

# Extinction, Fixation, and Invasion in an Ecological Niche

MattheW Badali

Internal defense  
performed as a requirement for  
the degree of Doctor of Philosophy  
4 July 2019

# Motivation: Biodiversity

Coexistence  
and  
Extinction of  
Competing  
Species

M.A.Badali

Background

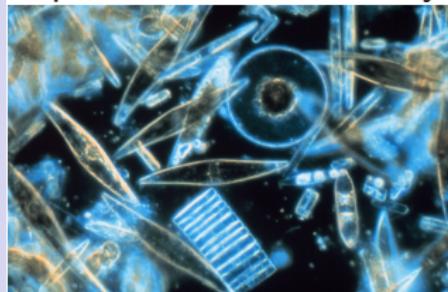
Fixation

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Discussion

Extra Slides

## Paradox of the Plankton a problem of biodiversity



corp2365, NOAA Corps Collection

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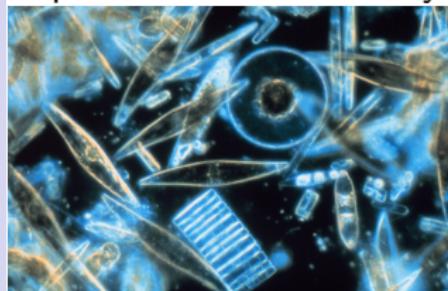
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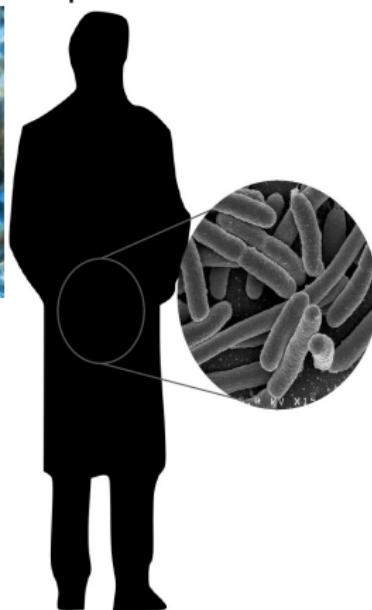
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Gut Microbiome  
important to health



E. coli, Rocky Mountain  
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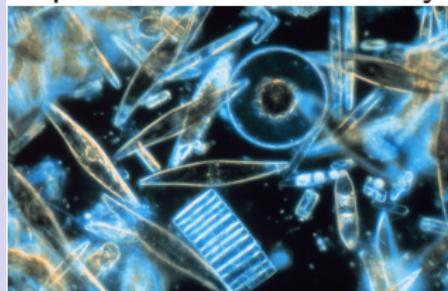
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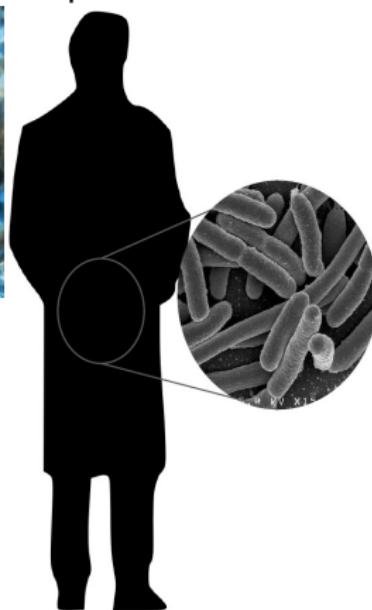
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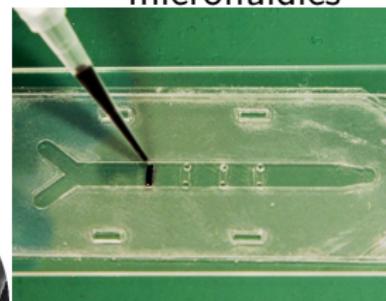
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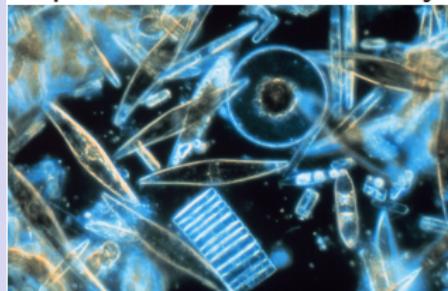
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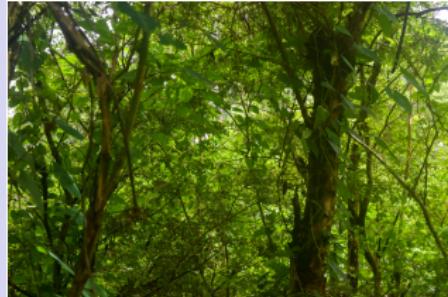
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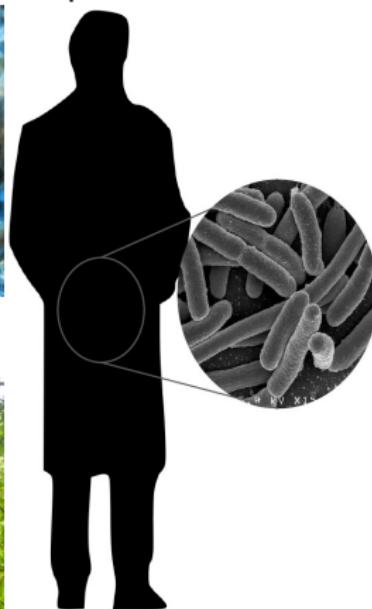


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Conservation Efforts

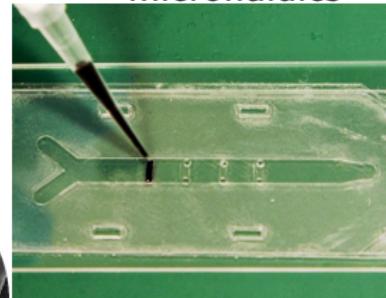


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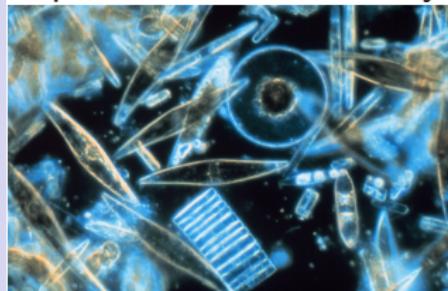
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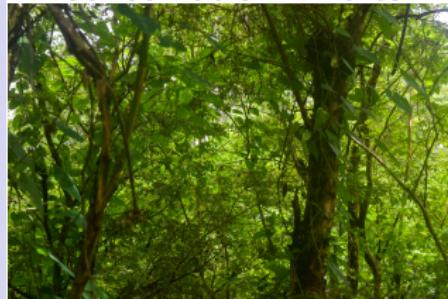
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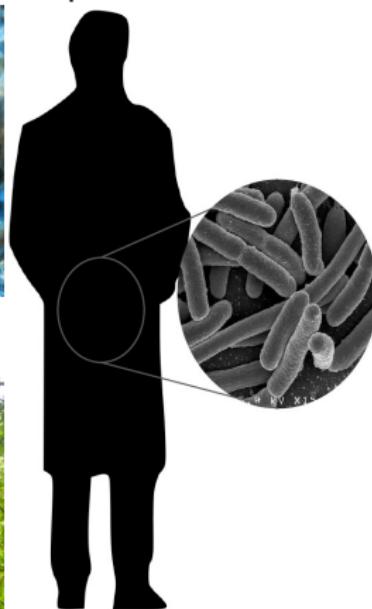


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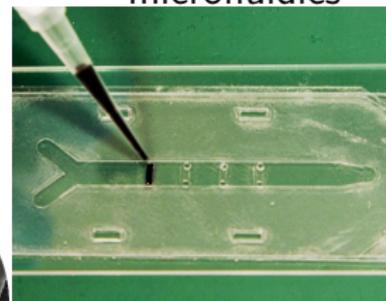


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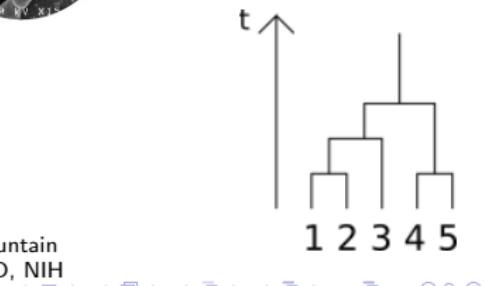
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Coalescent Trees



# Niche Apportionment Explains Abundance Curves

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Background

Fixation

Invasion

Discussion

Extra Slides

## Competitive Exclusion Principle

- “two species cannot coexist if they share a single [ecological] niche”
- niche/resource apportionment explains abundance distributions (biodiversity)
- classic niche theory is Lotka-Volterra/logistic

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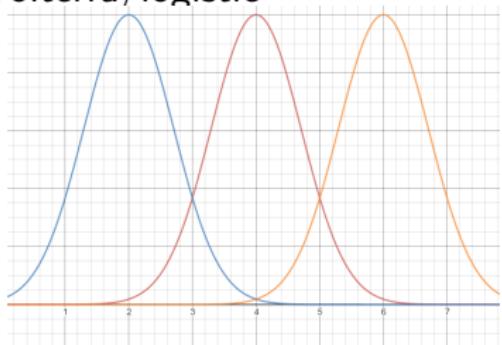
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Discussion

Extra Slides

## Competitive Exclusion Principle

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- niche/resource apportionment explains abundance distributions (biodiversity)
- classic niche theory is Lotka-Volterra/logistic
- species: group with the same birth and death rates
- niche: survivable values of those factors which affect the birth and death rates



# Stochasticity Leads To Extinction

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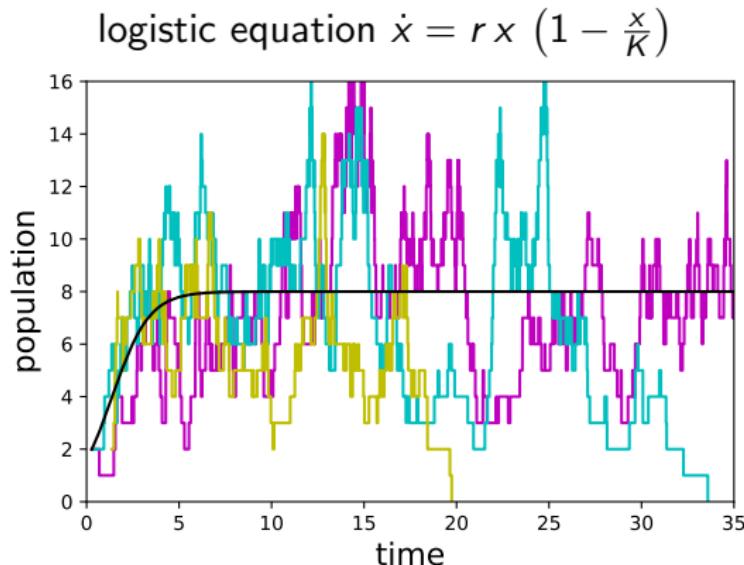
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Fixation

Invasion

Discussion

Extra Slides



- demographic stochasticity = fluctuations, noise

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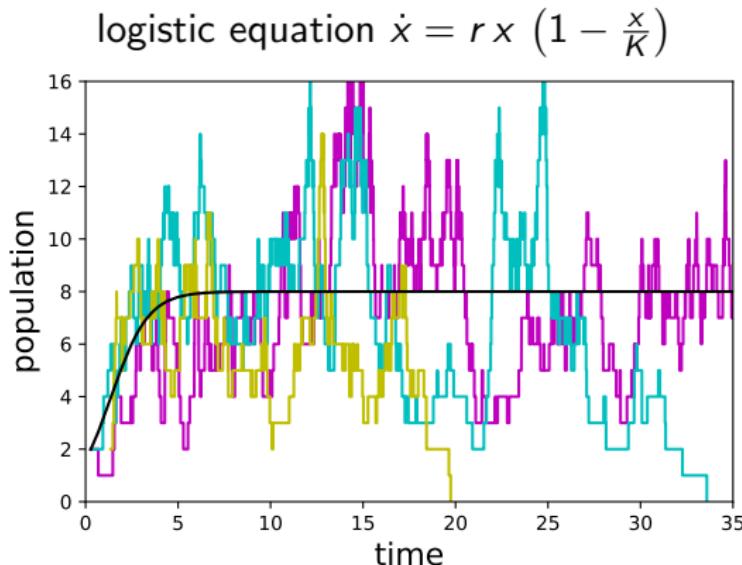
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Fixation

Invasion

Discussion

Extra Slides



- demographic stochasticity = fluctuations, noise
- probability of population  $n$ :  $P_n$
- mean time to extinction:  $\tau \sim e^K$

# Neutral Theory Explains Abundance Curves Better

Coexistence  
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Background

Fixation

Invasion

Discussion

Extra Slides

- better prediction of abundance curves (Hubbell), also allele frequencies (Kimura), fixation (Moran)
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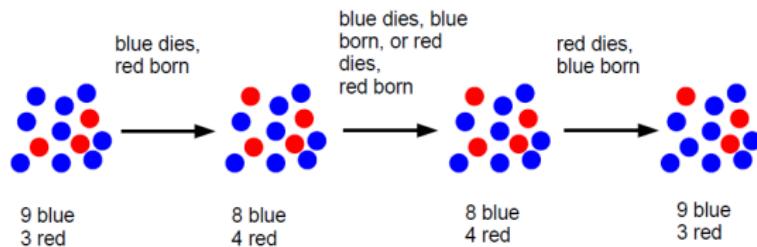
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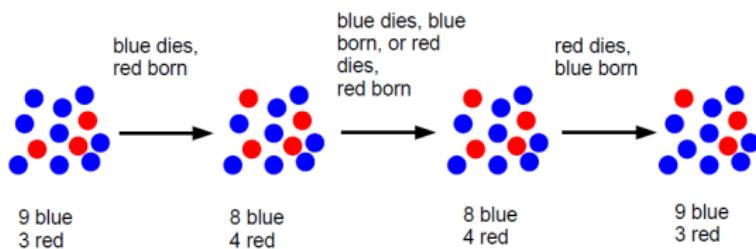
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- $\tau \sim K$
- biodiversity comes from a balance of species exiting (extinction, fixation) and species entering (invasion, immigration) the system

# Main Goals Of My Research

Coexistence  
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Background

Fixation

Invasion

Discussion

Extra Slides

There is a correspondence between niche and neutral theories:  
How do the times transition?

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Background

Fixation

Invasion

Discussion

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Background

Fixation

Invasion

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- Invasion is fast unless two species occupy the same niche

# Fixation versus Coexistence of Two Species

# How To Calculate The Mean Time To Extinction

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Competing  
Species

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Background

Fixation

Invasion

Discussion

Extra Slides

Master equation  $\dot{\vec{P}}(t) = \hat{M}\vec{P}(t)$  is solved by  $\vec{P}(t) = e^{\hat{M}t}\vec{P}(0)$ .

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- Fokker-Planck:

$$\partial_t P_x = -\partial_x ((b_x - d_x)P_x) + \frac{1}{2K} \partial_x^2 ((b_x + d_x)P_x)$$

- $P_n \approx \frac{1}{\sqrt{2\pi\sigma^2}} \exp \left\{ -\frac{(n-n^*)^2}{2\sigma^2} \right\}$  with  $\sigma^2 = \frac{-(b_n+d_n)|_{n^*}}{2\partial_n(b_n-d_n)|_{n^*}}$

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- WKB ansatz:  $P_n \propto \exp\left\{K \sum_i \frac{1}{K^i} S_i(n)\right\}$  with  $S_0(n) = \int_0^n dx \ln(b_x/d_x)$  along extinction trajectory

# Coupled Logistic Equations Include Competitive Exclusion

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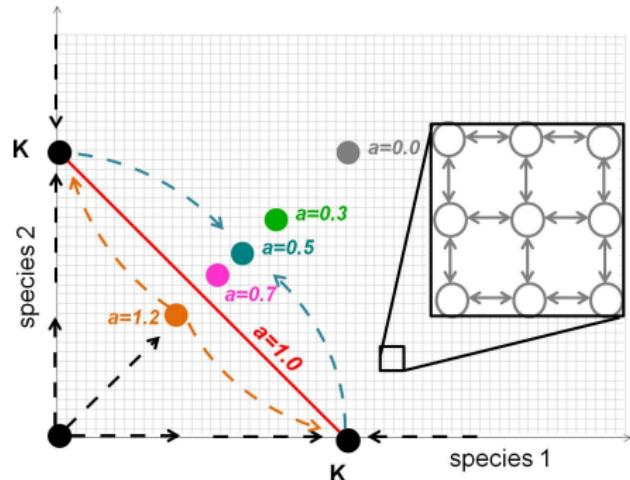
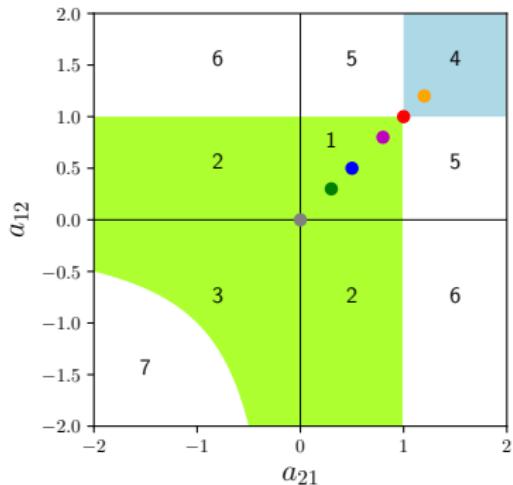
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Invasion

Discussion

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$$\dot{x}_1 = r_1 x_1 \left(1 - \frac{x_1 + a_{12}x_2}{K_1}\right) \text{ and } \dot{x}_2 = r_2 x_2 \left(1 - \frac{a_{21}x_1 + x_2}{K_2}\right)$$



$$O = (0, 0), A = (0, K_2), B = (K_1, 0), C = \left(\frac{K_1 - a_{12}K_2}{1 - a_{12}a_{21}}, \frac{K_2 - a_{21}K_1}{1 - a_{12}a_{21}}\right)$$

2,6 = parasitism/predation/antagonism, 3,7 = mutualism,

4,5 = competitive exclusion, 1 = (weak) competition

# How The System Transitions To Neutrality

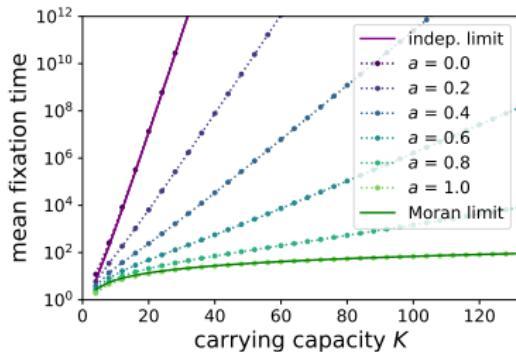
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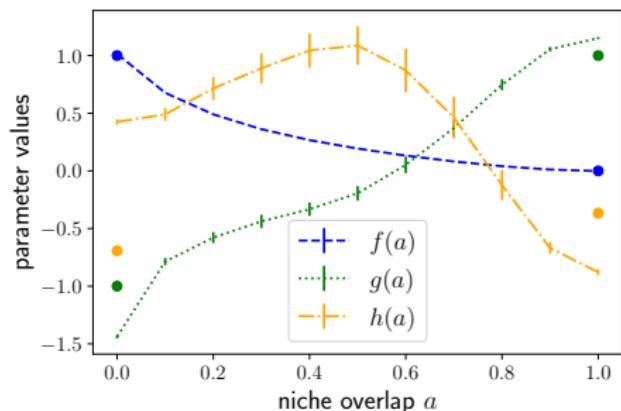
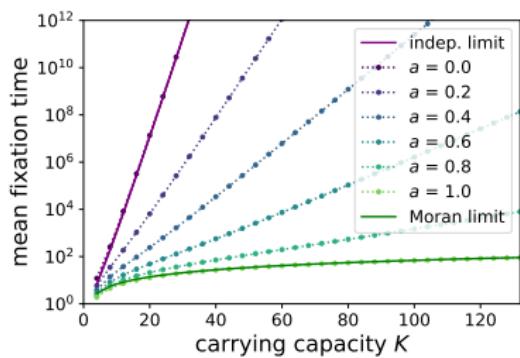
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**Effective coexistence except with complete niche overlap!**

# The Speed of Invasion of a Second Species

# Invasion - Definition And Expectations

Coexistence  
and  
Extinction of  
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Background

Fixation

Invasion

Discussion

Extra Slides

Invasion is going from one organism to half the population.

- invasion is the other part of maintenance of biodiversity

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Fixation

Invasion

Discussion

Extra Slides

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# Invasion - Definition And Expectations

Invasion is going from one organism to half the population.

- invasion is the other part of maintenance of biodiversity
- invasion with a fixed point should be fast (logarithmic)
- invasion on the line should be slower (linear)

# Invasion Is Less Probable As Niche Overlap Increases

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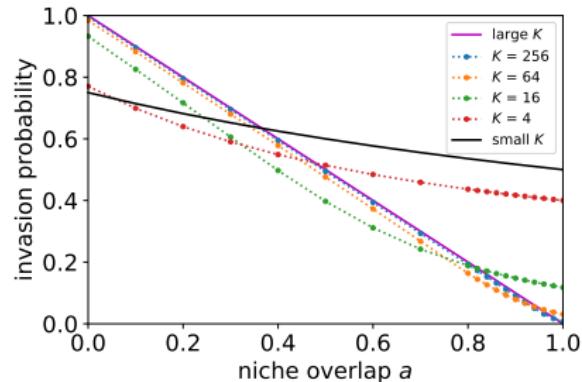
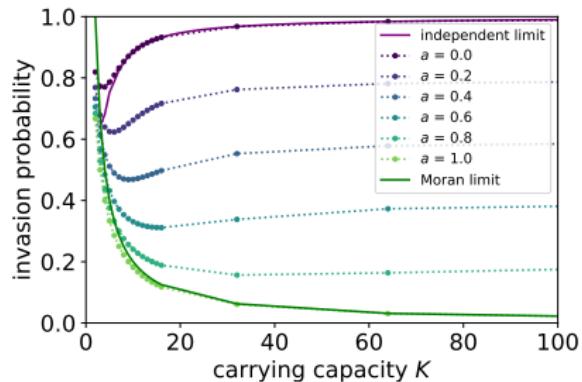
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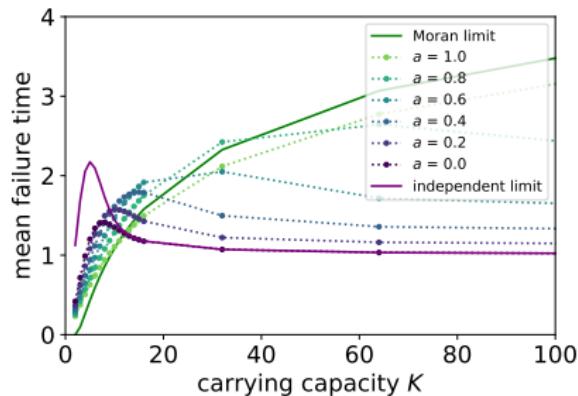
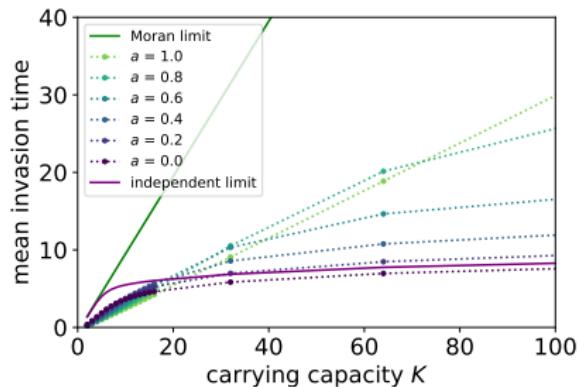
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*Probability of a successful invasion.* Invasion probability lessens as niche overlap increases. The trend is more stark for large  $K$ .

# Invasion Times Are Fast



*Mean time of a successful or failed invasion attempt.*

*Left:* Mean time conditioned on eventual invasion success.

*Right:* Mean time conditioned on failed attempt.

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**Background**

**Fixation**

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**Discussion**

**Extra Slides**

# Discussion

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Extinction of  
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Background

Fixation

Invasion

Discussion

Extra Slides

- two species will effectively coexist unless they have exactly the same niche;

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Background

Fixation

Invasion

Discussion

Extra Slides

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- similarly, greater niche overlap leads to longer invasion times, and less likelihood of success of an attempt;

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Background

Fixation

Invasion

Discussion

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- two species will effectively coexist unless they have exactly the same niche;
- similarly, greater niche overlap leads to longer invasion times, and less likelihood of success of an attempt;
- incomplete niche overlap is a niche theory with carrying capacities modified by niche overlaps;

# Utility Of My Results

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Background

Fixation

Invasion

Discussion

Extra Slides

- human health (gut microbiome)
- planet health (conservation)
- minimal working models
- coalescent theory
- plasmids
- mitochondria

# Potential Future Research

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Background

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Extra Slides

- predator-prey model (centre fixed point)
- rock-paper-scissors model (limit cycle)
- other 3D models (chaos)
- SIR model (epidemics)
- evolving parameters (ecology and evolutionary biology)

**Coexistence  
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# Thank You