{d3}} \right)$$
 and  $R_{d4} > 1$  then there exists at least one coexistence equilibrium.

#### Simulations with Baseline Parameters



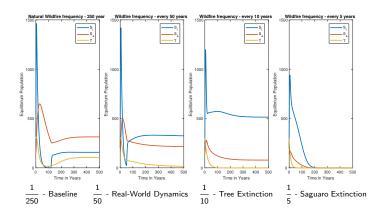
Comparing Dynamics at  $B^*=0$  and  $B^*=k_3\left(1-\frac{\mu_B}{\omega}\right)$  equilibria, it can be seen that at  $B^*=0$  equilibrium population values of adult saguaros and trees are increased.

# Effects of Increased Wildfire Frequency on Equilibrium Populations



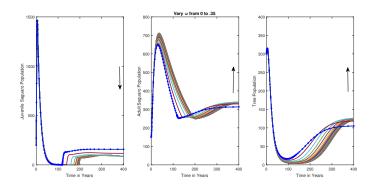
All equilibrium populations will eventually approach extinction as the frequency of wildfires is increased.

#### Effects of Increased Wildfire Frequency over Time



An increase in wildfire frequency can cause the extinction of the saguaros and nurse trees.

## Effects of Reducing Buffelgrass by Chemical Spraying



The use of herbicide on buffelgrass will increase the adult saguaro and nurse trees population, but it will decrease the juvenile population.

#### Local Sensitivity Analysis Without Buffelgrass

Sensitivity Analysis	r	Ь	φ	
$S_j$	0.0013	0.1006	0.6534	
S <sub>a</sub>	0.0013	0.1006	0.6534	
T	-0.0084	-0.6534	2.2520	

Table: Sensitivity index of the population values of  $S_j$ ,  $S_a$ , and T at equilibrium when changing the parameter values by 1% from their baseline values.

## Local Sensitivity Analysis with Buffelgrass

Sensitivity Analysis	$\theta_j$	$\theta_{a}$	$\theta_T$	$\mu_B$	$\omega$	$\phi$
$S_j$	$-3.92 \times 10^{-4}$	0.4916	-0.0753	-8.3189	8.3232	0.7213
Sa	$-3.92 \times 10^{-4}$	-0.0111	-0.0753	1.7351	-1.7354	0.7213
T	0.0028	0.0803	-0.2980	4.2973	-4.2973	2.8558
В	N/A	N/A	N/A	-20	20	N/A

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  - 1 Since the sensitivities of the equilibrium populations to these parameters are about the same, which is the more efficient strategy depends on cost.

#### Future Work

Future work for this model should be the inclusion of:

- An optimal control analysis for the most efficient way of reducing the buffelgrass population.
- Adding stochastic wildfires instead of averaging death due to wildfire over time.
- Add biological relationships of buffelgrass with native plants

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## Questions?

#### Selected Sources



M. J. Orum TV, Ferguson N, ""Data from: Saguaro mortality and population regeneration in the cactus forest of Saguaro National Park: seventy-five years and counting"," 2016.

D. Swann. Personal communication. July 5th 2017.

## More Information on Sensitivity Analysis

A local sensitivity analysis was performed by finding the percent change in the quantity on interest due to a one percent change in the parameter of interest.

$$S_p^q := \frac{\hat{p}}{\hat{q}} \times \frac{\partial q}{\partial p} \bigg|_{p=\hat{p}} = \frac{\theta_q}{\theta_p}$$

The terms  $\hat{p}$  and  $\hat{q}$  represent the baseline values of the parameter of interest and quantity of interest, respectively. The  $\theta$ 's give the changes in the parameter values and resulting changes in quantity values.