# Deleterious CAFI Promote More Small and Large Corals in Reefs

An analysis of a spatially well-mixed, deterministic, partial differential equation model of the size-density of coral reefs

#### Biological Assumptions Our Coral Reef

- Space limited
- Corals are uniformly spread in environment, cannot overlap
  - Coral growth dependent on available space
- Corals enter only through immigration, dependent on available space
- Coral associated fish and invertebrates (CAFI) occupy the reef
  - Can be beneficial, neutral, deleterious
  - Influence coral growth rate and life expectancy

#### **Spatially well-mixed deterministic PDE**Model Definition

- u(r,t)dr the number of corals with radius size between (r,r+dr) at time t
- $\gamma(A,r)$  growth,  $\mu(A,r)$  mortality,  $\Gamma(A)$  immigration
- Initial Boundary Value Problem:

$$\partial_t u(r,t) + \partial_r \left( \gamma(A(t), r) u(r,t) \right) = -\mu(A, r) u(r,t)$$

$$u(r,0) = u_0(r)$$

$$\gamma(A(t),0) u(0,t) = \Gamma(A(t))$$

$$A(t) = \int_0^{r_m} \pi r^2 u(r,t) dr$$

### Spatially well-mixed deterministic PDE CAFI Assumptions

- ullet CAFI immigrate during settlement events every  $\Delta$  days
- CAFI settlement rate,  $\lambda(r,A)$  depends on coral size and area occupied by size-density
- CAFI leave through density independent, lpha, density dependent, eta, mortality

$$\frac{dX(t;r,A)}{dt} = -\alpha X - \pi r^2 \beta X^2 + \frac{1}{\pi r^2} \sum_{k=0}^{\infty} \lambda(r,A) \delta_{k\Delta}(t)$$
$$X(0;r,A) = X_0$$

### Spatially well-mixed deterministic PDE CAFI Computation

- Fix r, A, then X(t; r, A) converges to steady state for  $t \in [k\Delta, (k+1)\Delta)$
- Define average CAFI density given coral size and area occupied

$$\bar{X}(r,A) = \operatorname{avg}_{t \in [k\Delta,(k+1)\Delta)} \{X(t;r,A)\}$$

• Use Hill Equation for CAFI effect,  $\phi \in (-1,1)$ 

$$\mathscr{E}(r,A) = 1 + \phi \left( \frac{\bar{X}^{\beta_X}(r,A)}{\theta_X^{\beta_X} + \bar{X}^{\beta_X}(r,A)} \right)$$

### Spatially well-mixed deterministic PDE CAFI, Area Dependent Growth and Life Expectancy

Corals cannot overlap => growth rate slows when space is limited

$$\gamma(A(t), r) = \gamma_0 \left[ 1 - \left( \frac{A(t)}{A_m} \right)^{n_g} \right] \mathcal{E}(r, A(t))$$

Small corals have lower life expectancy than large corals

$$L(A(t), r) = \left[ L_{\min} + \left( L_{\max} - L_{\min} \right) \left( \frac{r^{\beta_L}}{\theta_L^{\beta_L} + r^{\beta_L}} \right) \right] \mathcal{E}(r, A(t))$$

$$\mu(A(t), r) = 1/L(r, A(t))$$

### **Spatially well-mixed deterministic PDE**Area Dependent Immigration

- Coral larva can only land on available space, finite number of attempts to land
- After the finite attempts the larva expire

$$\Gamma(A(t)) = \Gamma_0 \left[ 1 - \left( \frac{A(t)}{A_m} \right)^{n_I} \right]$$

### **Spatially well-mixed deterministic PDE Existence, Uniqueness of Solution**

• Previous definitions of growth, mortality, immigration, CAFI effect ensure Lipschitz continuity wrt r,A

- Theorem: u(r,t) has a unique solution for all positive time t.
  - Contraction mapping argument

### **Spatially well-mixed deterministic PDE**Steady State Solution

• Redefine IBVP for stationary solution  $\bar{u}(r)$ 

$$\partial_r \left( \gamma(A, r) \bar{u}(r) \right) = -\mu(r, A) \bar{u}(r)$$
$$\gamma(A, 0) \bar{u}(0) = \Gamma(A)$$
$$A = \int_0^{r_m} \pi r^2 \bar{u}(r) dr$$

Solve through separation of variables, integrating factor

## **Spatially well-mixed deterministic PDE**Conditional Convergence to Steady State Solution

. Assume that  $\lim_{t\to\infty} A(t) = A$ 

• Theorem: If A(t) converges to A, then  $u(r,t) \rightarrow \bar{u}(r)$  in L1.

• Showing the existence of a limit point of A(t) is difficult, potential oscillations

#### **Numerical Solution Method**

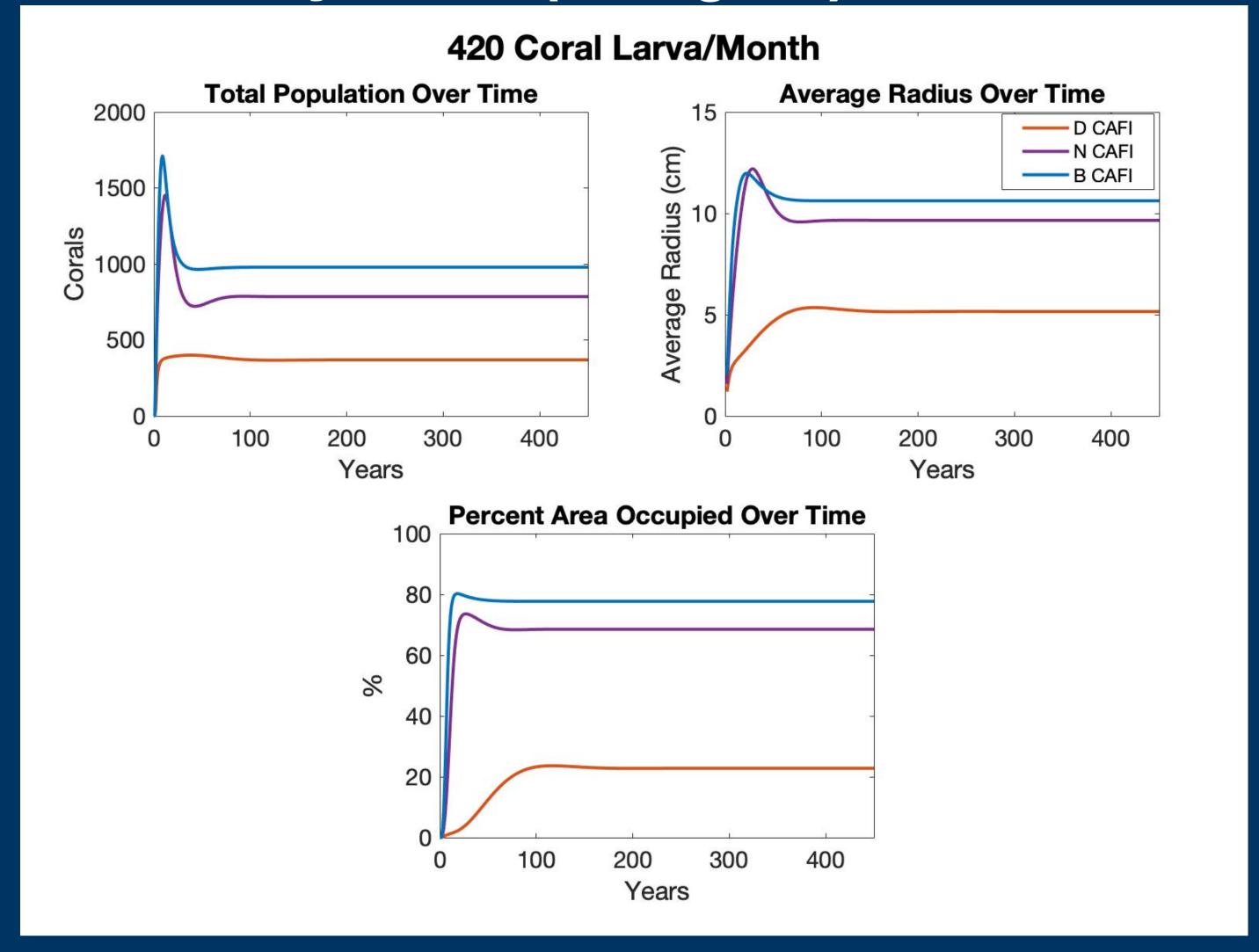
• Upwind scheme:  $(u(r_j, t_n) \approx U_j^n)$ 

$$U_j^{n+1} = U_j^n - \frac{\Delta t \gamma_j^n}{\Delta r} \left[ U_j^n - U_{j-1}^n \right] - \Delta t \left( \mu_j^n + d \gamma_j^n \right) U_j^n$$

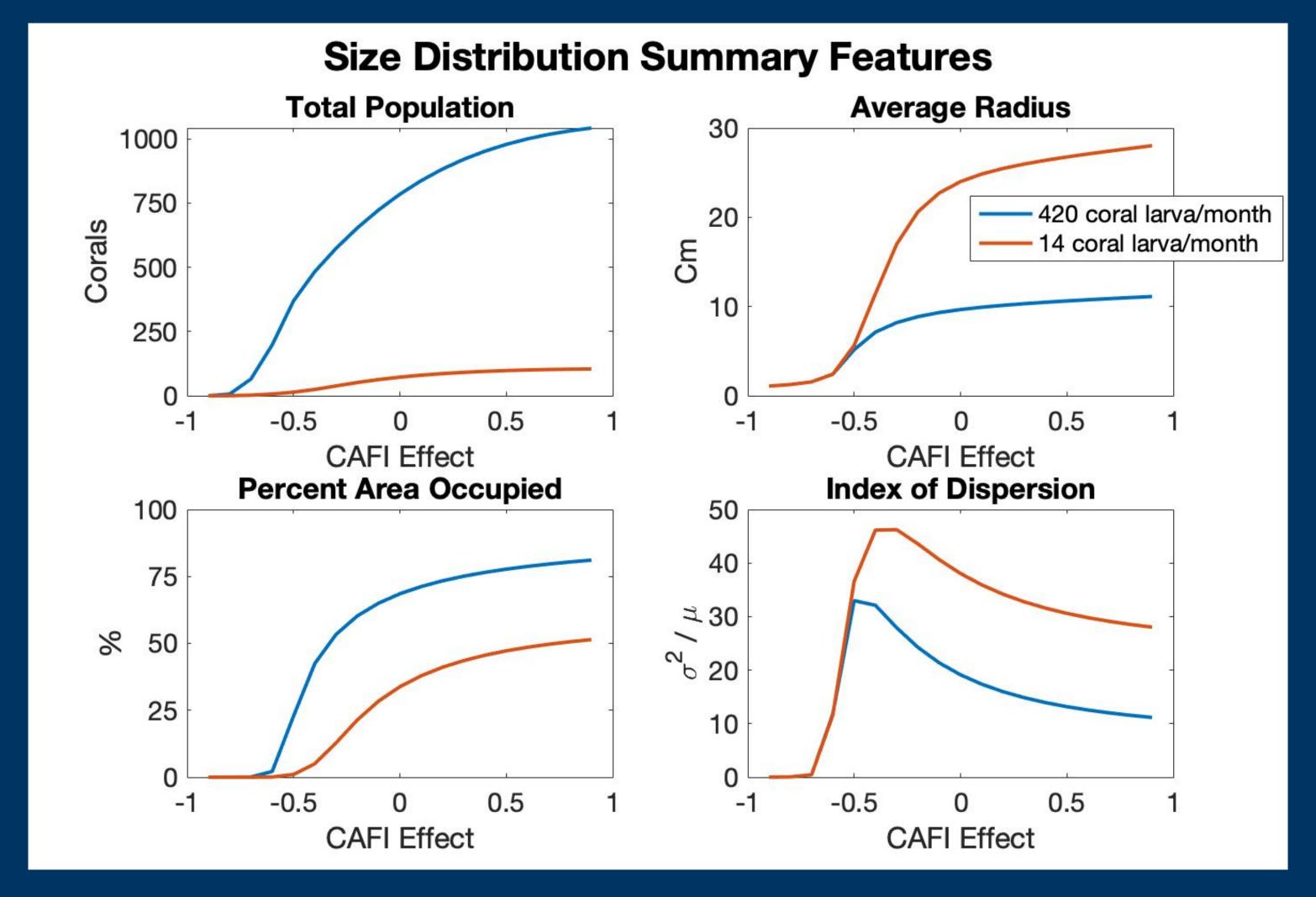
• Trapezoidal method for area:  $(A(t_n) \approx A_n)$ 

$$A_n \approx \frac{\pi \Delta r}{2} \left( r_0^2 U_0^n + 2 \sum_{j=1}^{J-1} r_j^2 U_j^n + r_J^2 U_J^n \right)$$

# Spatially well-mixed deterministic PDE Convergence to Steady State (SI Figure)



## **Spatially well-mixed deterministic PDE**Summary Features of Steady State Solution



#### **Spatially well-mixed deterministic PDE**Visualizing the Steady State Solution of the Size-Density

Assume that total number of corals in an environment is a Poisson RV

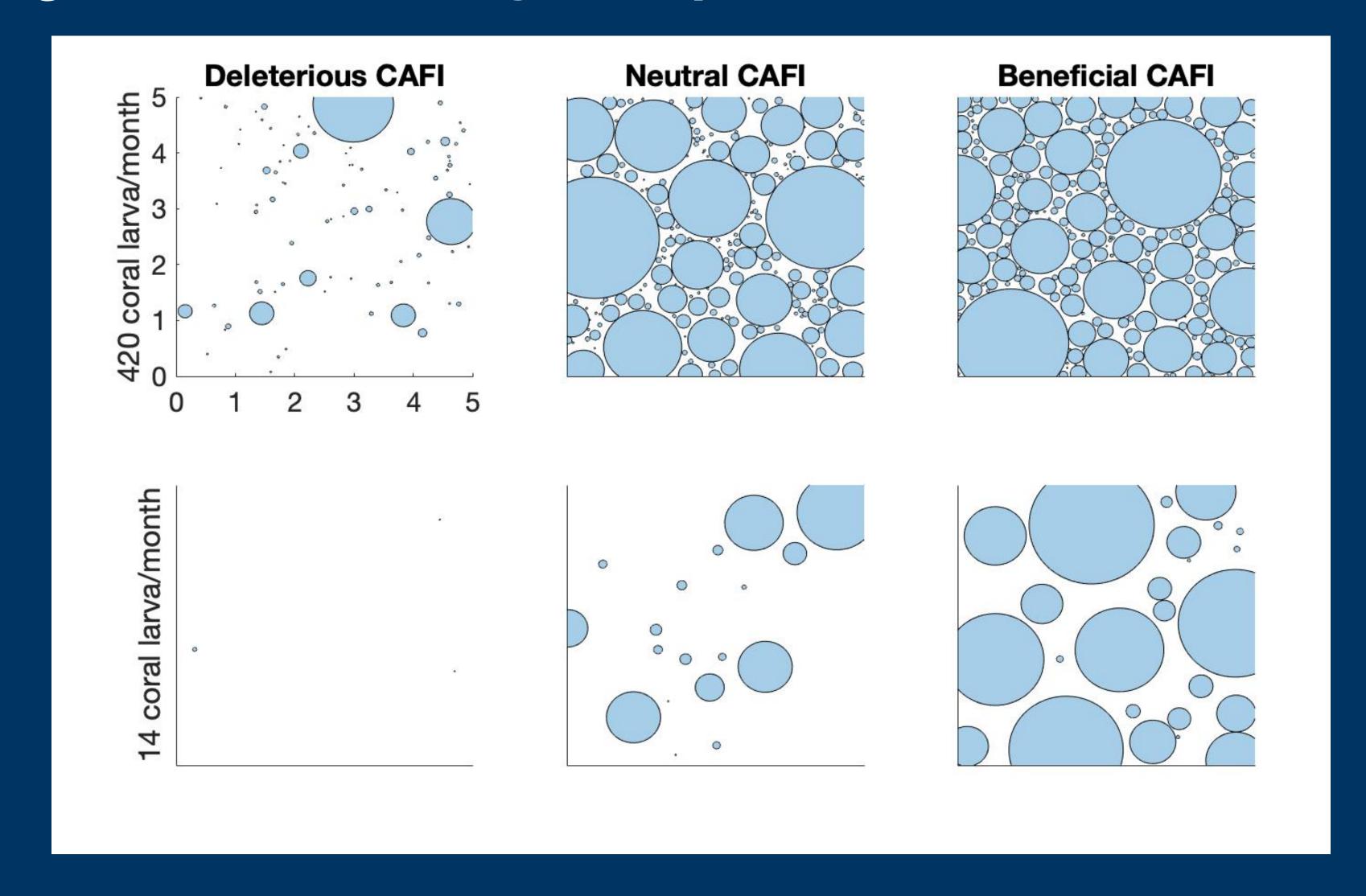
$$N \sim \text{Poi} \left( \Delta r \sum_{j=0}^{J} U_j^N \right)$$

• Number of corals with radius size  $r \in [j\Delta r, (j+1)\Delta r)$ 

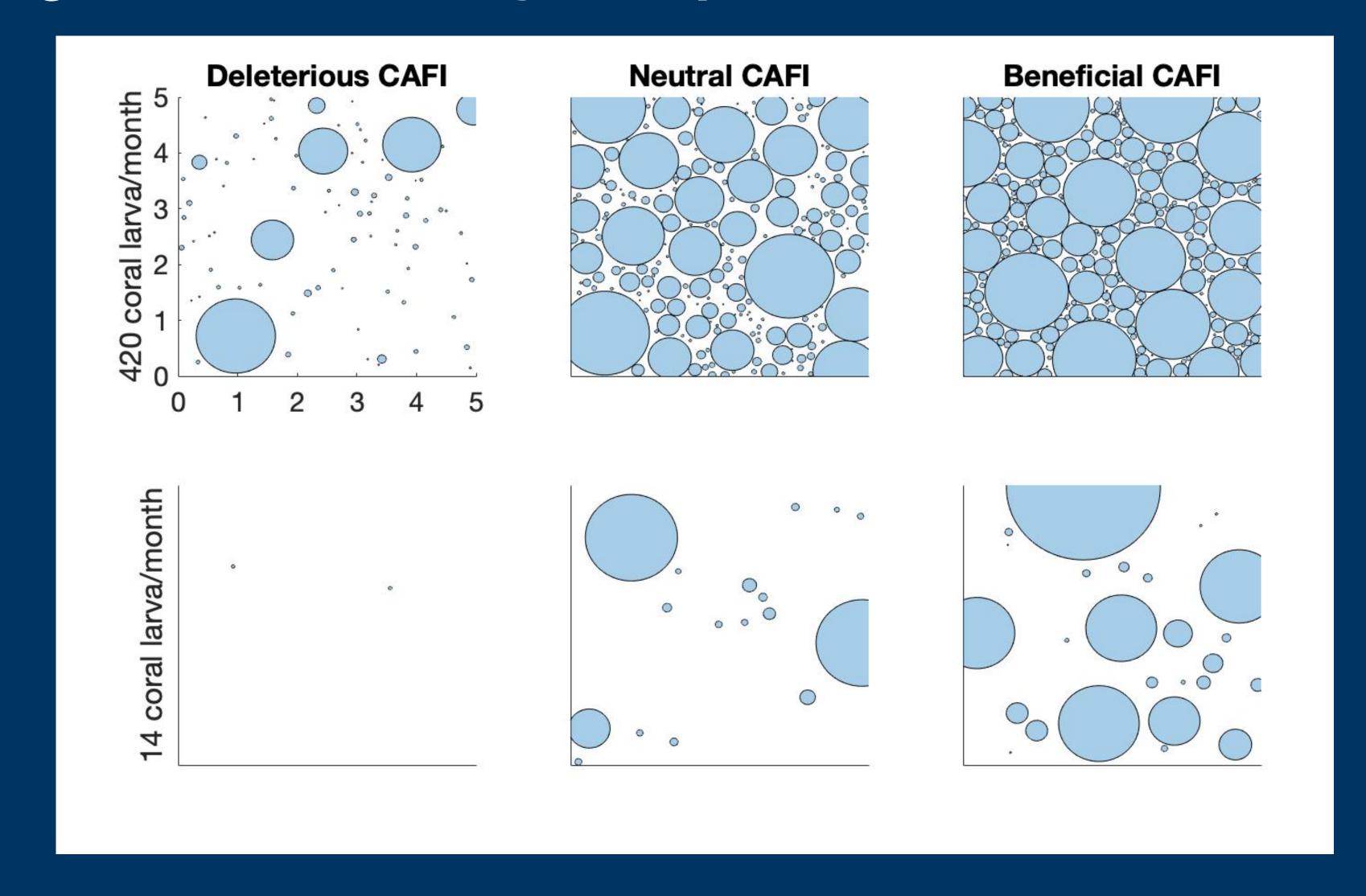
$$N_j \sim \operatorname{Poi}\left(\Delta r U_j^N\right)$$

Sort radius samples and uniformly place w/o overlap

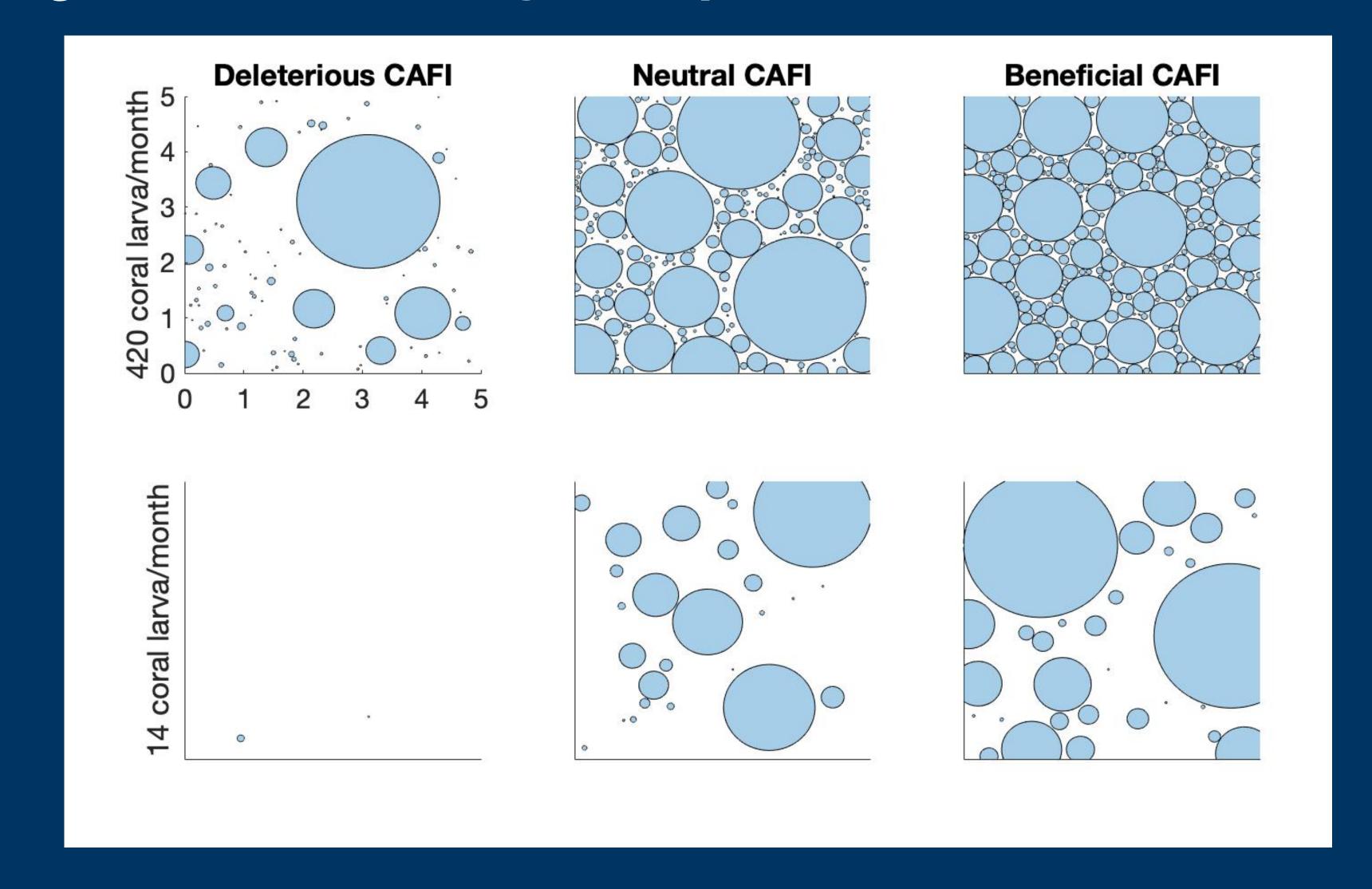
Visualizing the Size-Density-Sample Environments



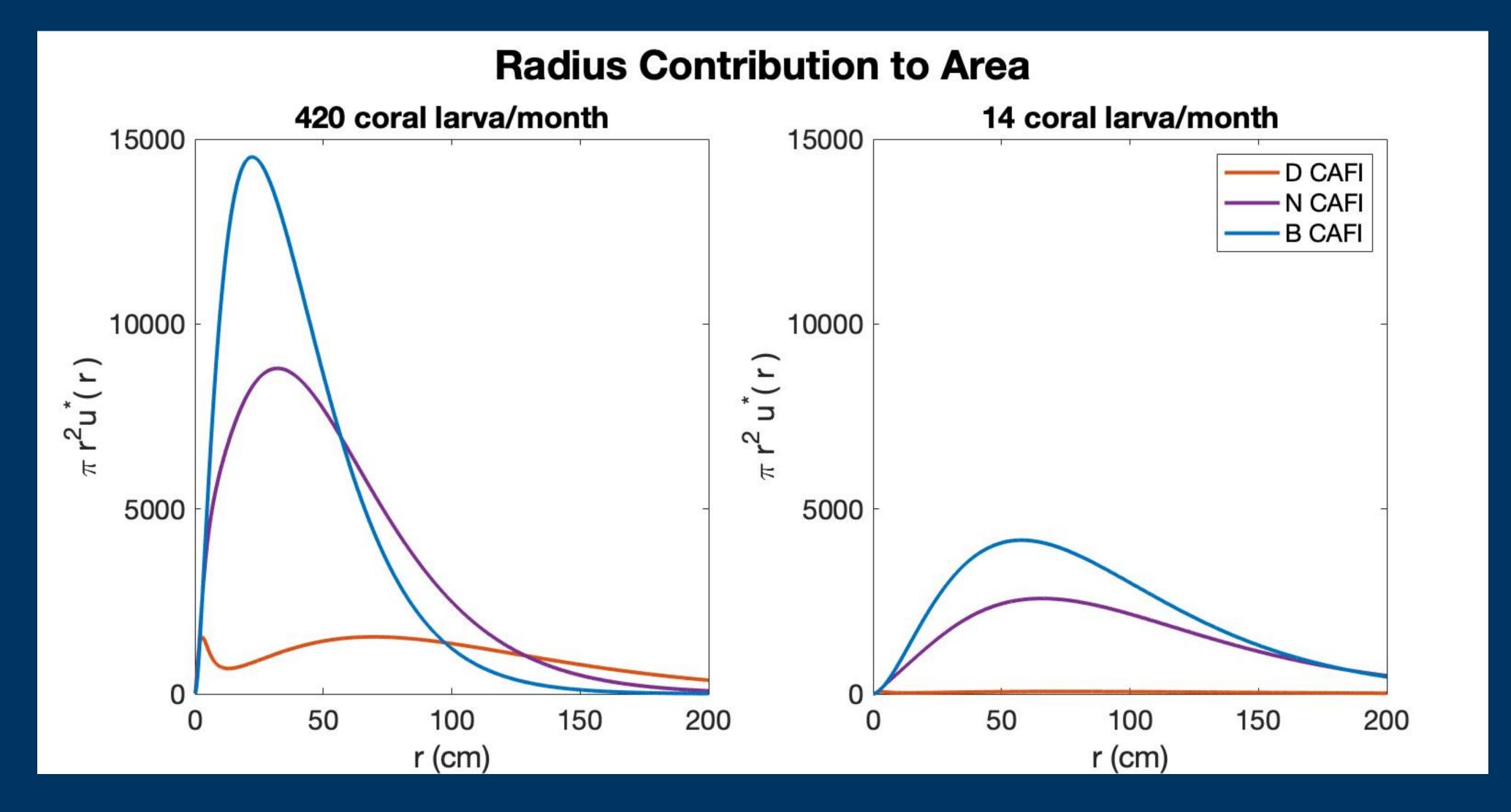
Visualizing the Size-Density-Sample Environments



Visualizing the Size-Density-Sample Environments



Visualizing the Size-What Corals do the eyes see?



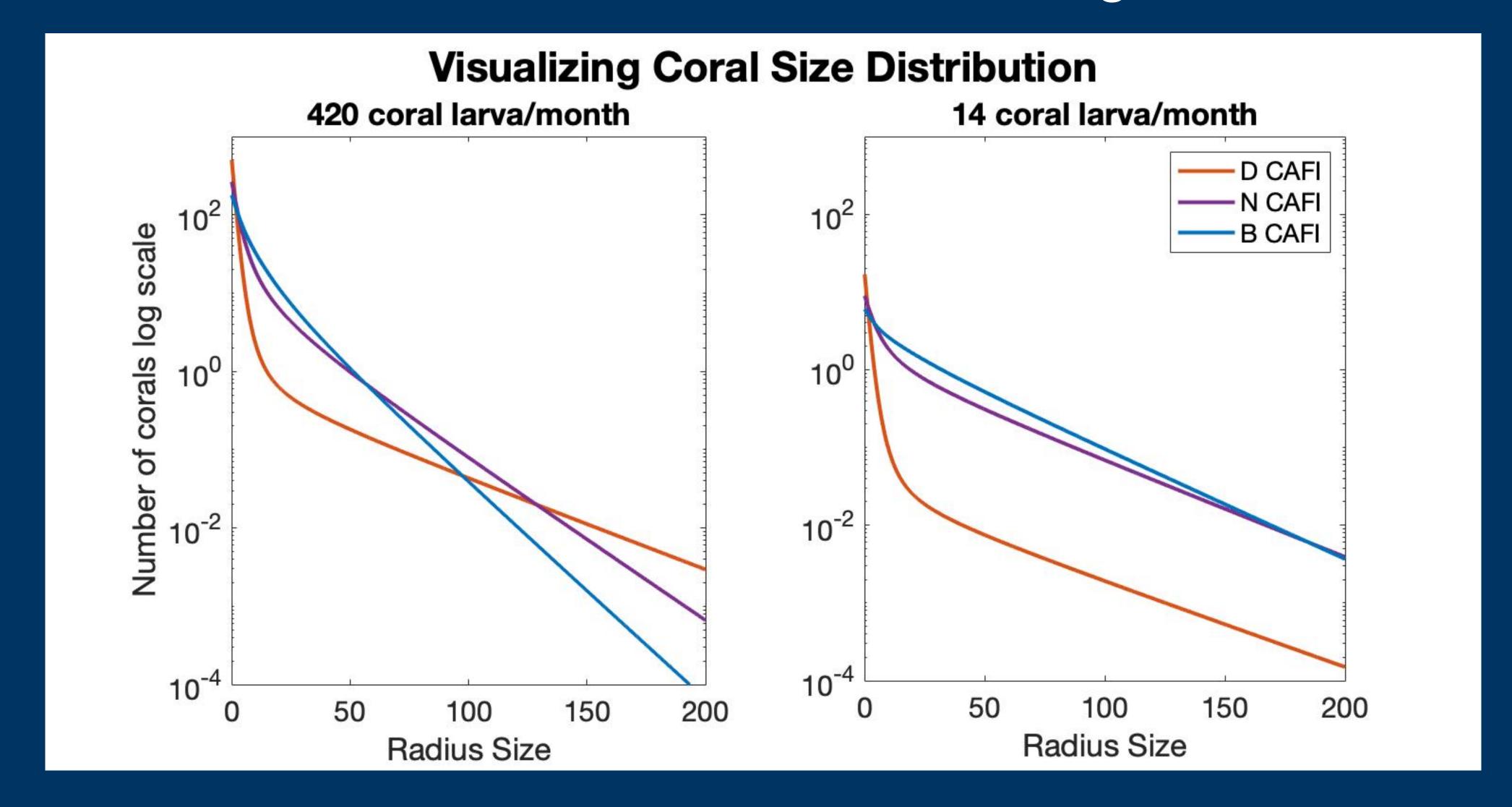
#### Spatially well-mixed deterministic PDE Deleterious CAFI Promote More Small and Large Corals

#### Biological intuition:

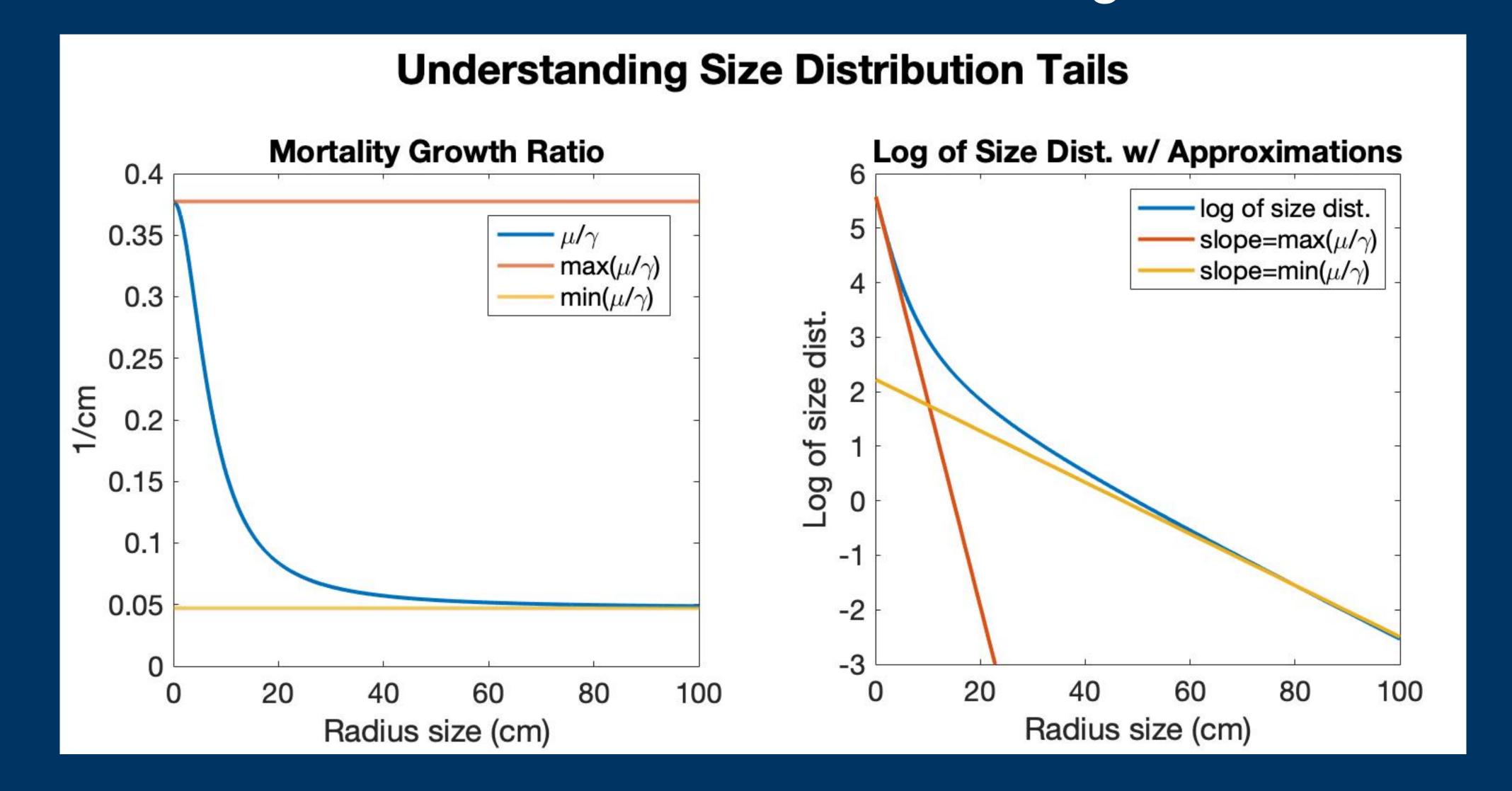
- If a coral survives deleterious CAFI, plenty room for growth
  - Corals either are small, or get rather large
- Beneficial CAFI help fill environment
  - Corals are all about 'medium' sized
- Theorem: For  $\phi_1 < \phi_2$  that admit  $\bar{u}_1(r), \bar{u}_2(r)$  (where  $A_1 < A_2$ ) then

$$\lim_{r \to 0} \frac{\bar{u}_2(r)}{\bar{u}_1(r)} < 1 \text{ and } \lim_{r \to \infty} \frac{\bar{u}_2(r)}{\bar{u}_1(r)} < 1.$$

### **Spatially well-mixed deterministic PDE**Deleterious CAFI Promote More Small and Large Corals



### **Spatially well-mixed deterministic PDE**Deleterious CAFI Promote More Small and Large Corals



### Spatially well-mixed deterministic PDE Expected Maximum Coral

• By CAFI density definitions, we observe that for  $r > r^*$ 

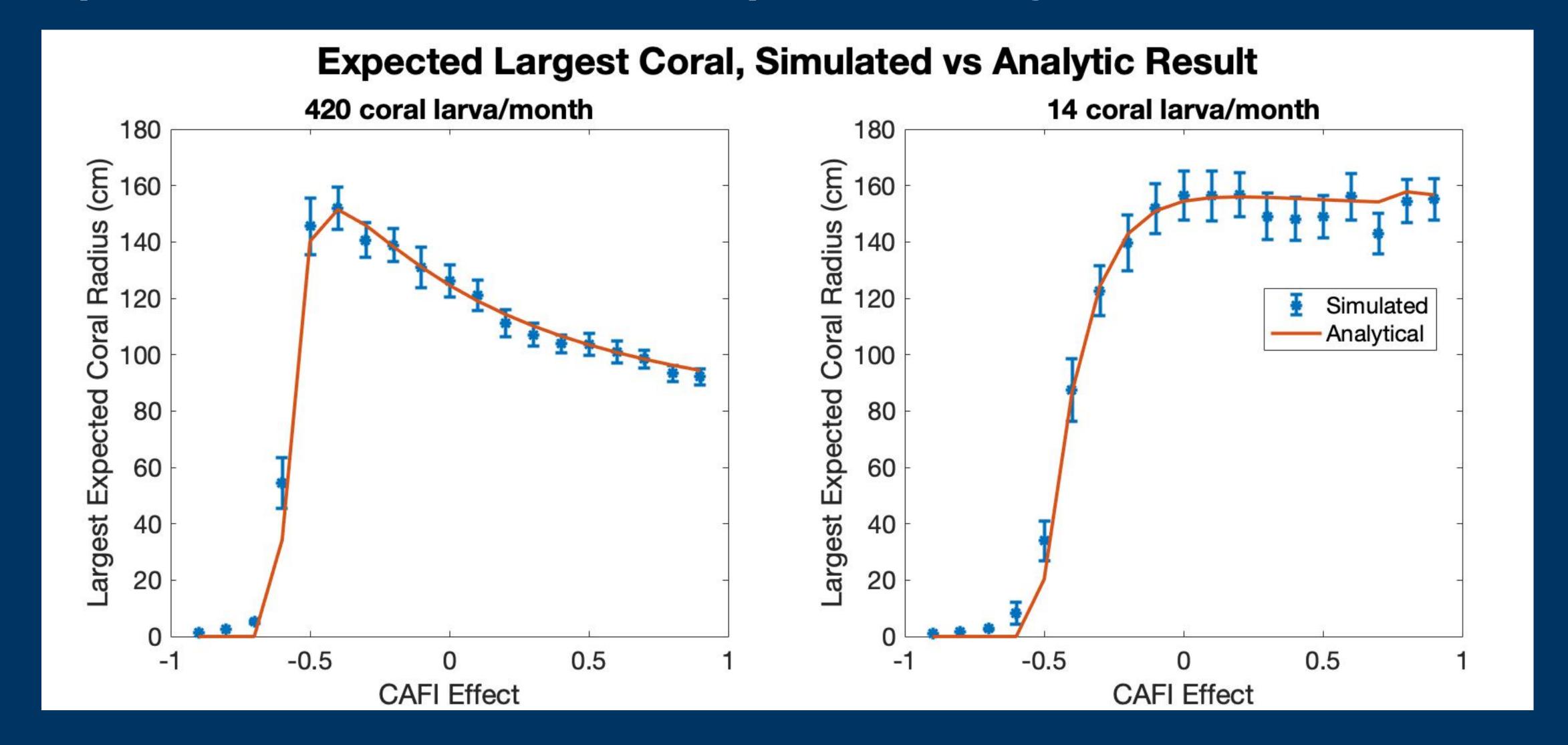
$$\bar{u}(r) = C \exp \{-\nu r\} \text{ where } \nu = \min \{\mu(A, r)/\gamma(A, r)\}$$

We can define a probability dist.

$$Pr(R_i > r) = \frac{C}{||\bar{u}(r)||} exp\{-\nu r\}$$

Analytically derive expected max sized coral according to Gumble Distribution

**Expected Maximum Coral-Sampled vs Analytic** 



## Spatially well-mixed deterministic PDE Concluding Remarks

- Qualitative similarities to spatially explicit, 1-D stochastic model (Hamman)
  - Stochastic: Establish clustering patterns
  - Deterministic: Speed
- Unanwsered question: Analytically showing convergence of occupied area
  - limit point, no oscillations
- Extensions: Incorporating 'disaster' to analyze CAFI effect on regrowth

#### Thank you!