

Fundamentals of Ecology

Week 7, Ecology Lecture 4

Cara Brook

February 16, 2023

Let's recap a bit!

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Metapopulations

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- Source-sink theory describes how some subpopulations within a metapopulation act as 'sources' where births outpace deaths, while others act as 'sinks' where deaths outpace births.
- The term 'ecological trap' describes a species' preference for poor quality habitat. When sinks outnumber sources, metapopulation dynamics can actually drive a population to extinction as individuals flock to these traps.

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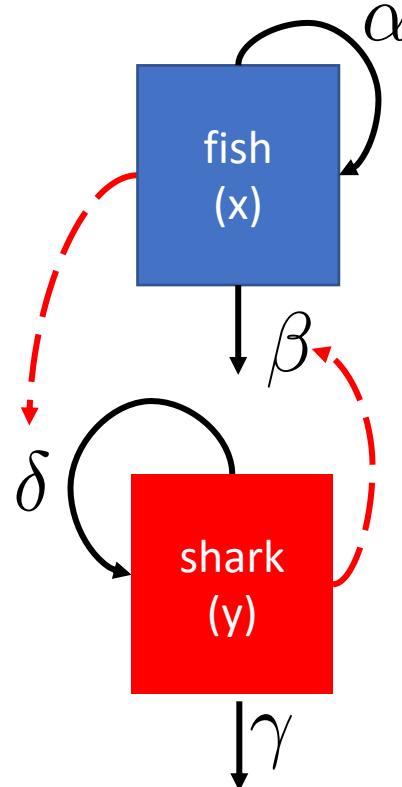
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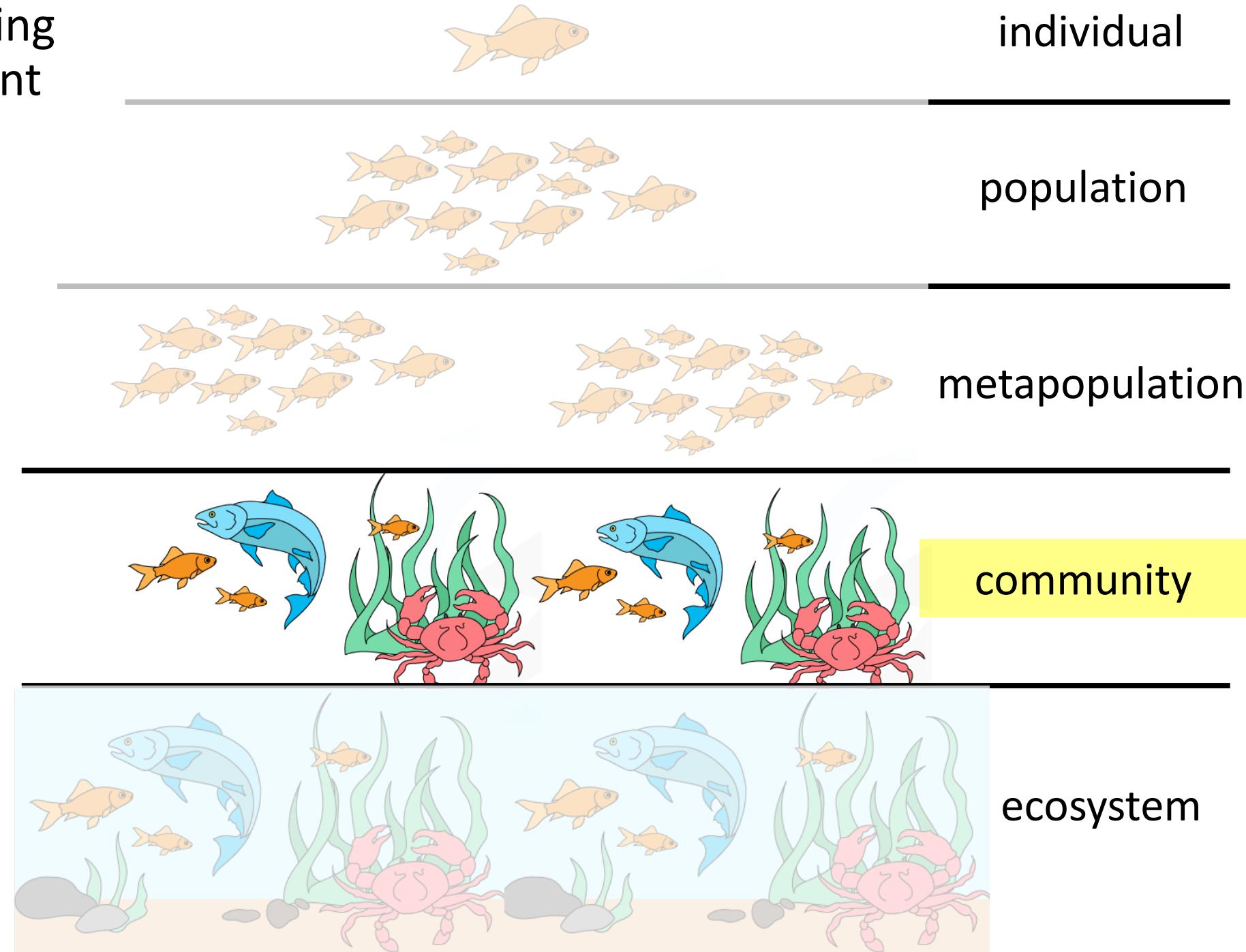
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- Trophic cascades occur when species indirectly interact across 3 trophic levels. We discussed several famous examples: Pisaster, CA sea otter, Yellowstone wolf, wildebeest

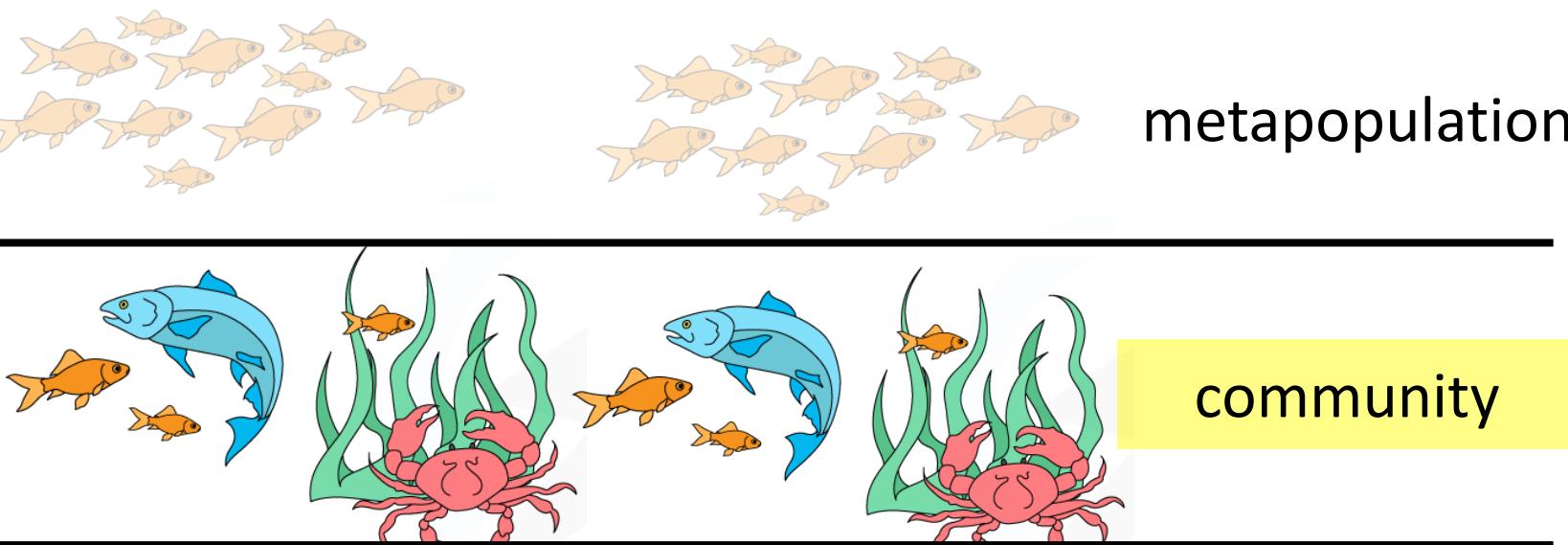
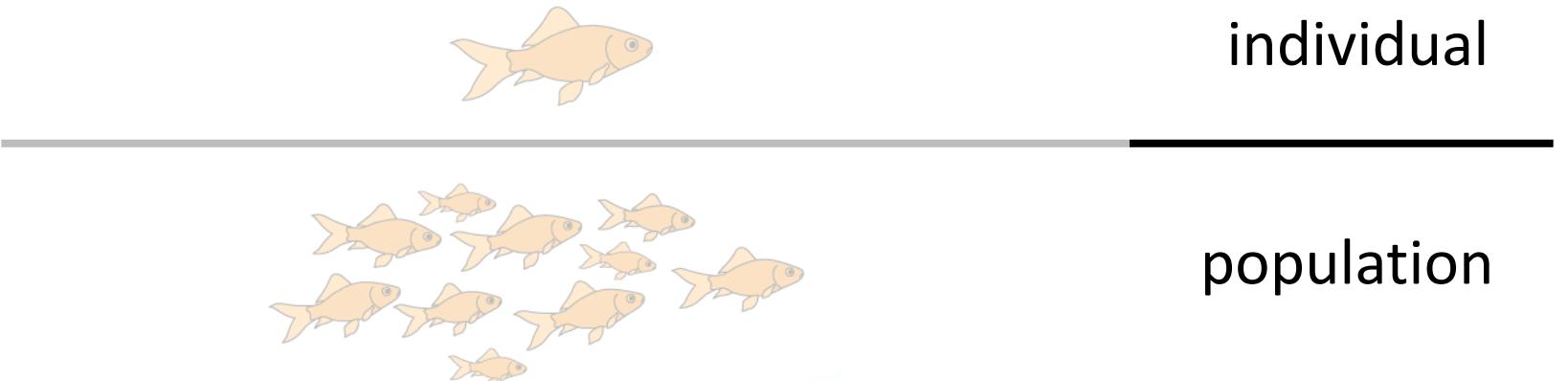
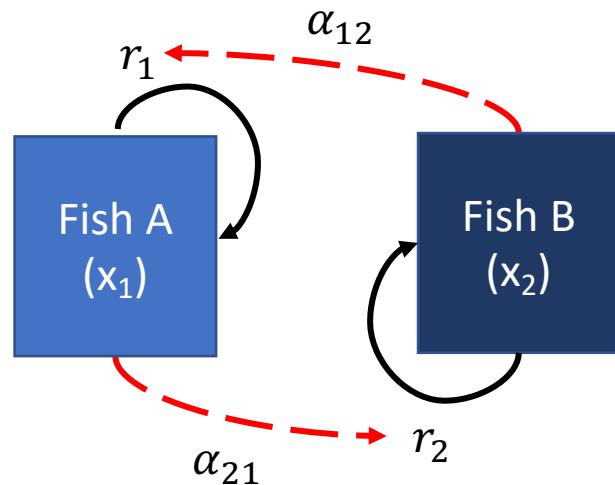
Community = interacting populations of different species



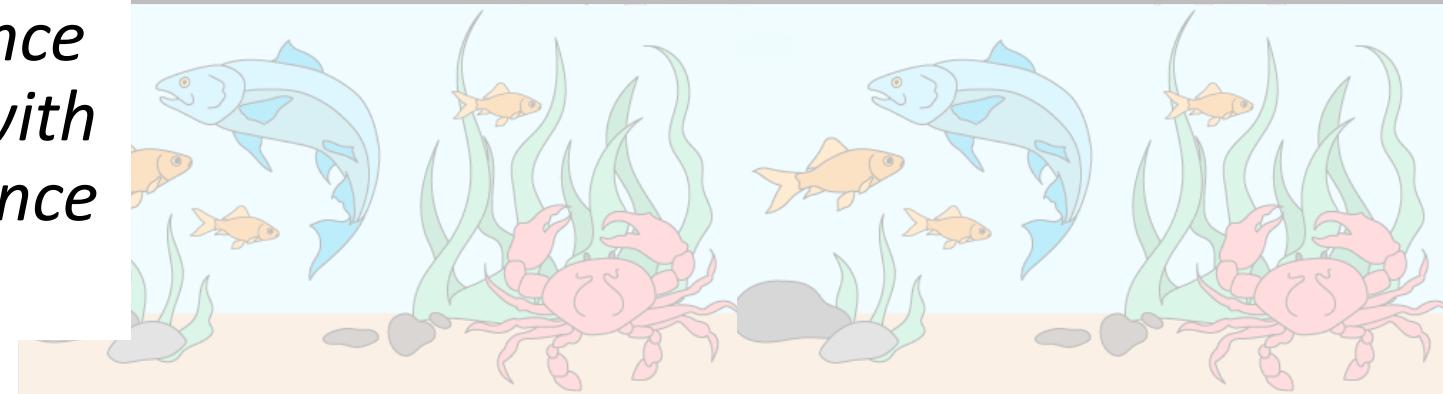
How does fish abundance **vary** with changes in shark abundance?



Community = interacting populations of different species



How does the abundance of **fish species A** vary with changes in the abundance of **fish species B**?



ecosystem

Lotka-Volterra equation can be modified for **interspecies competition**.

$$\frac{dx_1}{dt} = r_1 x_1 \left(1 - \frac{x_1 + \alpha_{12} x_2}{K_1} \right)$$

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competition with
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α_{12} = effect of species 2 on
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α_{21} = effect of species 1 on
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Four equilibria at:

$$x_1^* = 0 ; x_2^* = 0 \quad \text{Trivial.}$$

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$$x_1^* = \frac{K_1 - K_2 \alpha_{12}}{1 - \alpha_{21} \alpha_{12}} ; x_2^* = \frac{K_2 - K_1 \alpha_{21}}{1 - \alpha_{12} \alpha_{21}}$$

Coexistence.

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*x*₂

0

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x_2

0

x_1

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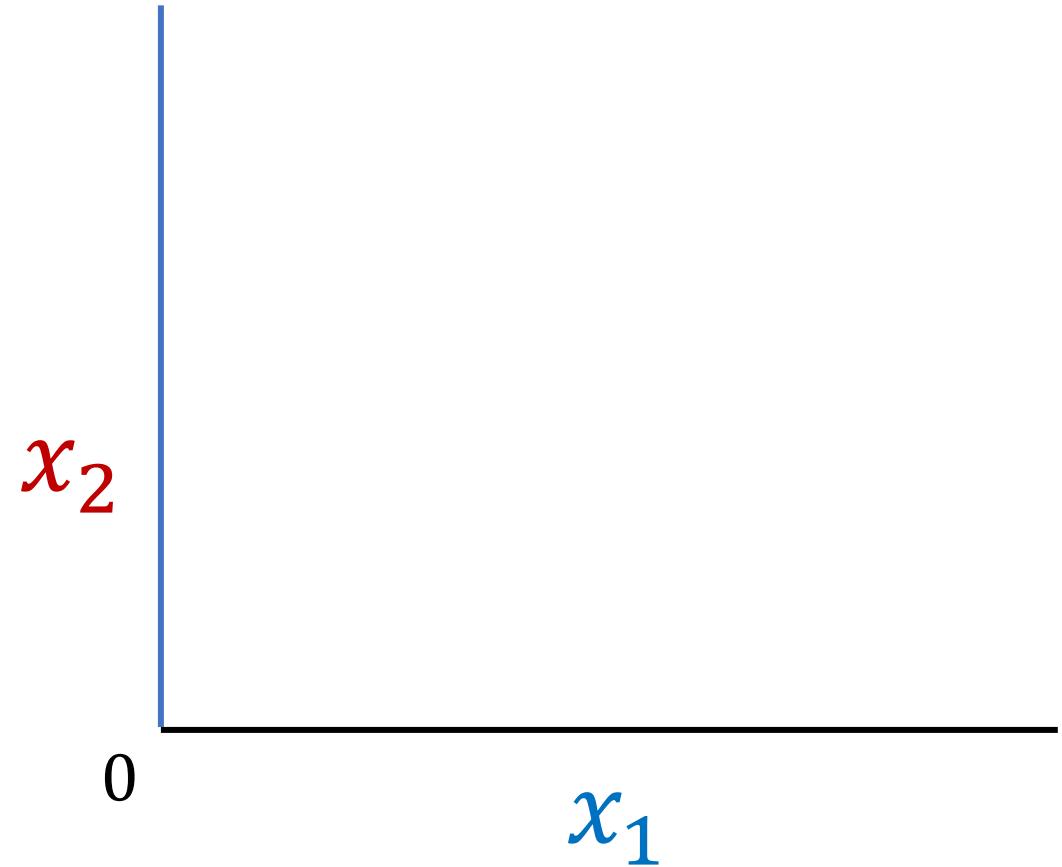
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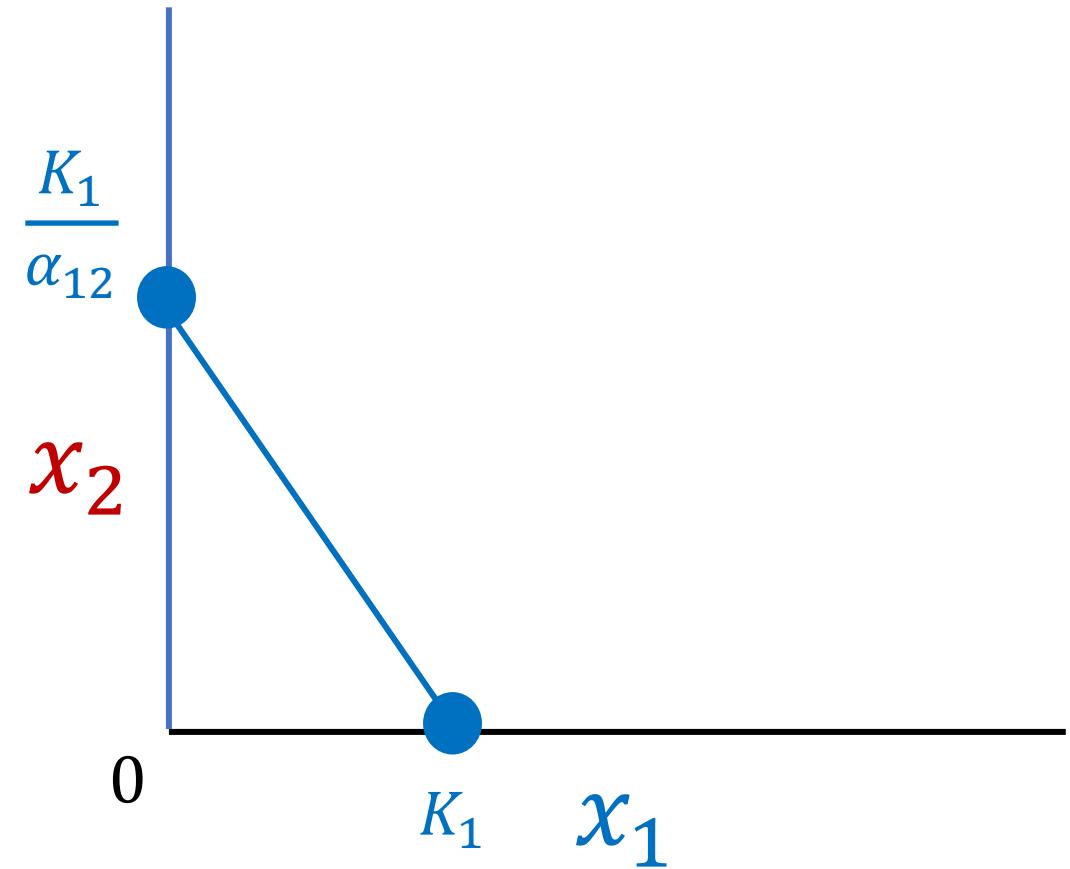
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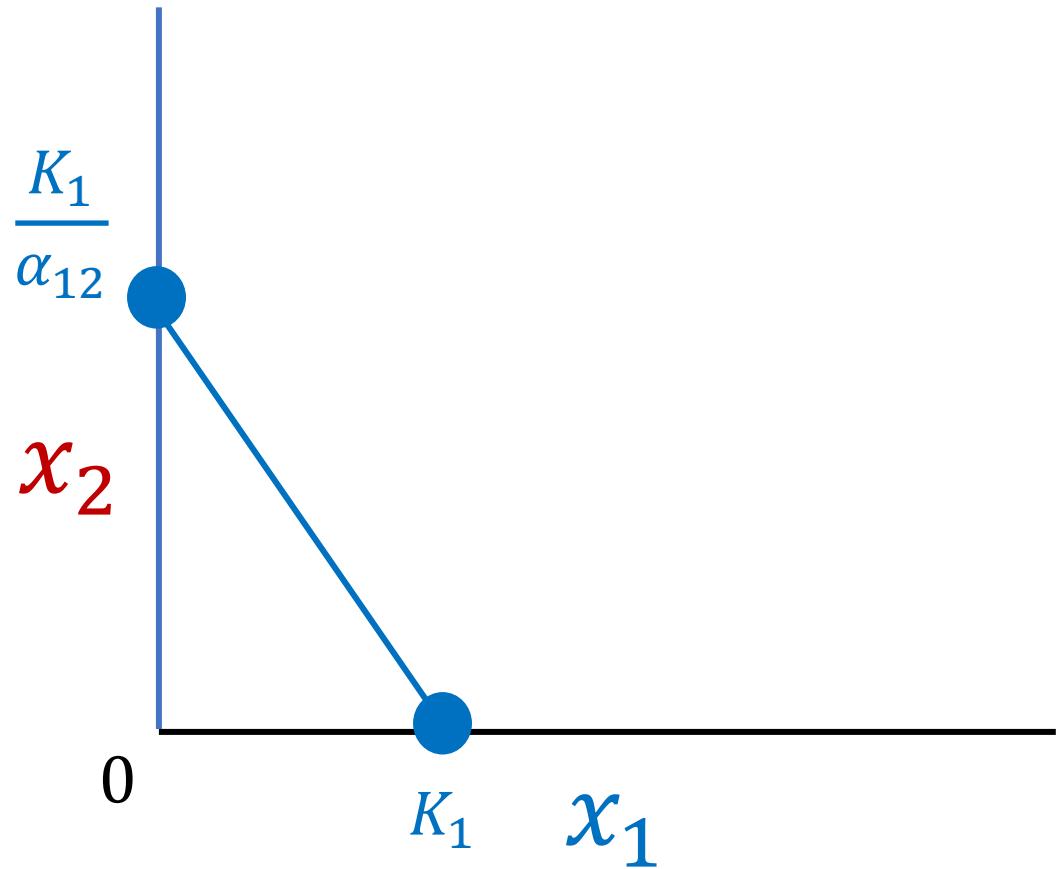
first nullcline at $x_1 = 0$

second nullcline at $x_1 = -\alpha_{12}x_2 + K_1$



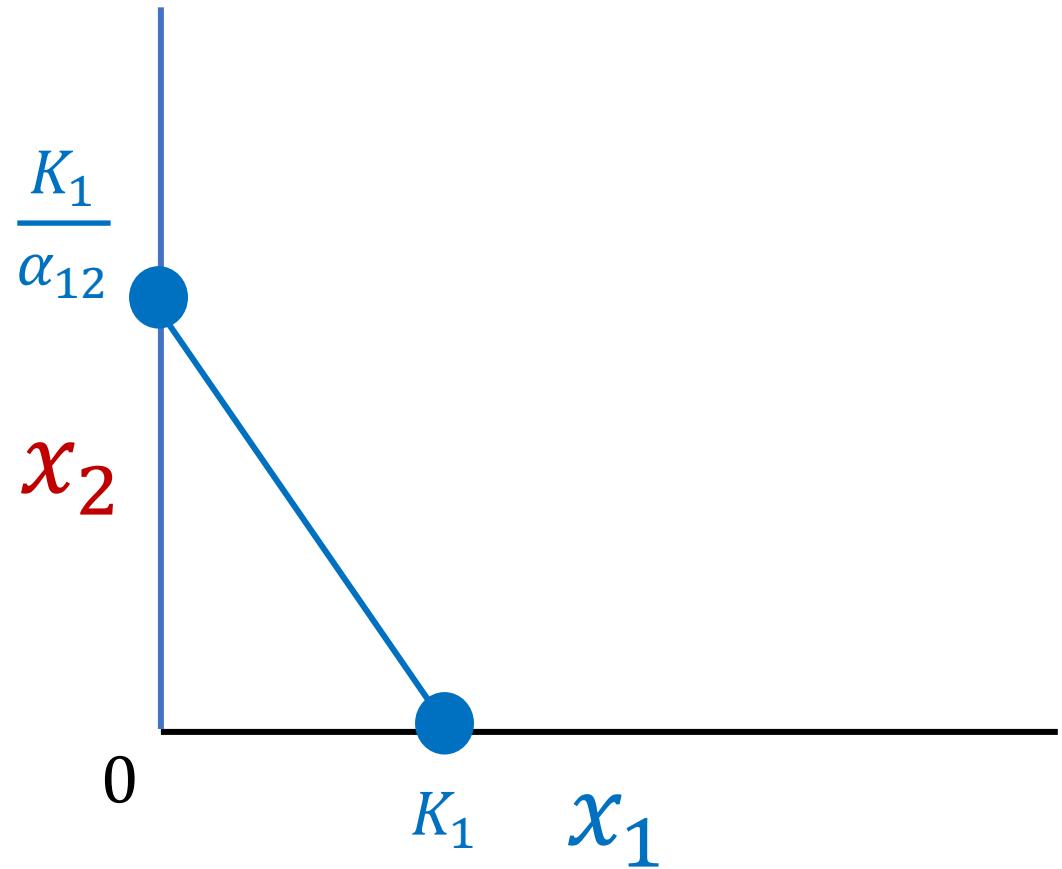
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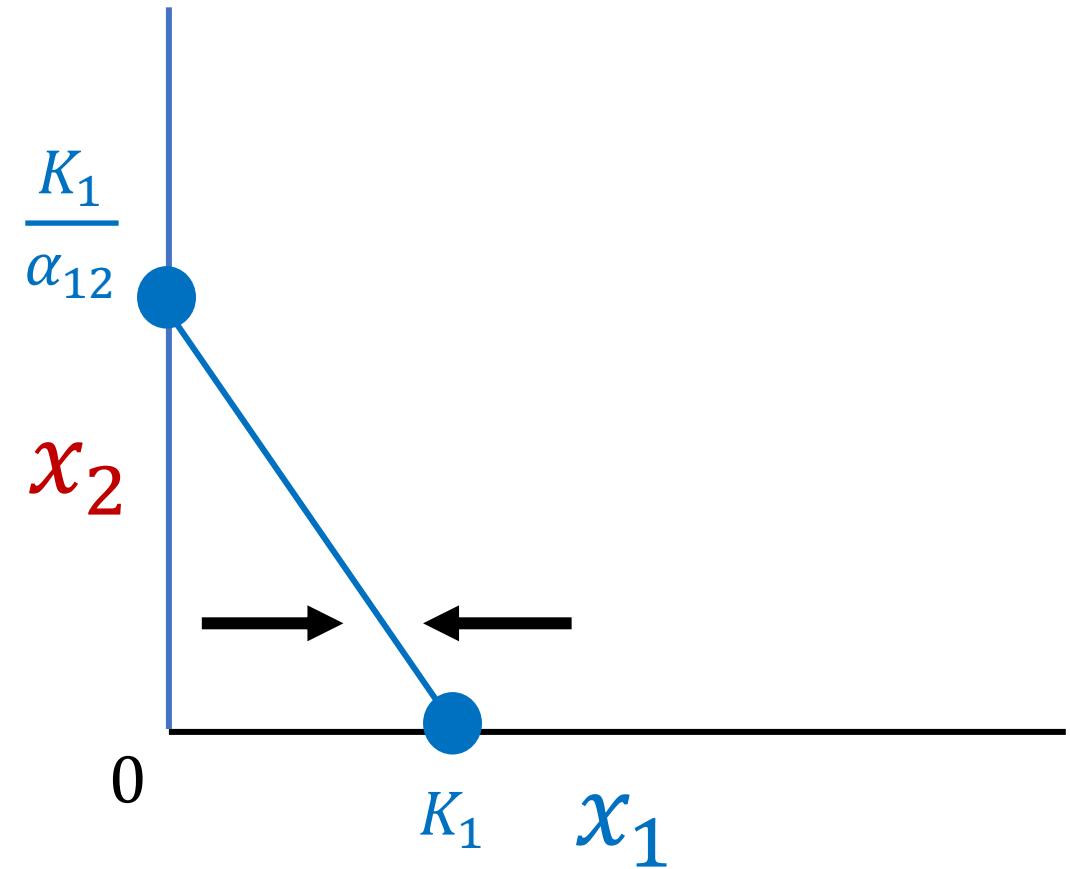
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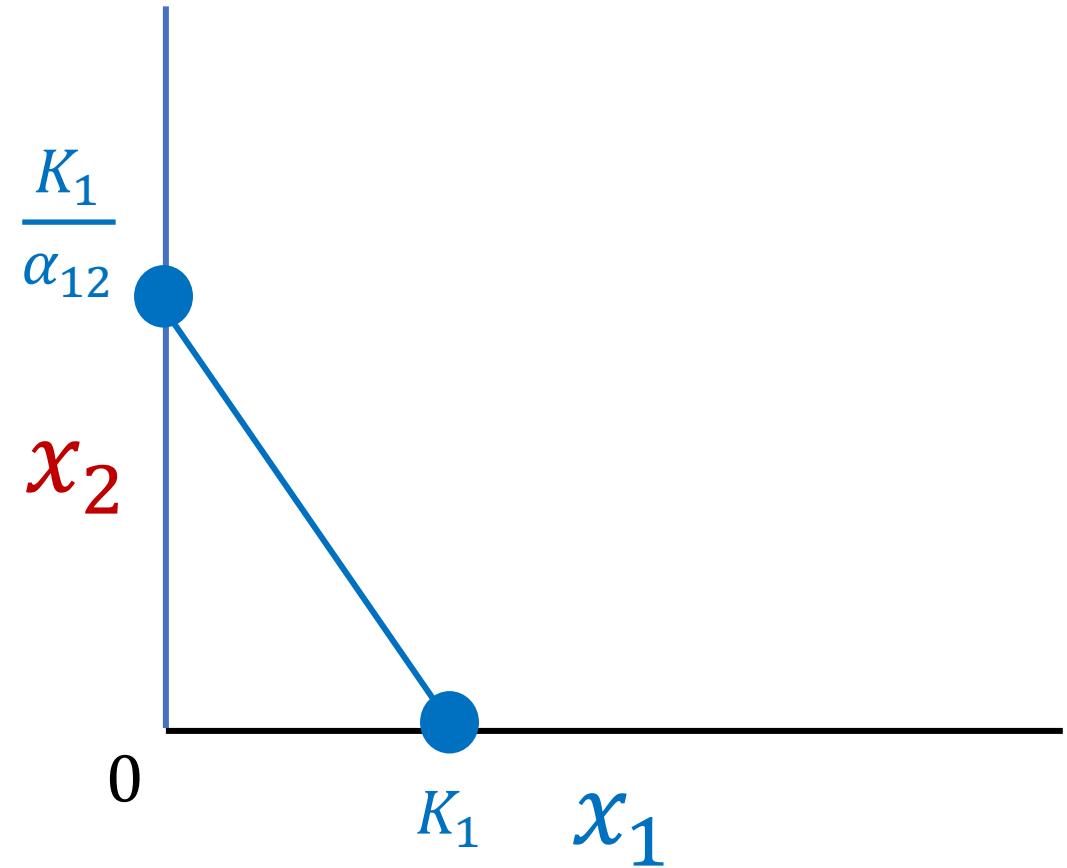
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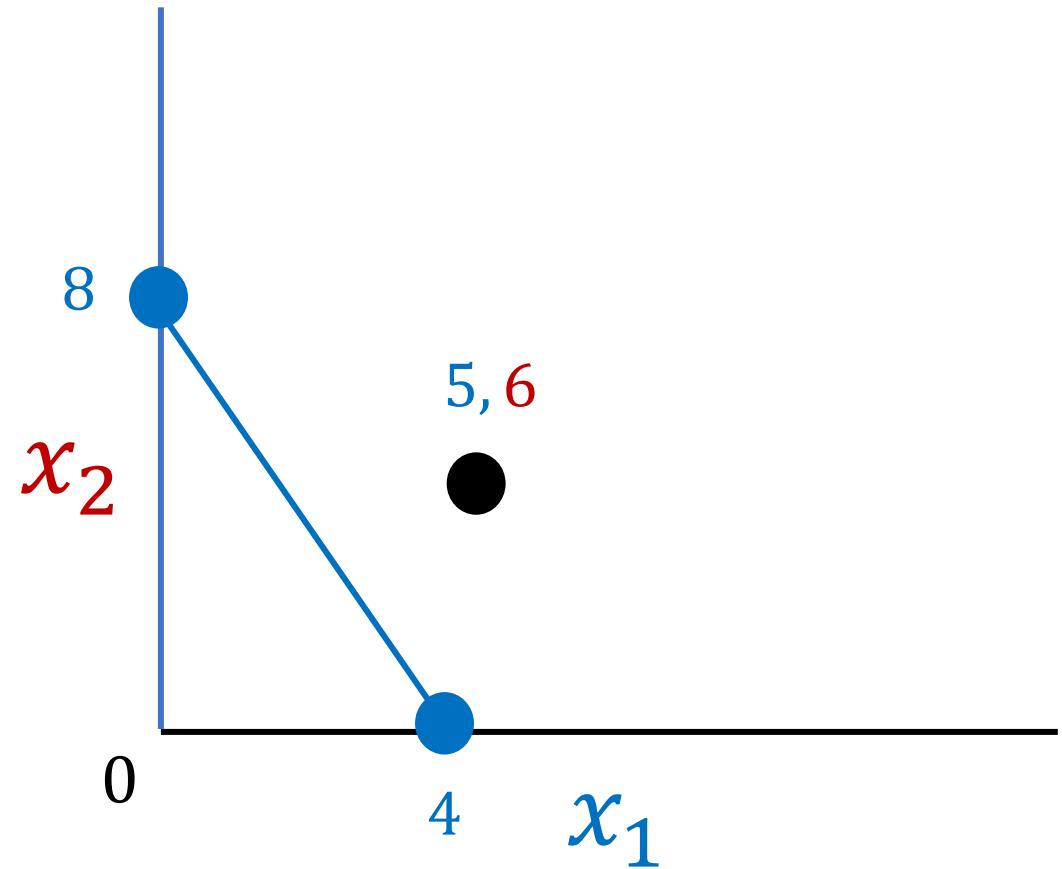
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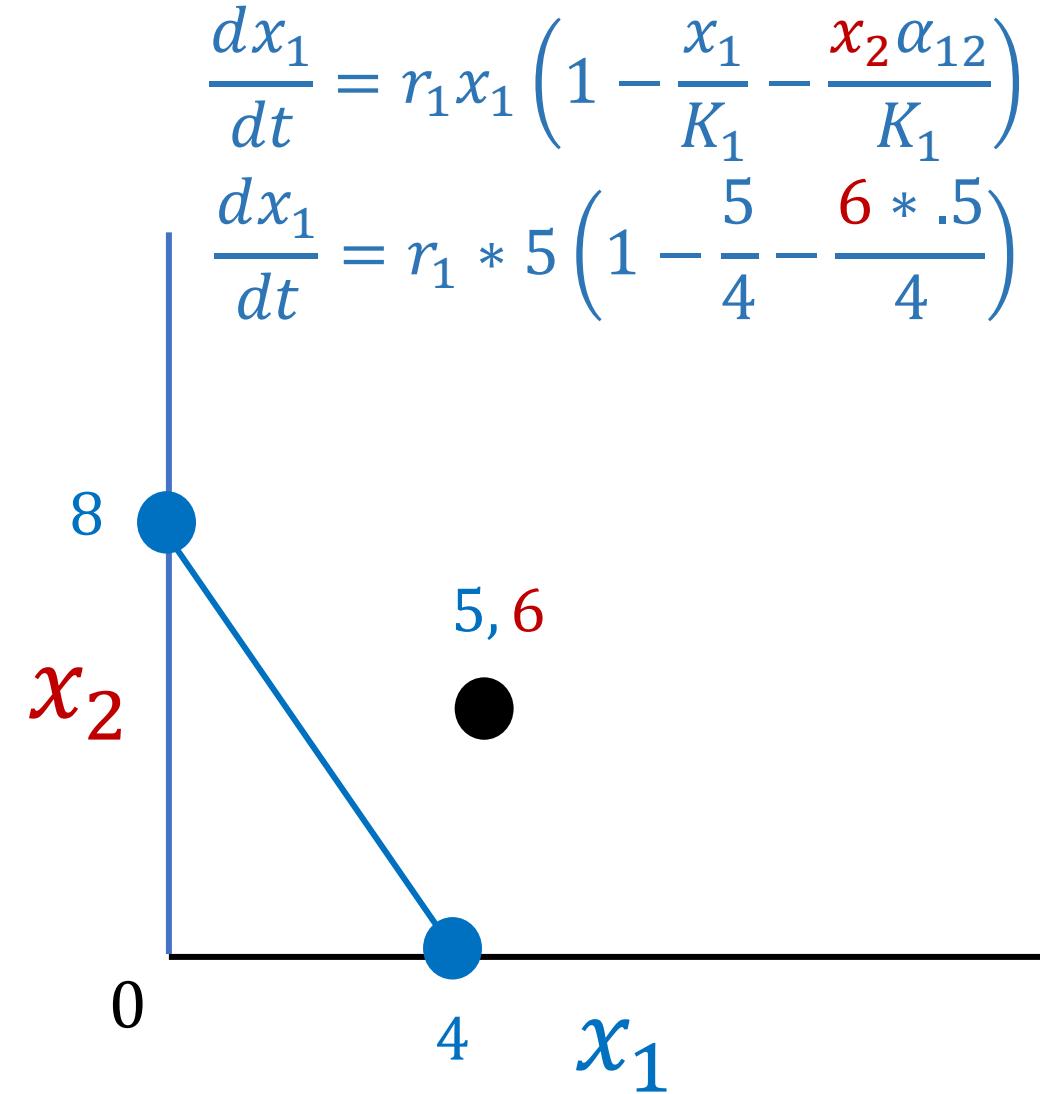
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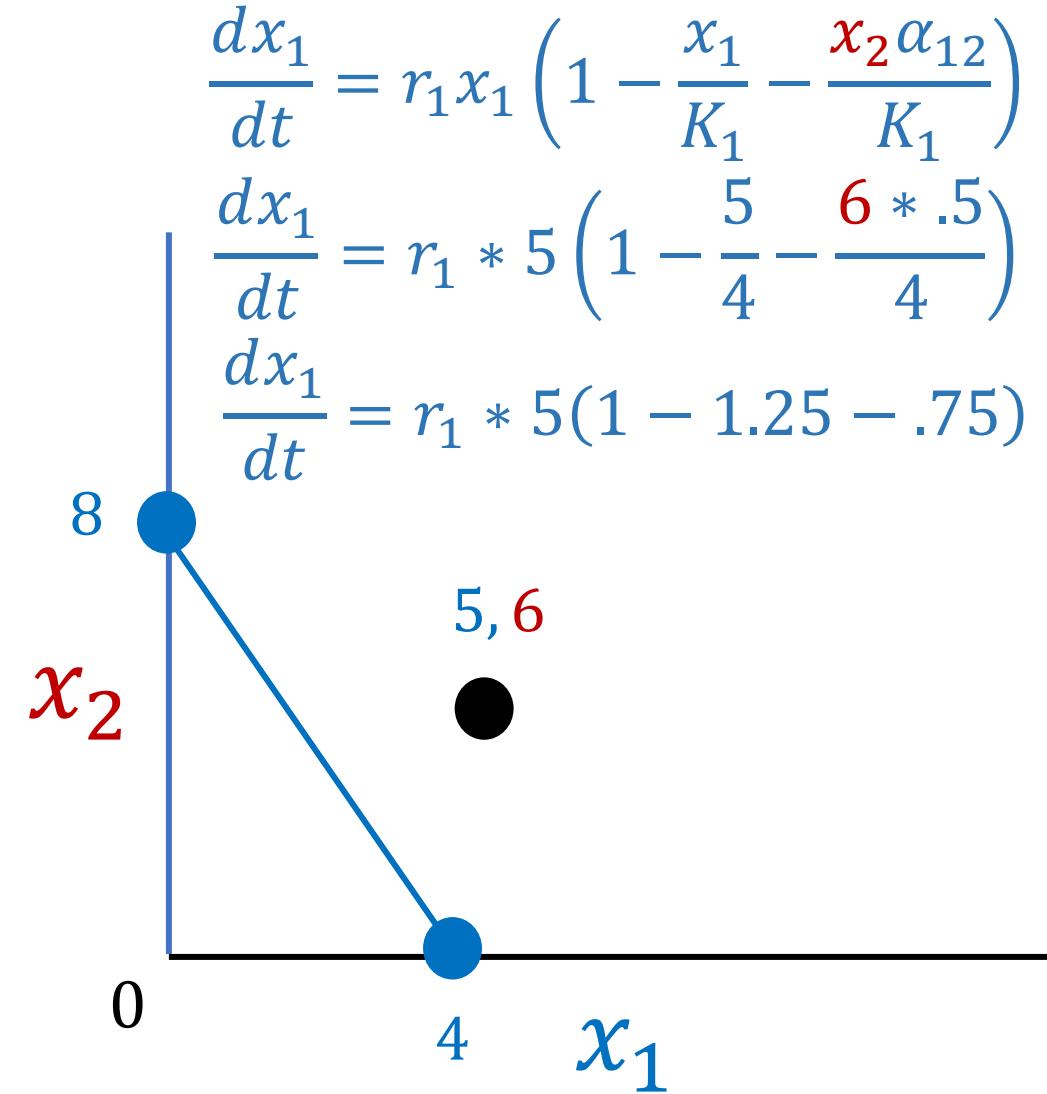
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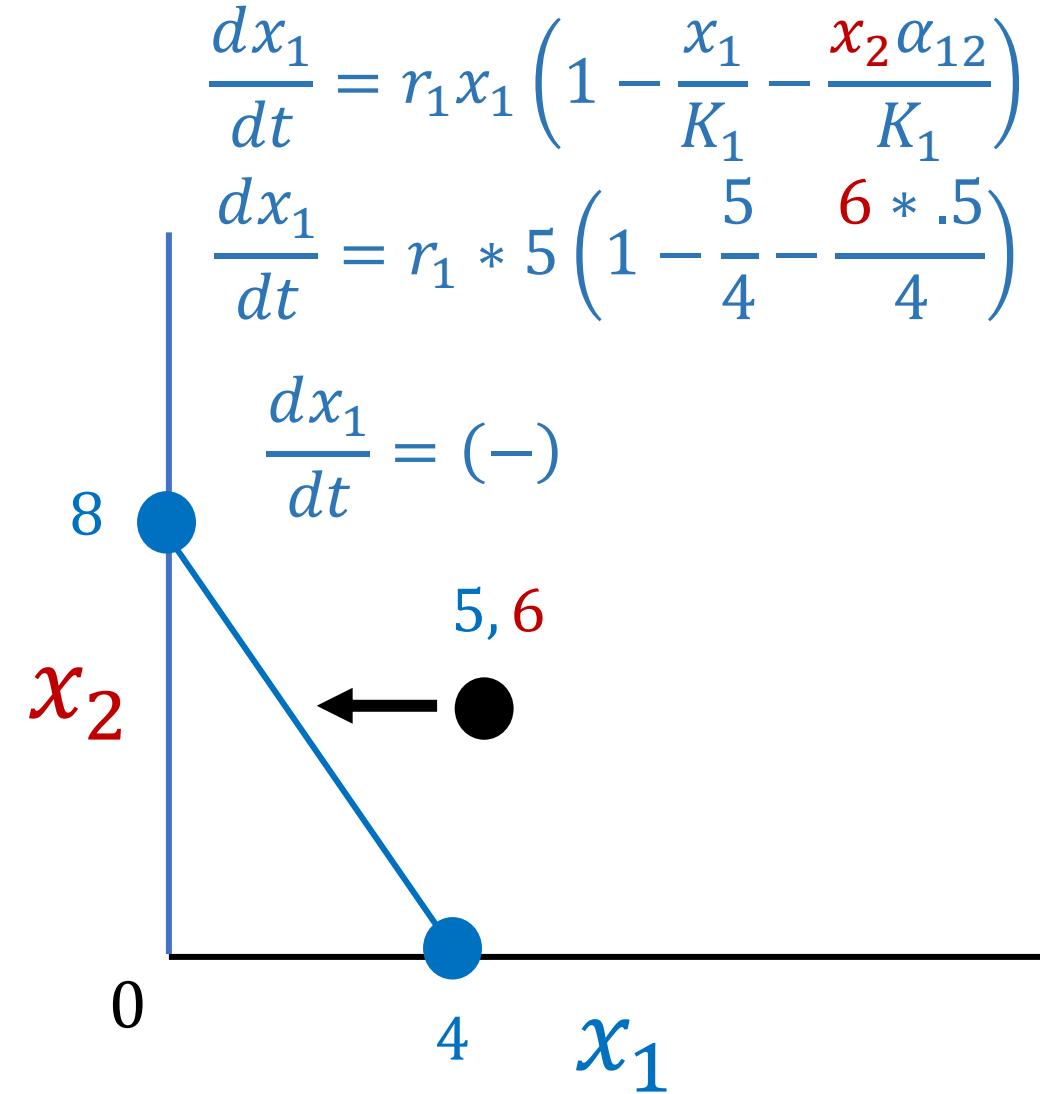
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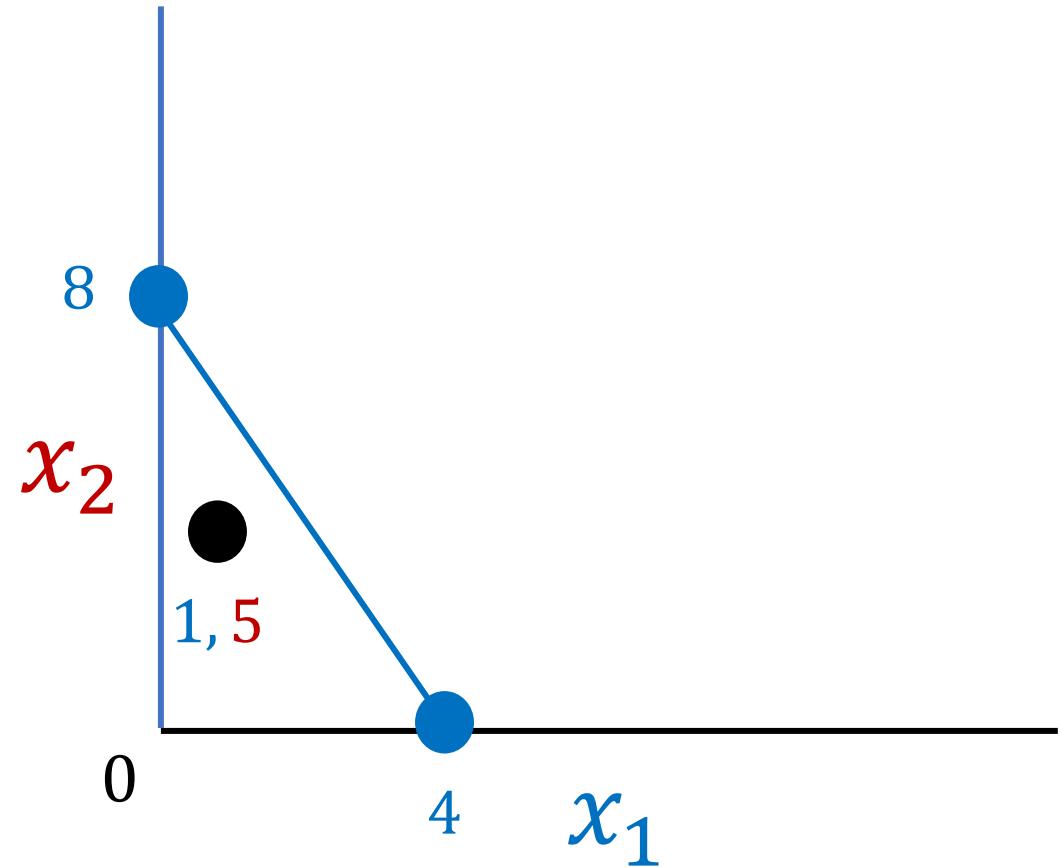
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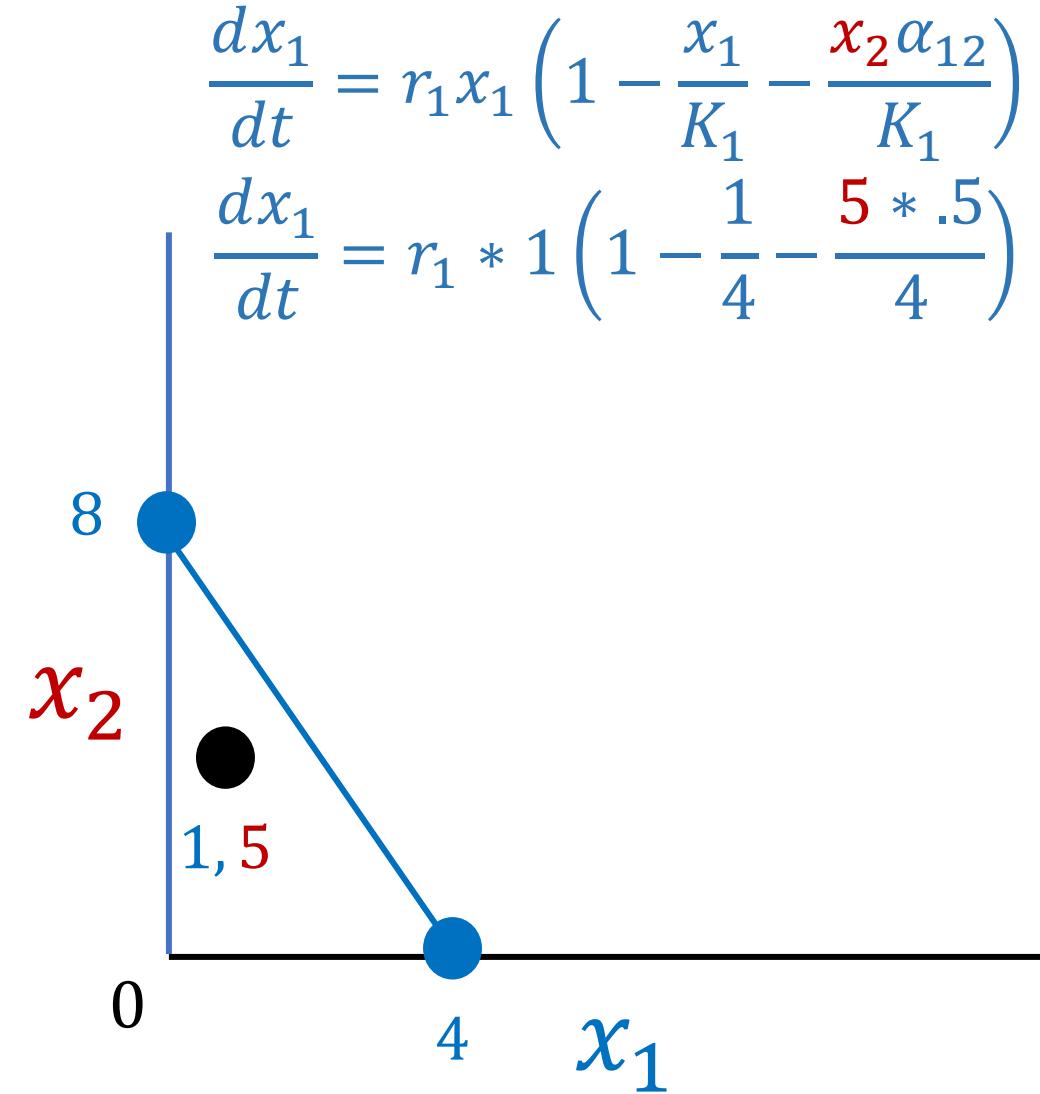
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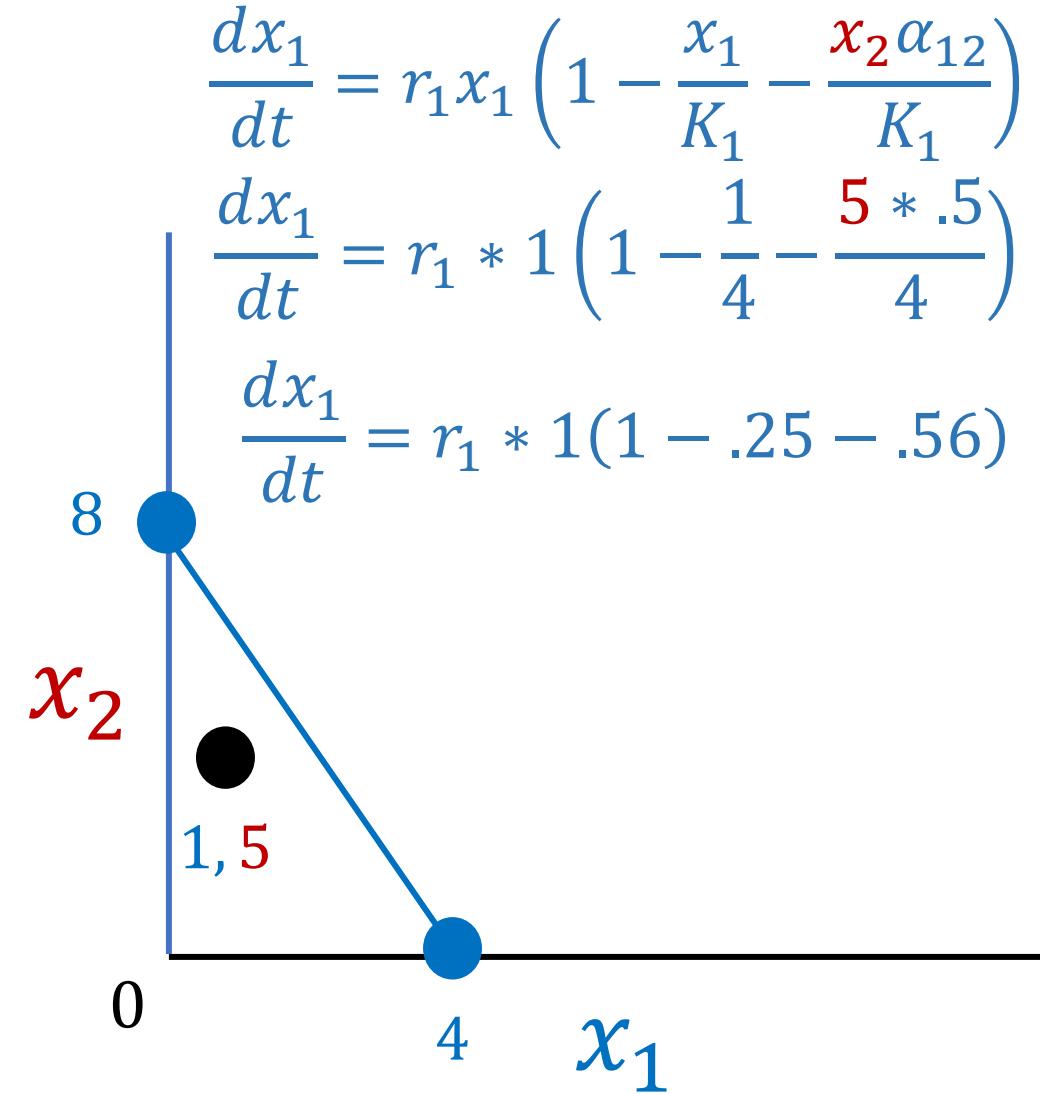
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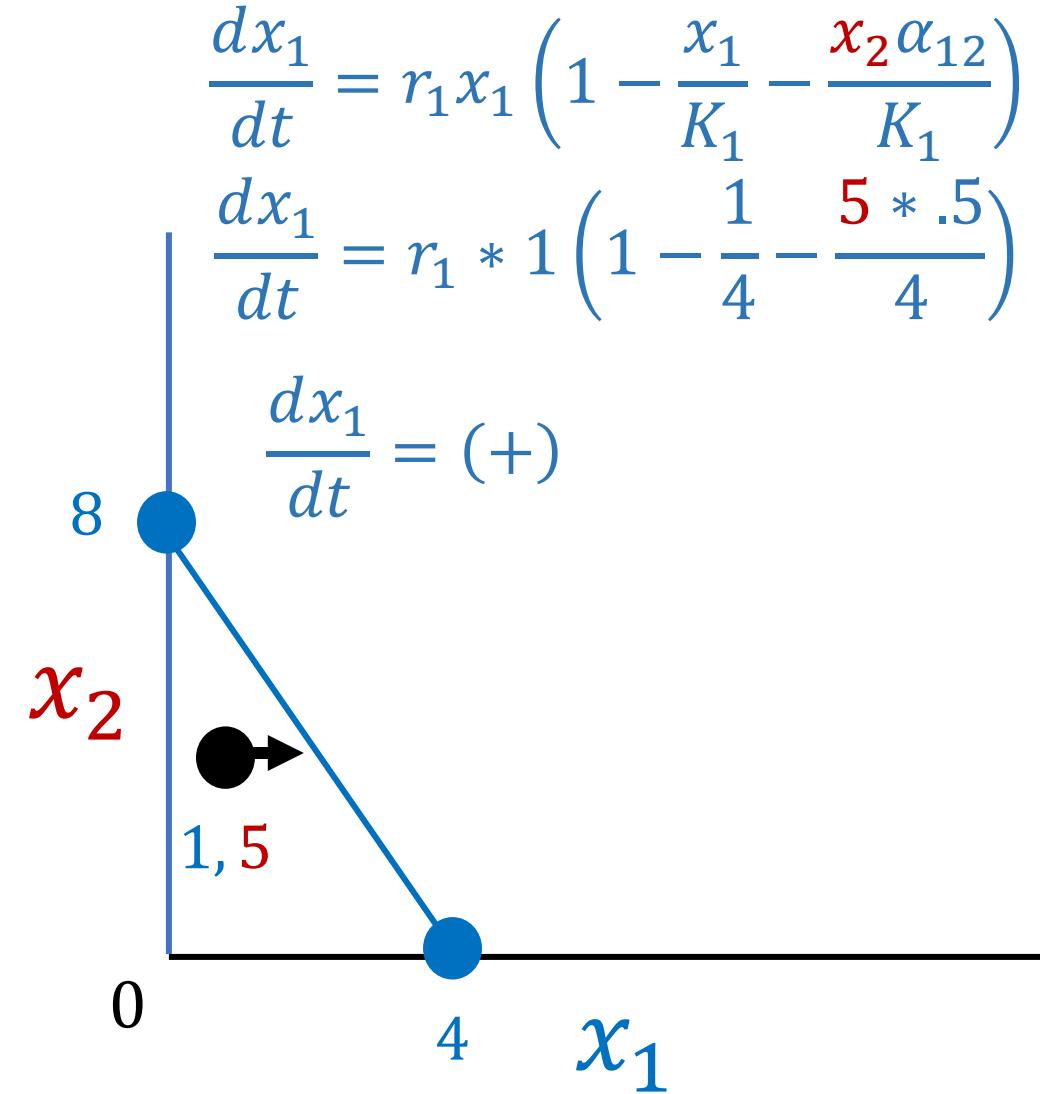
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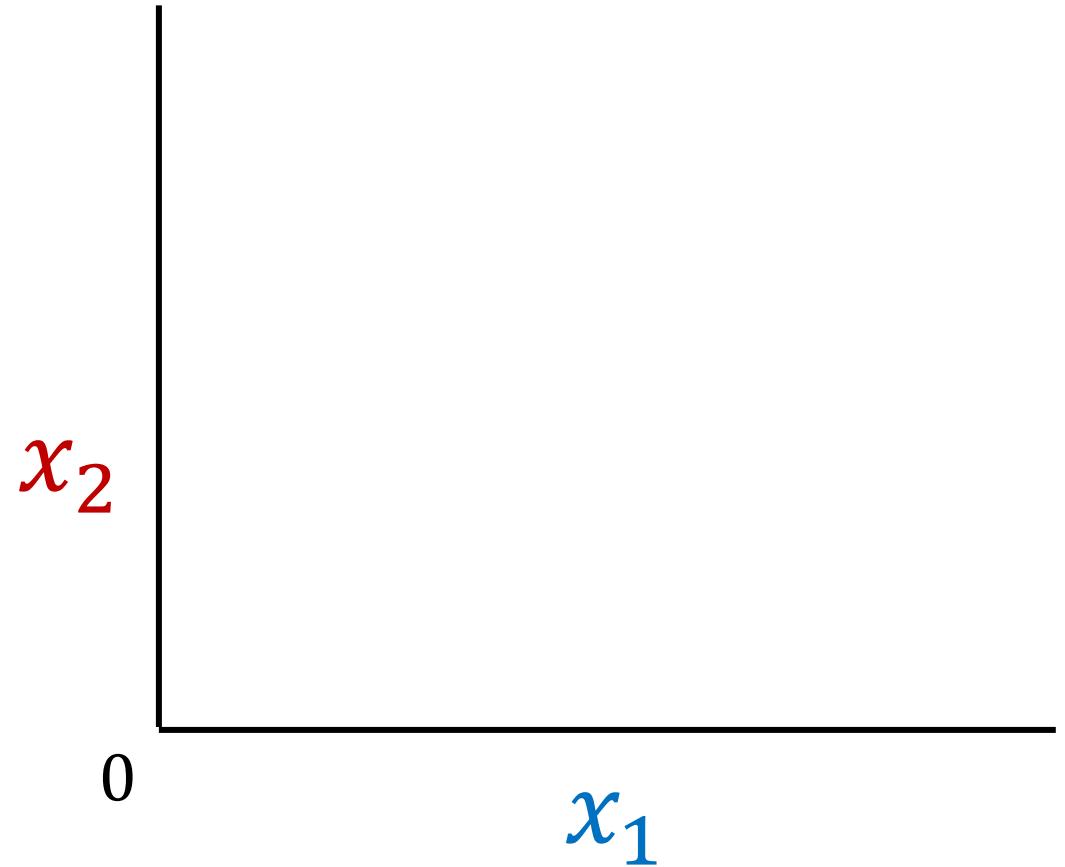
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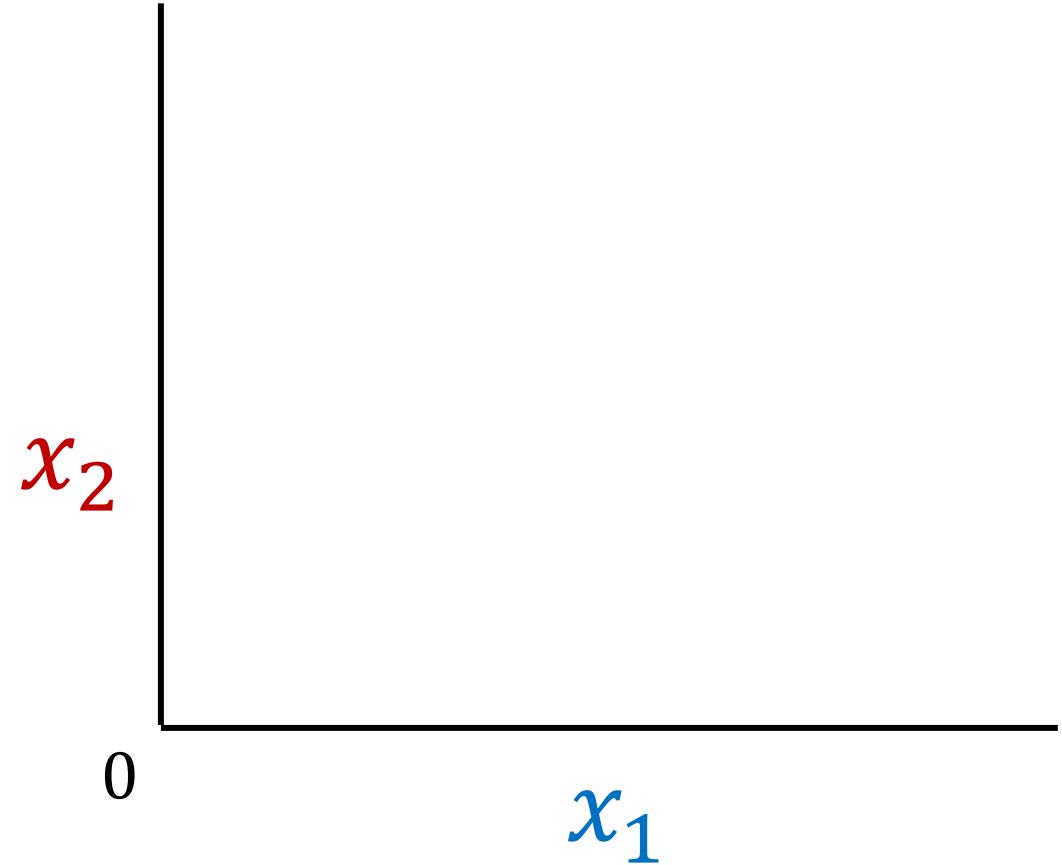
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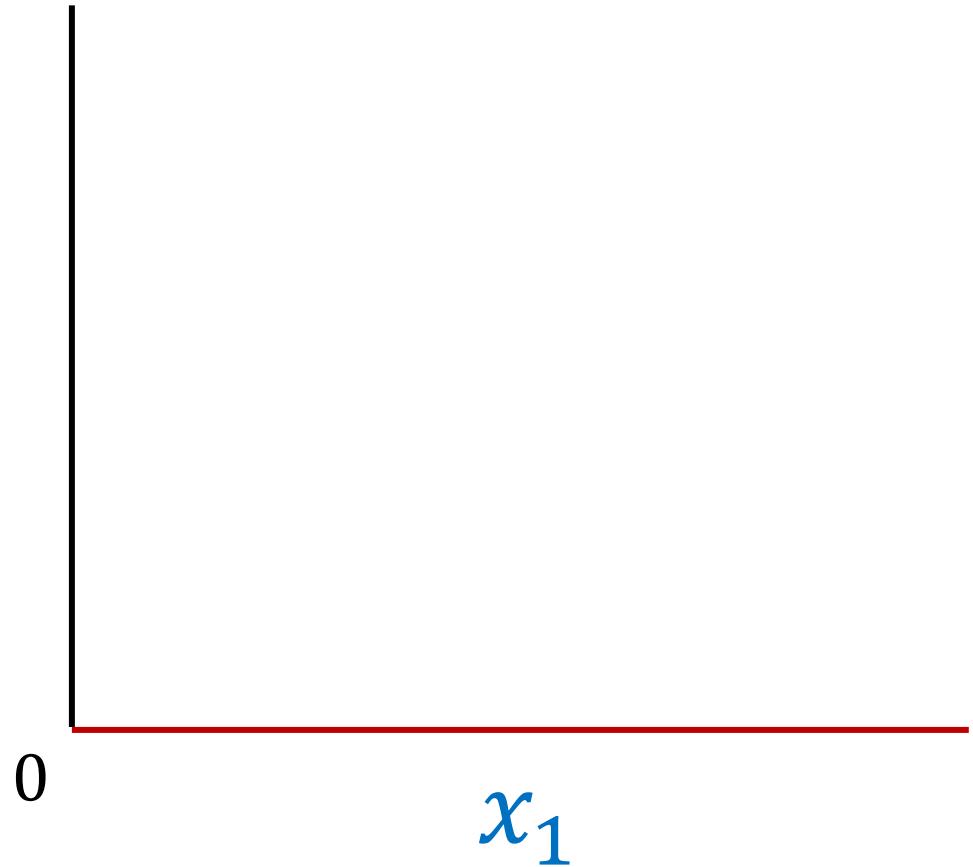
- Nullclines for species 2 occur at all conditions for which $\frac{dx_2}{dt} = 0$

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first nullcline at $x_2 = 0$



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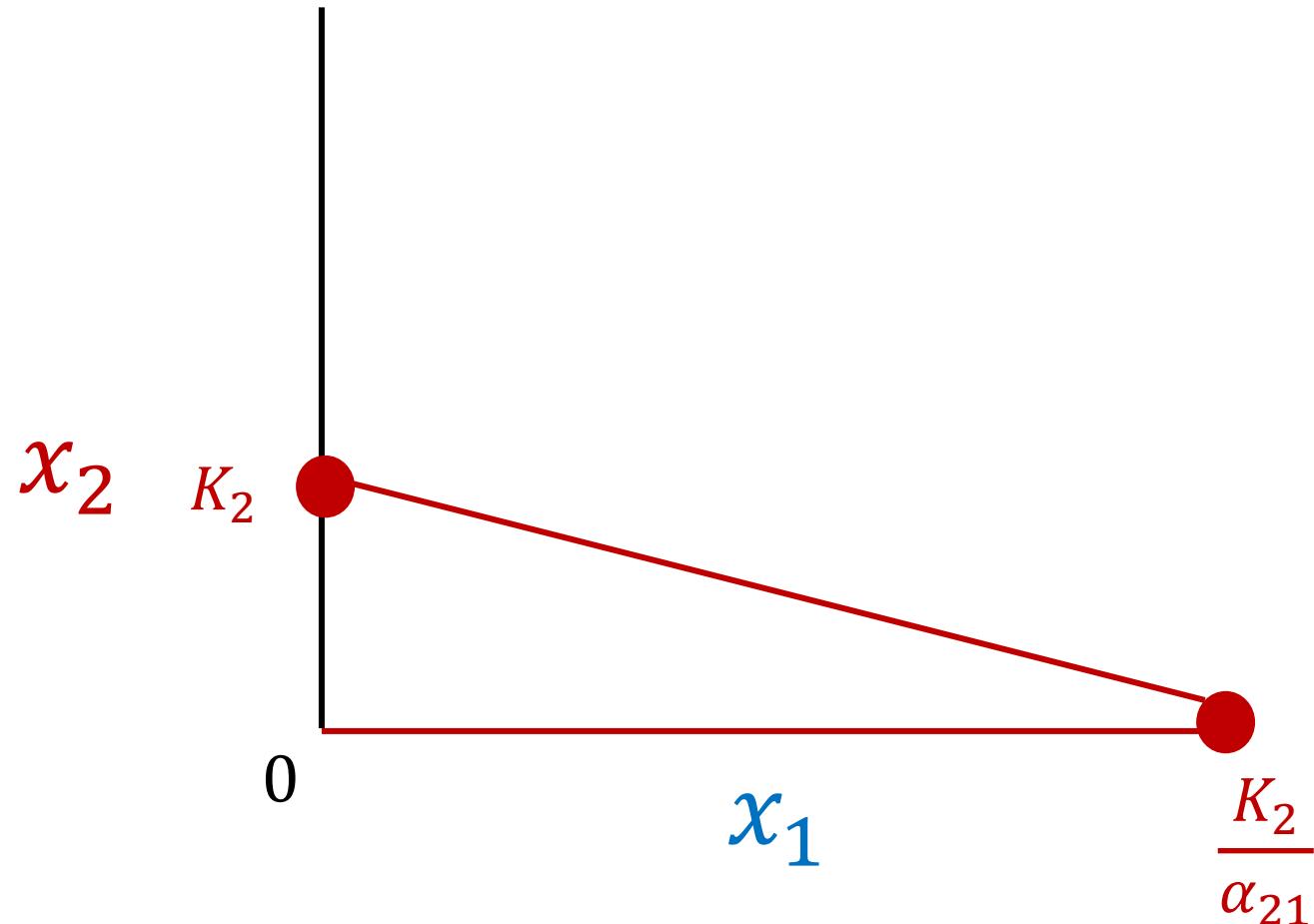
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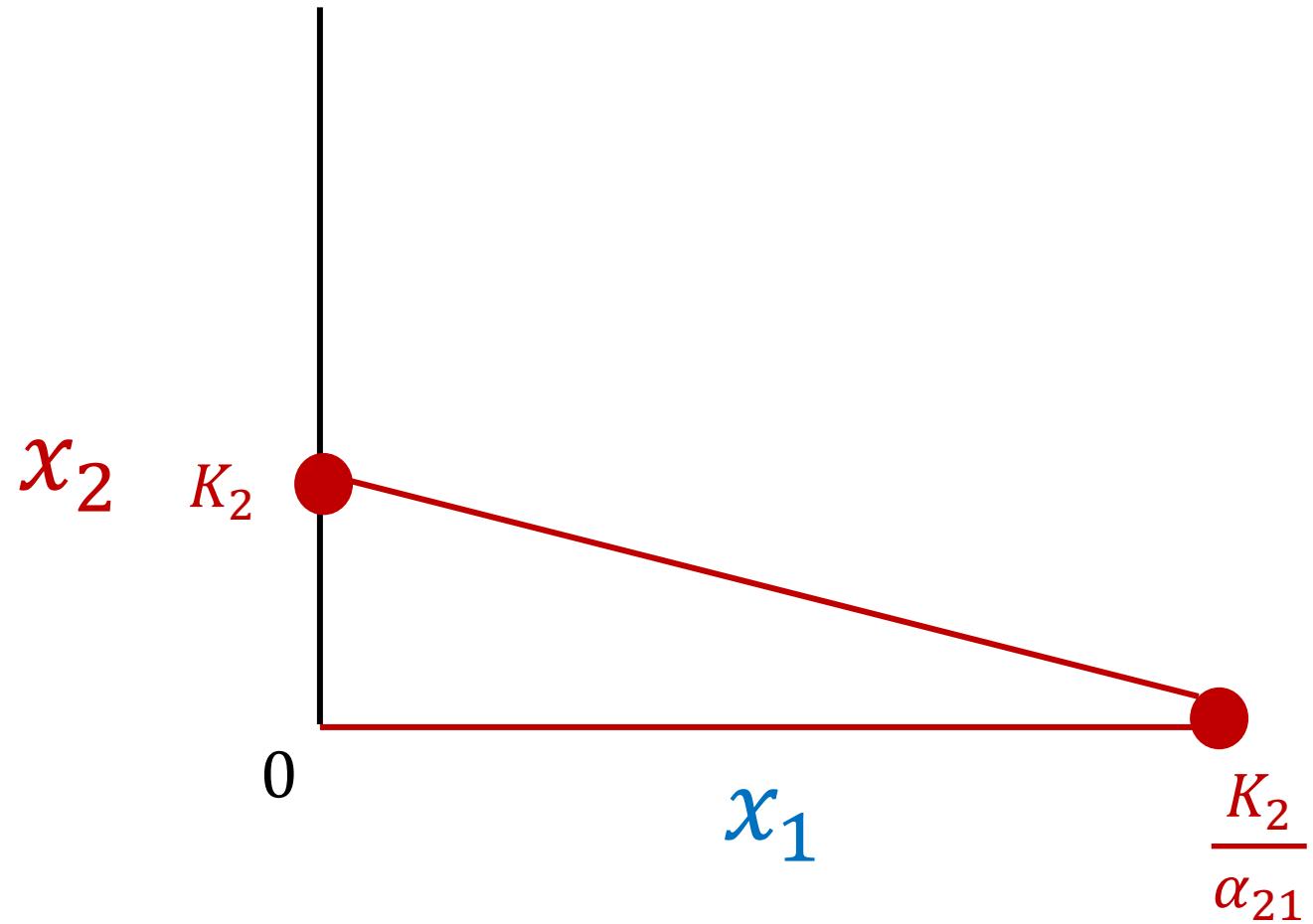
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second nullcline at $x_2 = -\alpha_{21} x_1 + K_2$



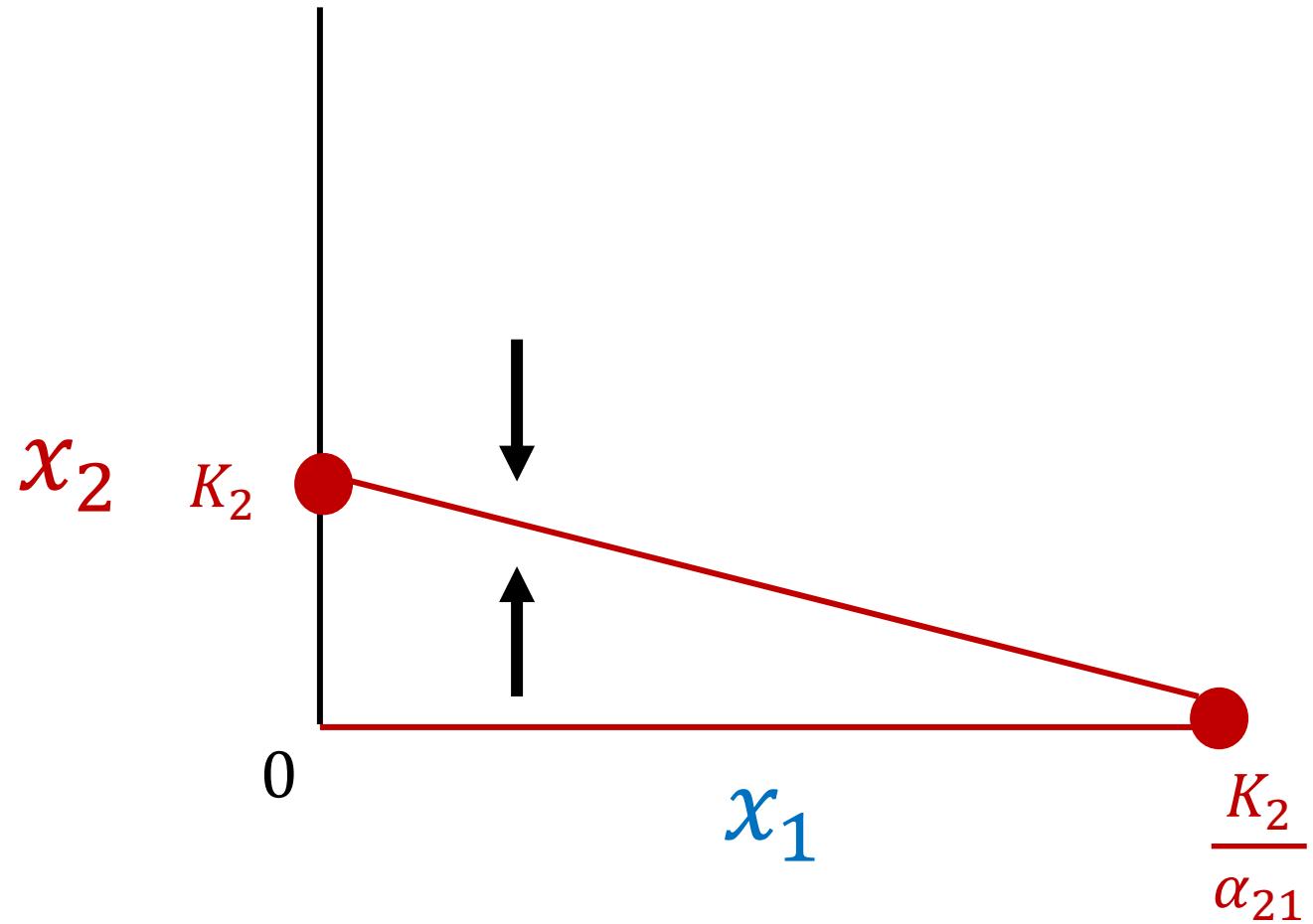
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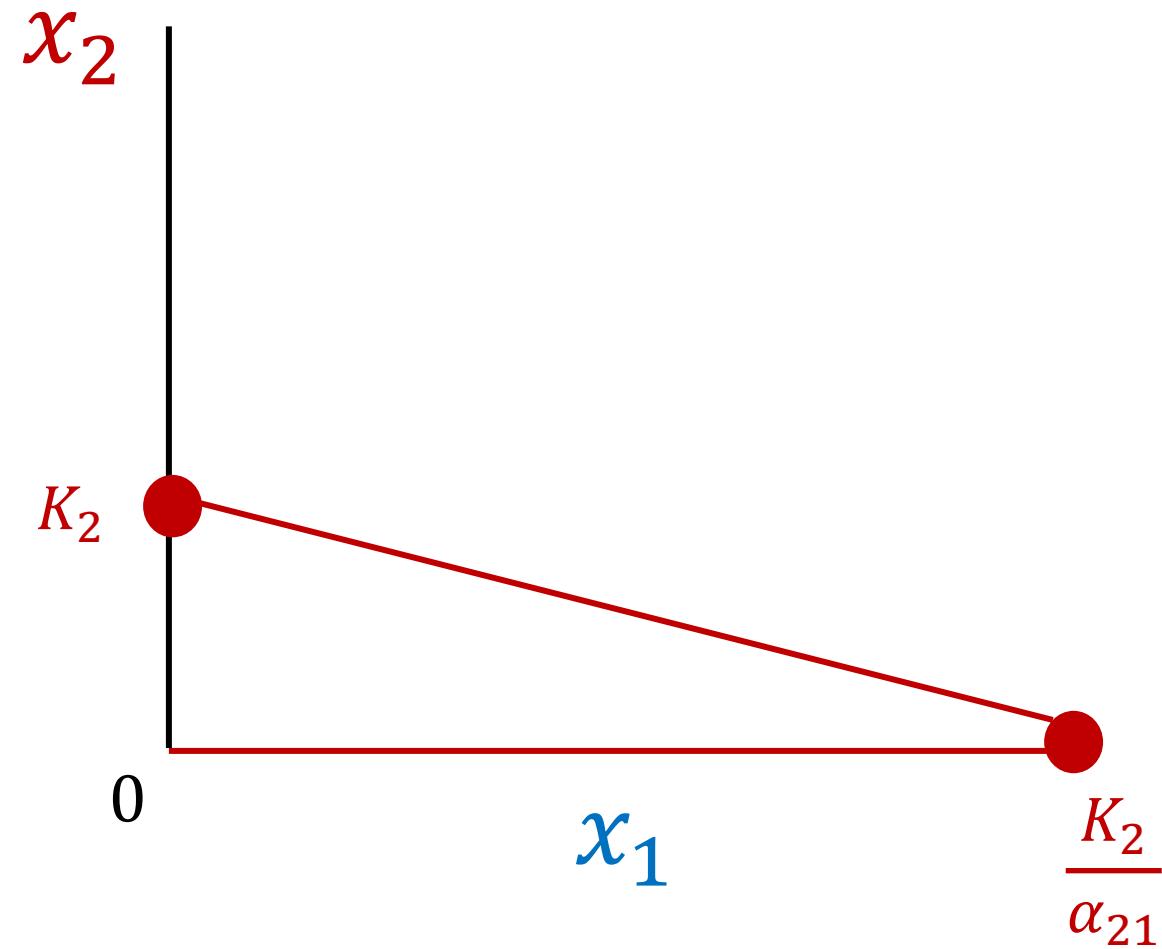
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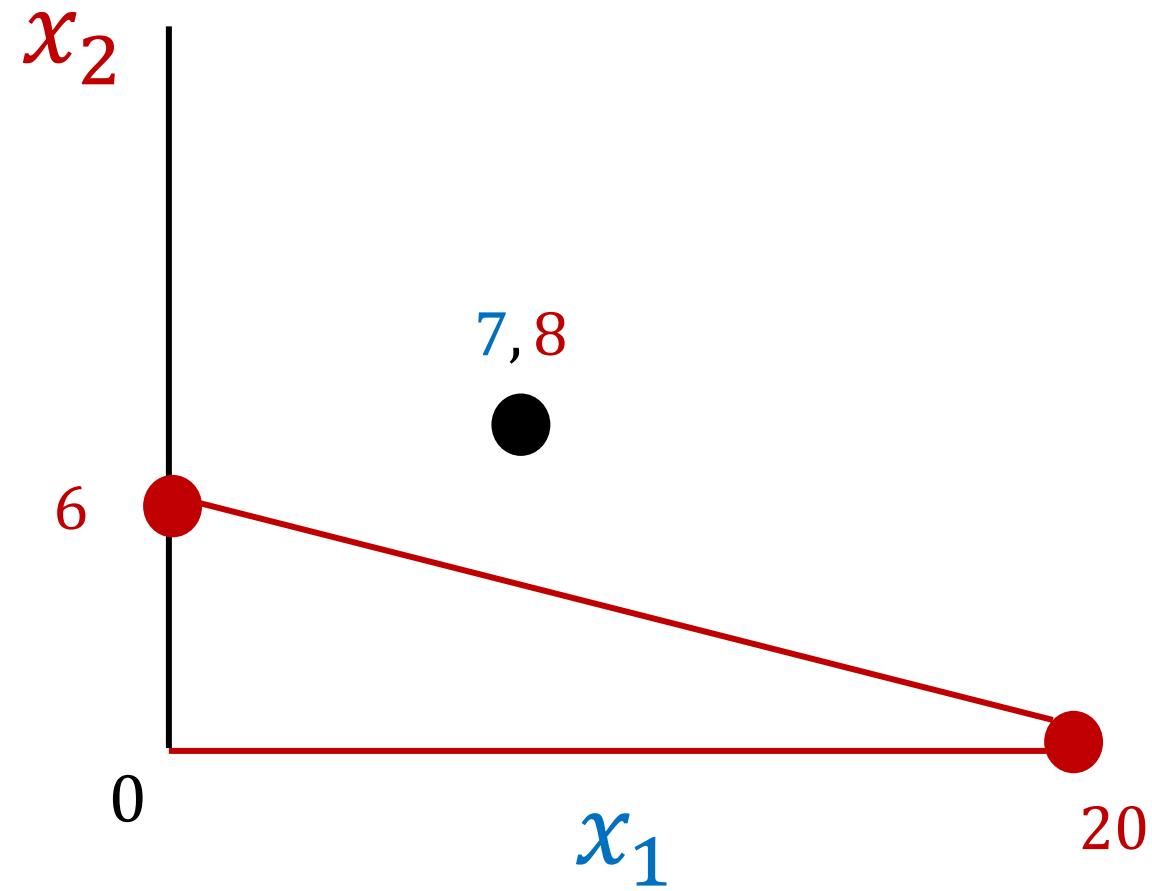
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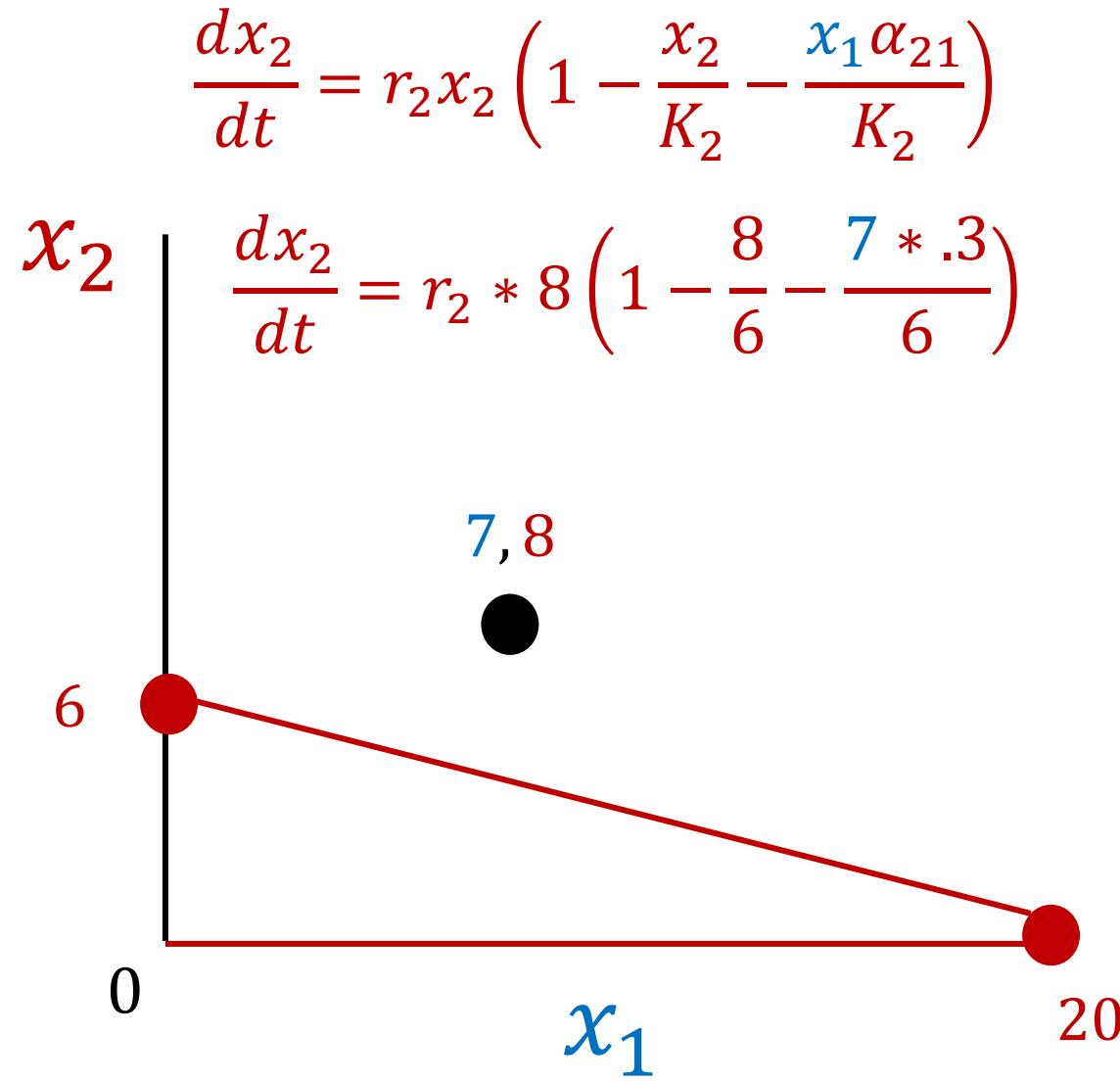
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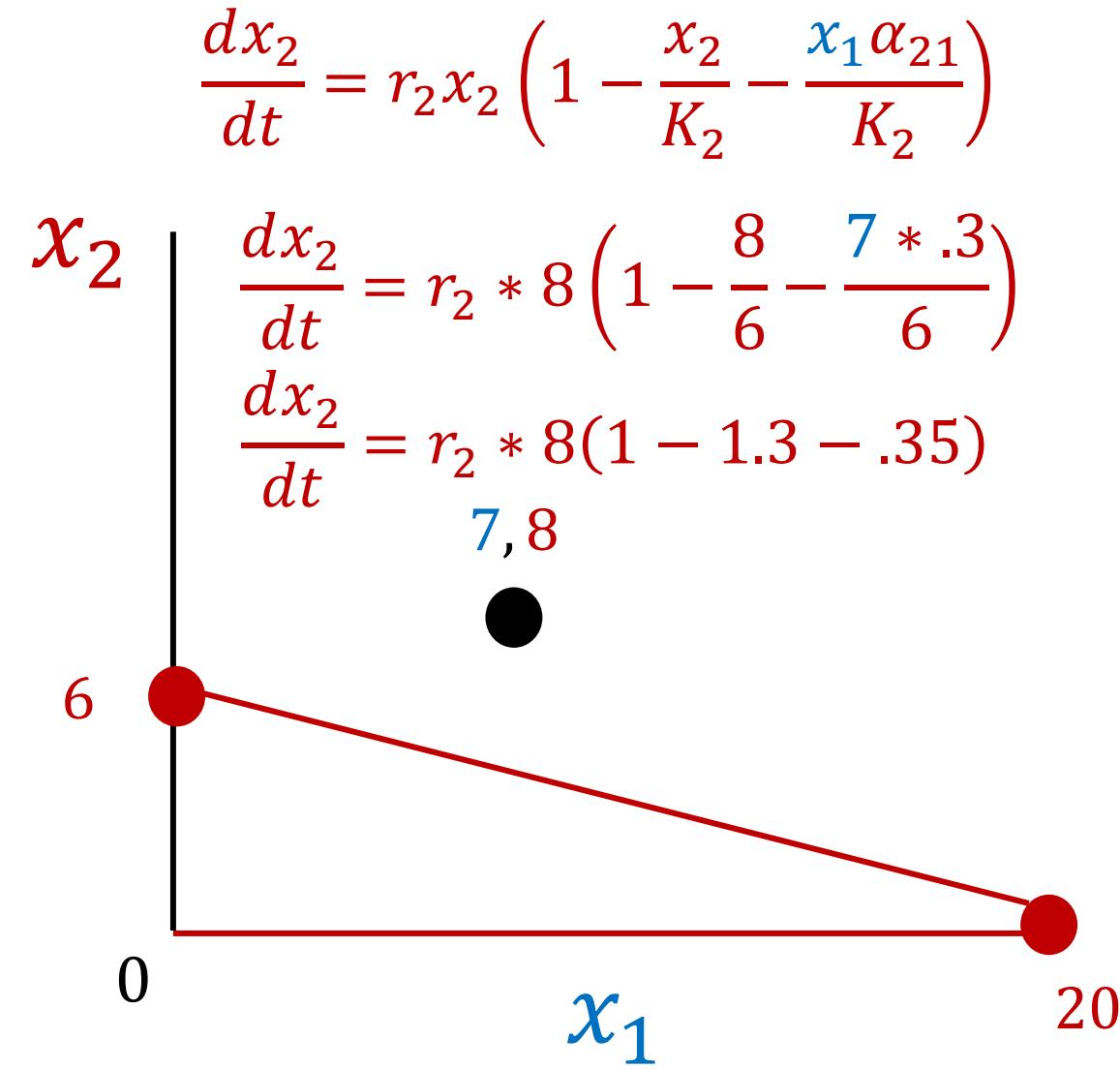
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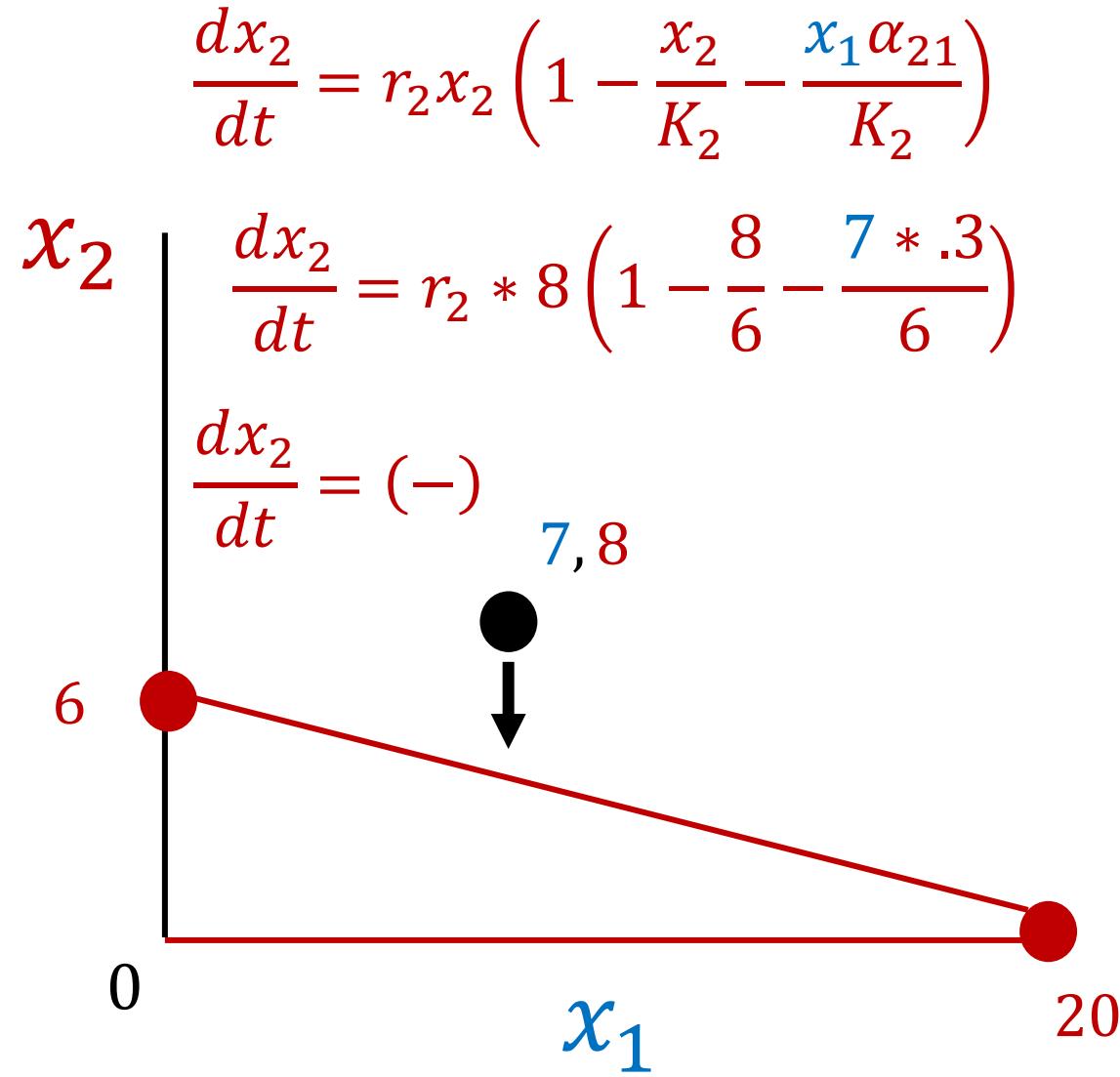
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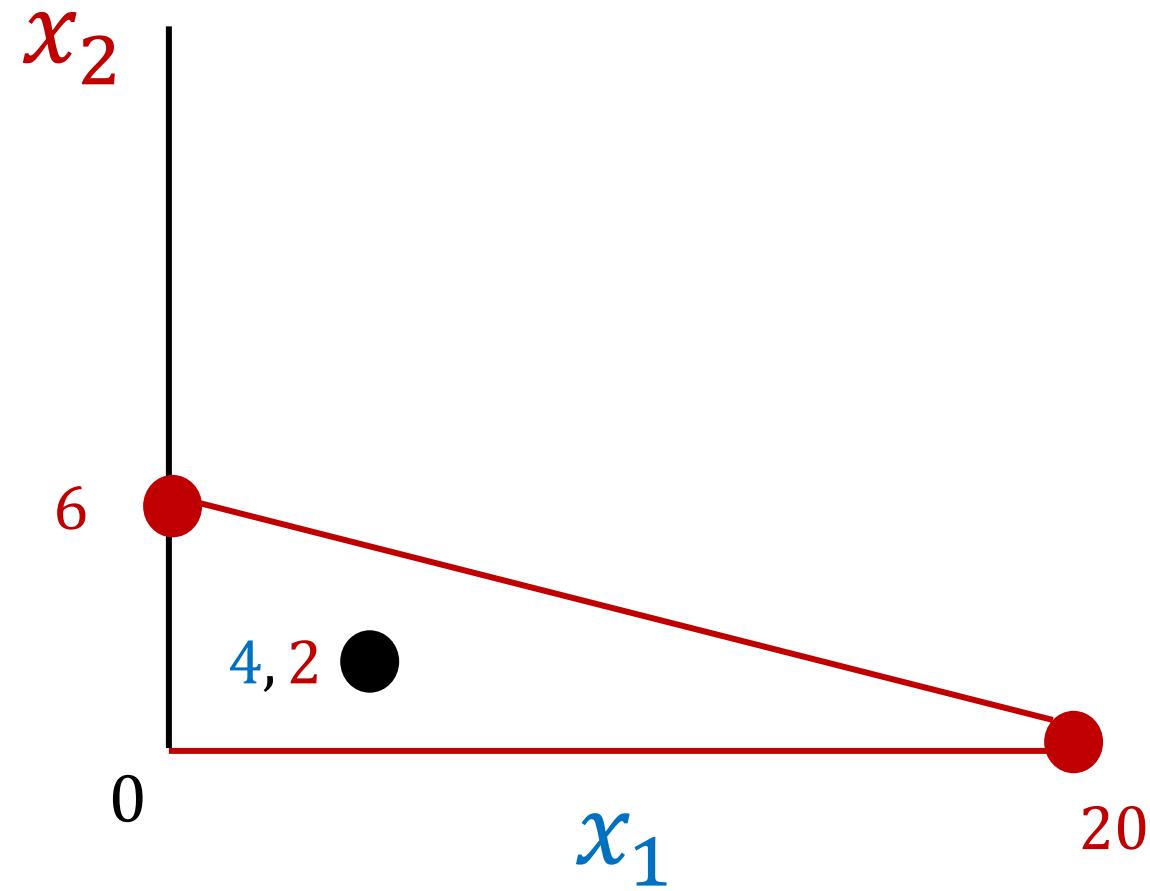
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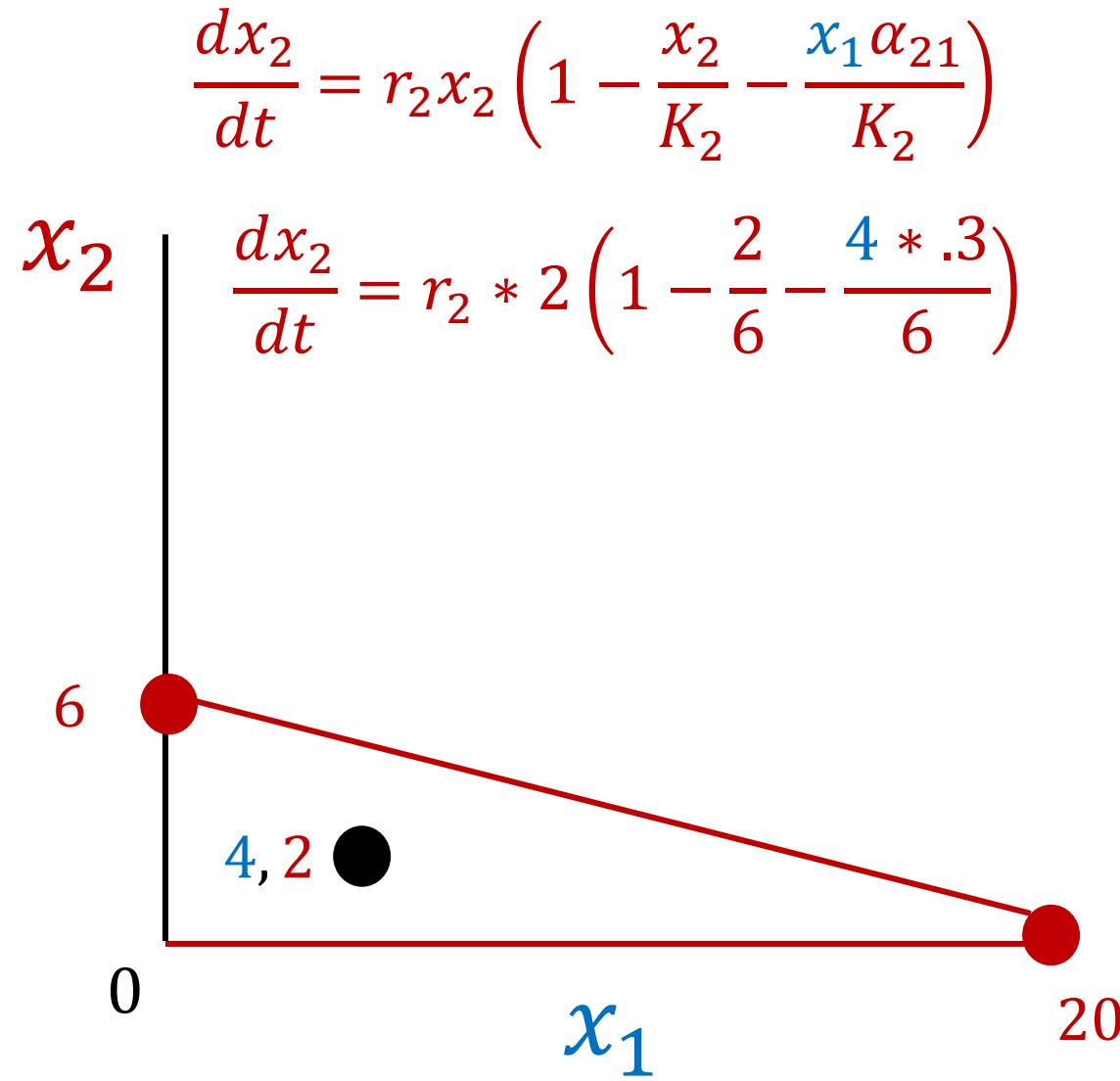
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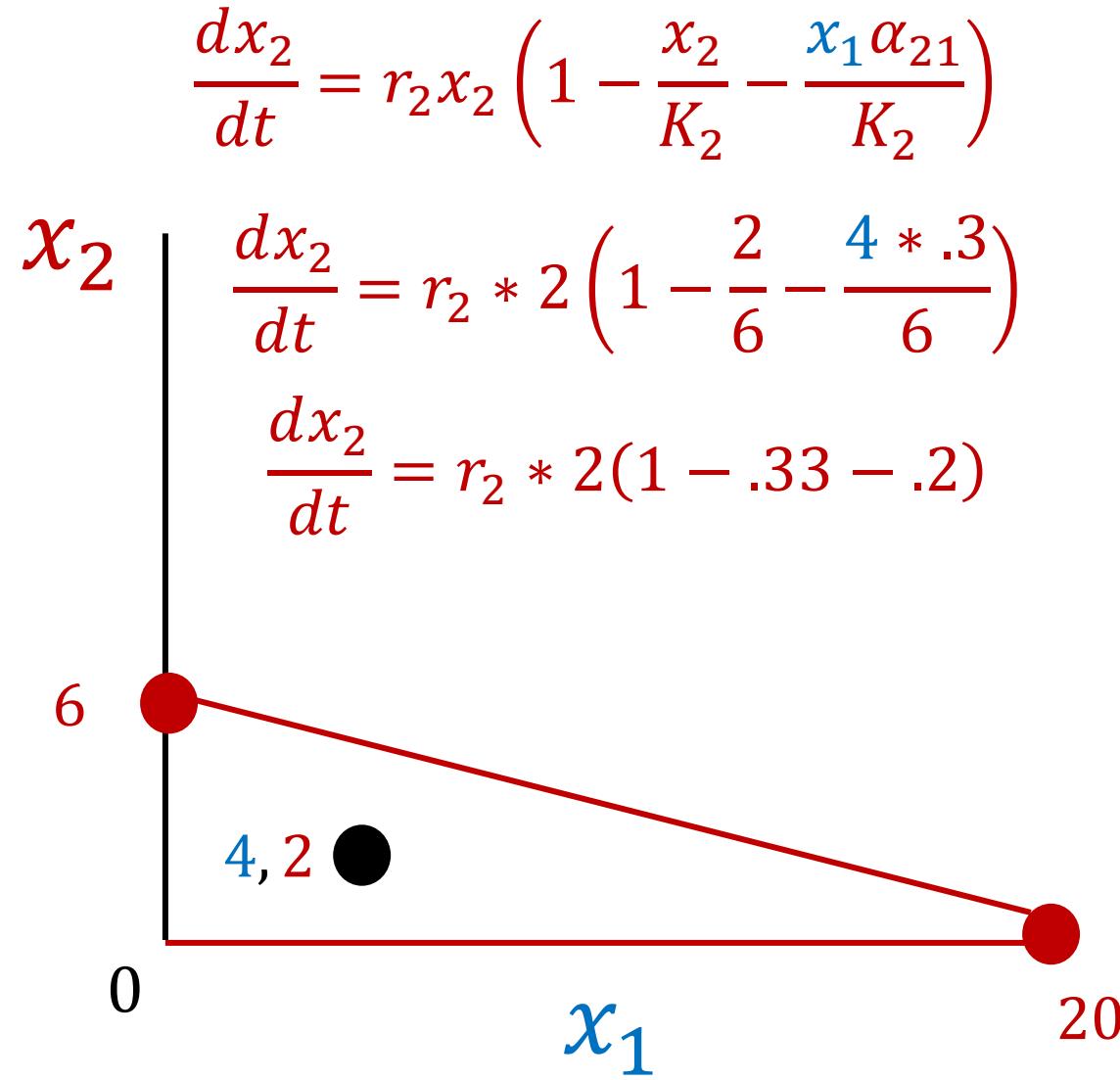
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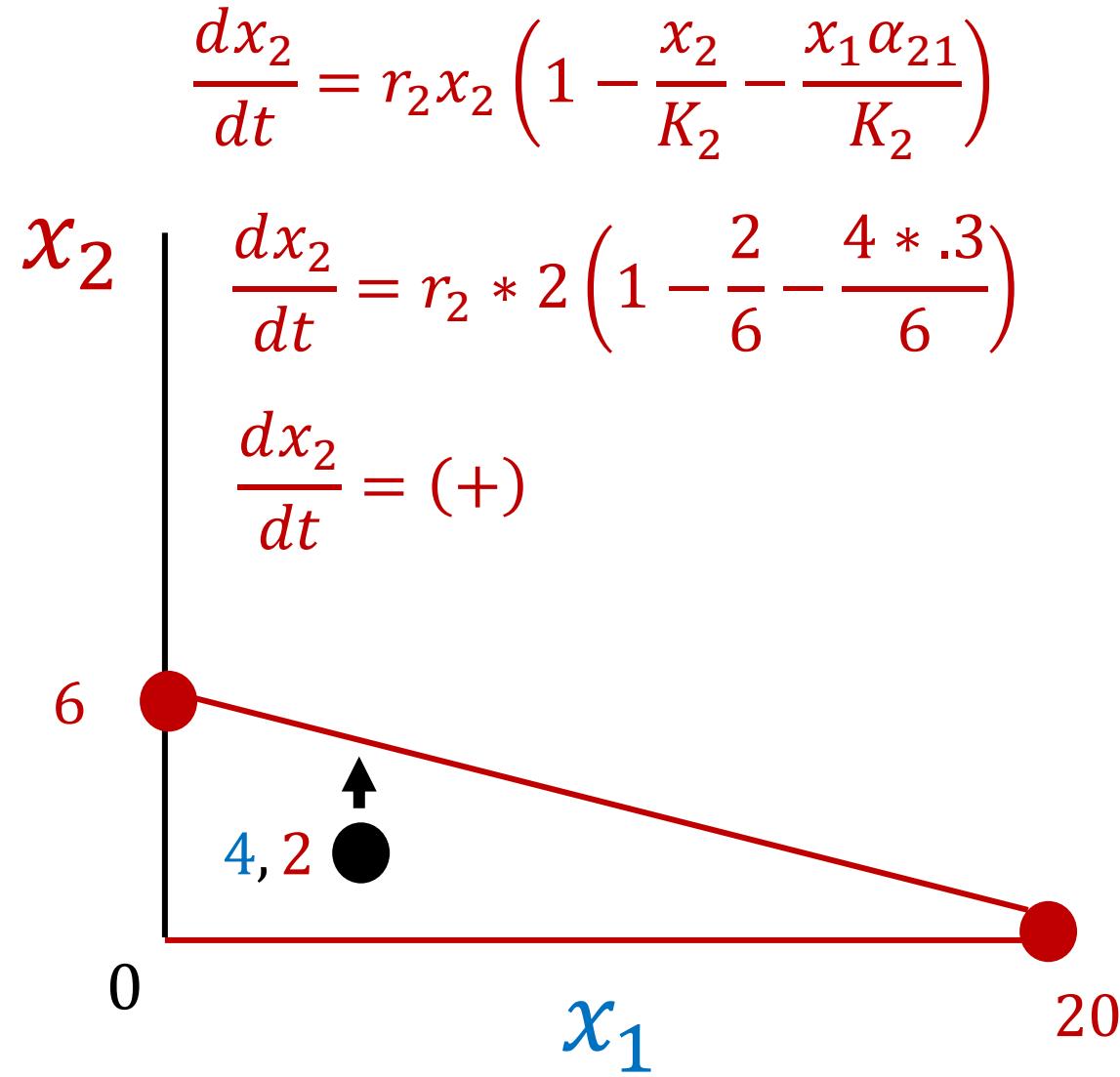
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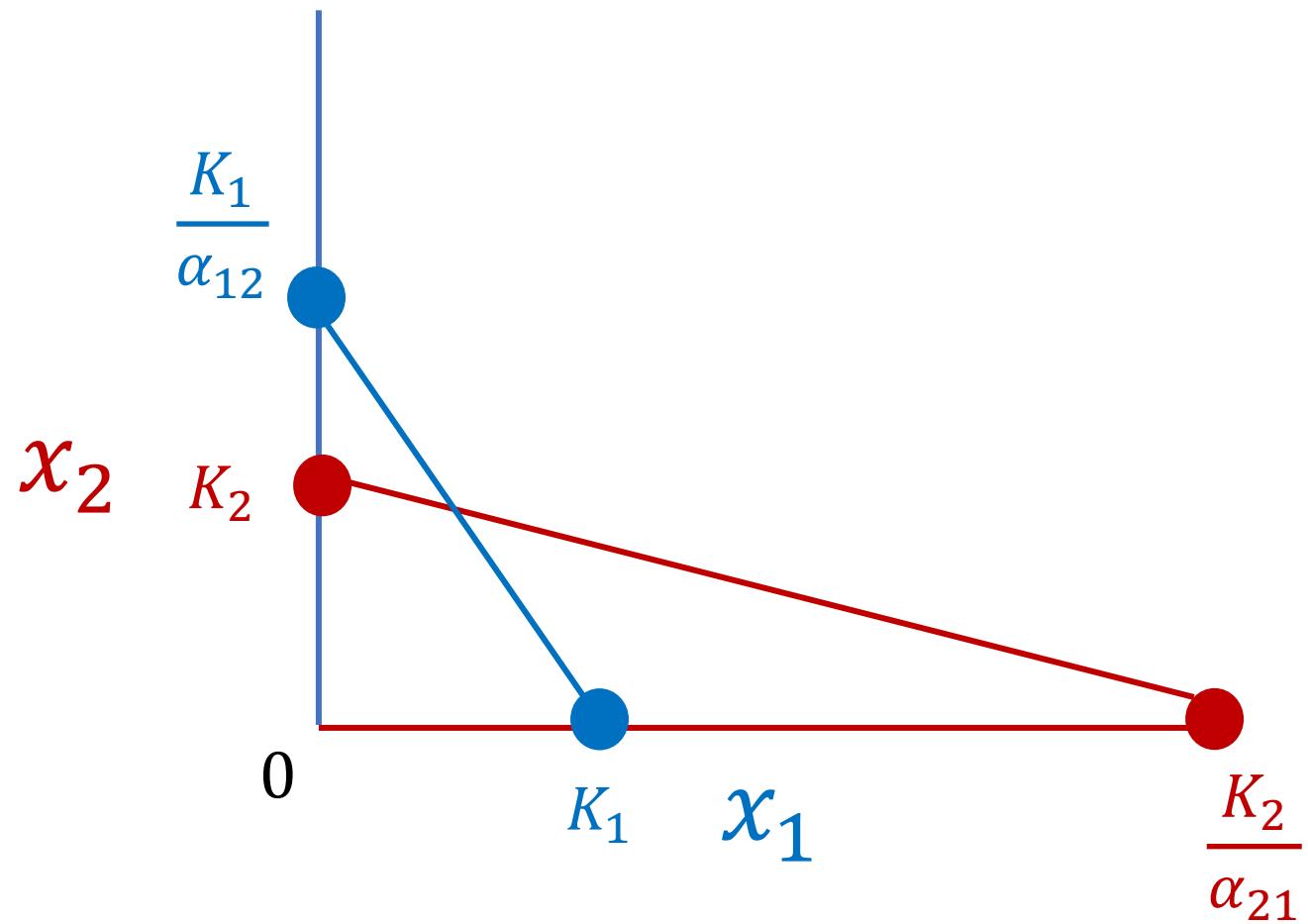


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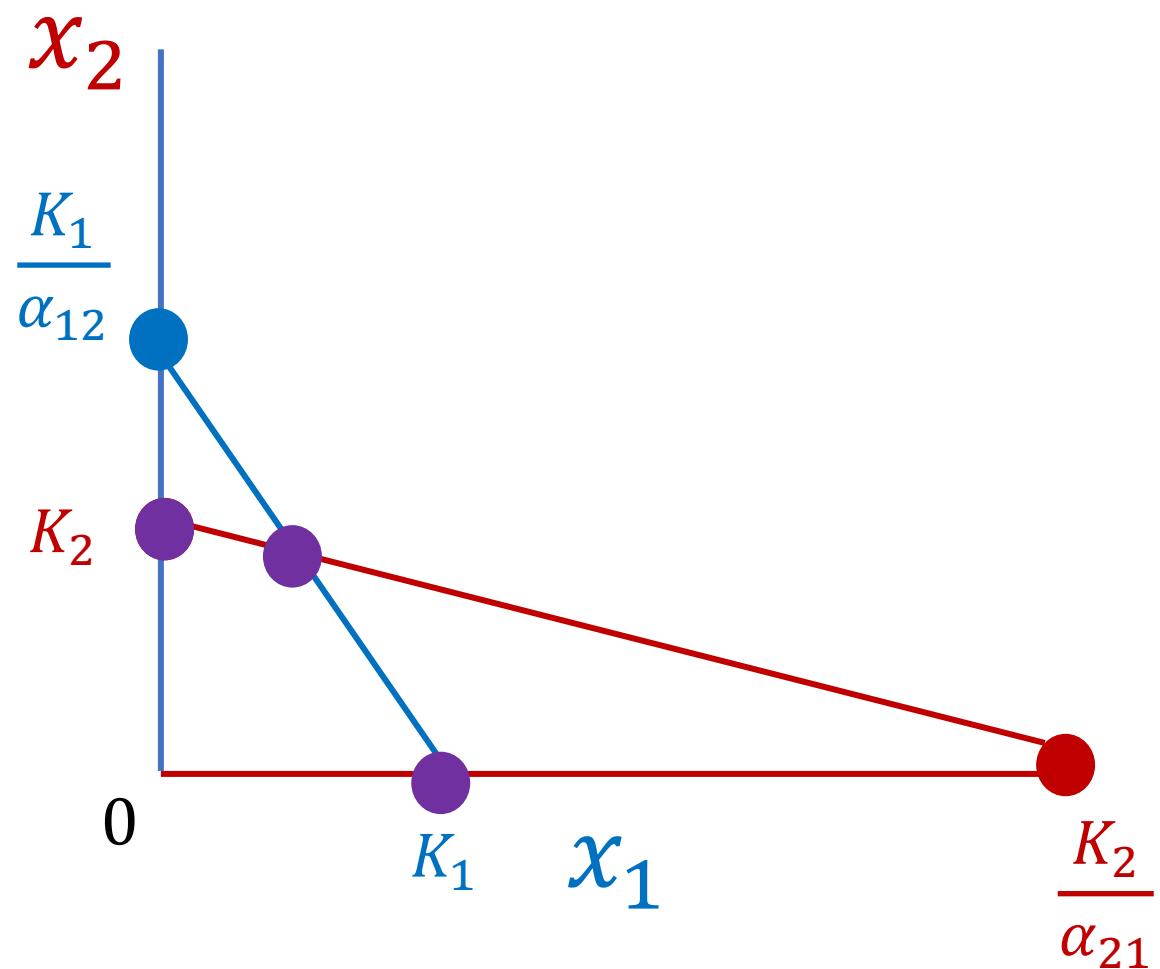


Given different combinations of x_1 and x_2 what is the outcome of competition?

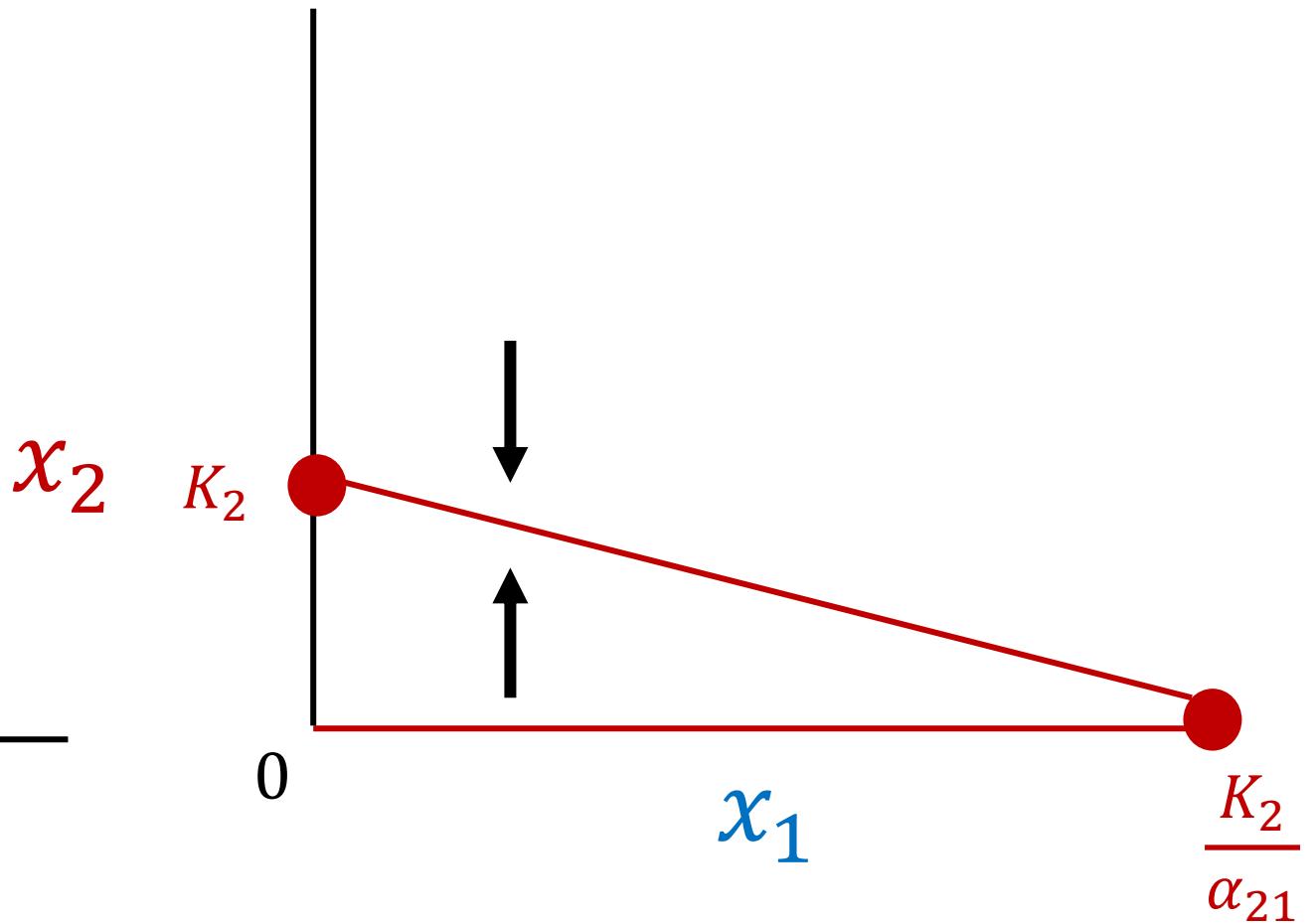
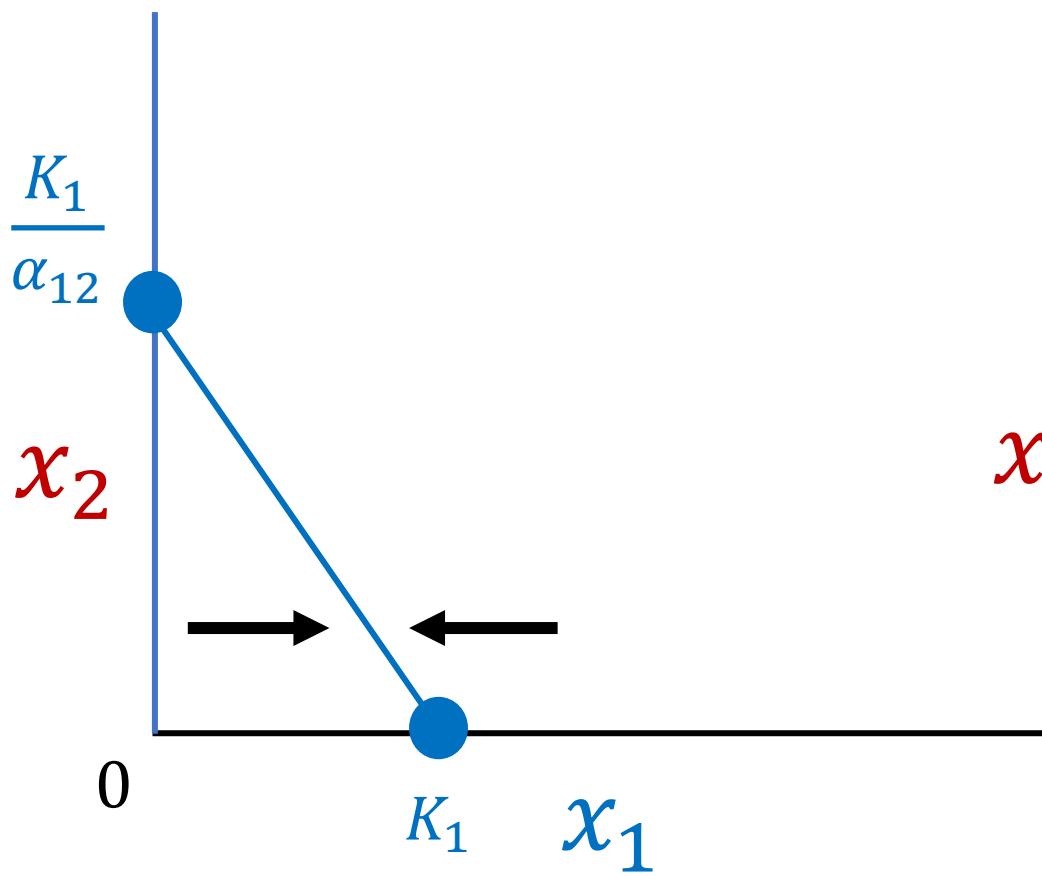


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System will converge to one of its equilibria, depending on the values of the competition and carrying capacity parameters.



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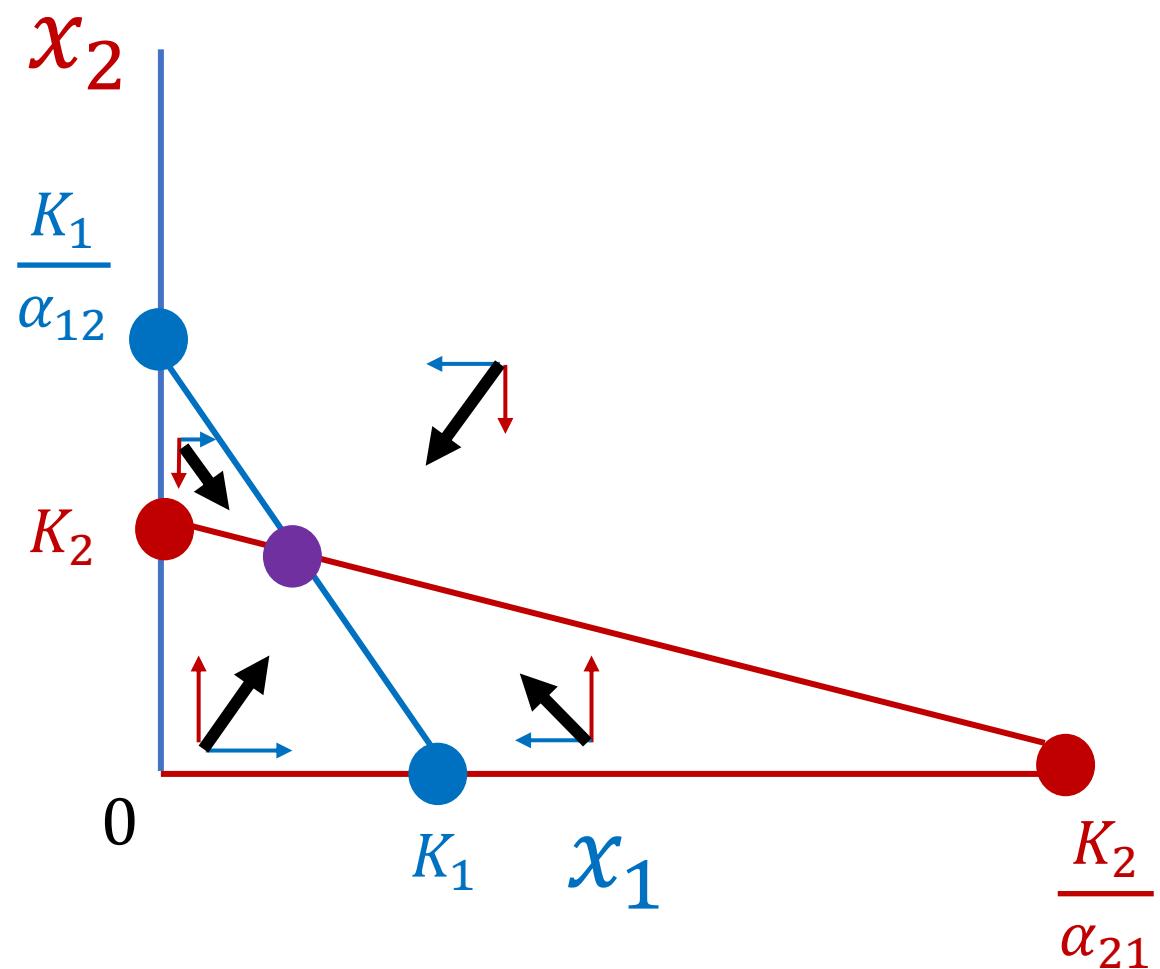


We can use vector addition from the individual nullclines to determine the outcome of competition.

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We can use vector addition **in each quadrat** from the individual nullclines to determine the outcome of competition.



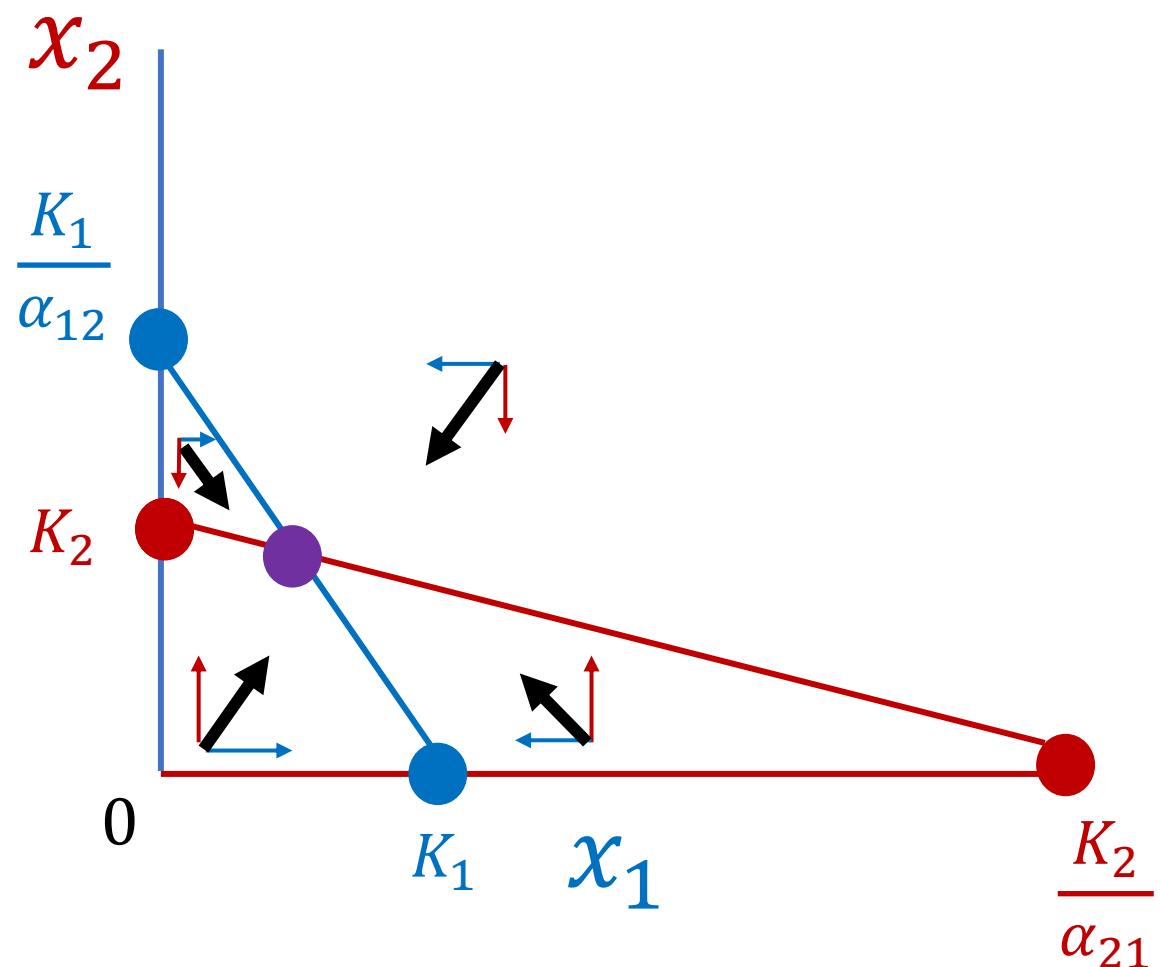
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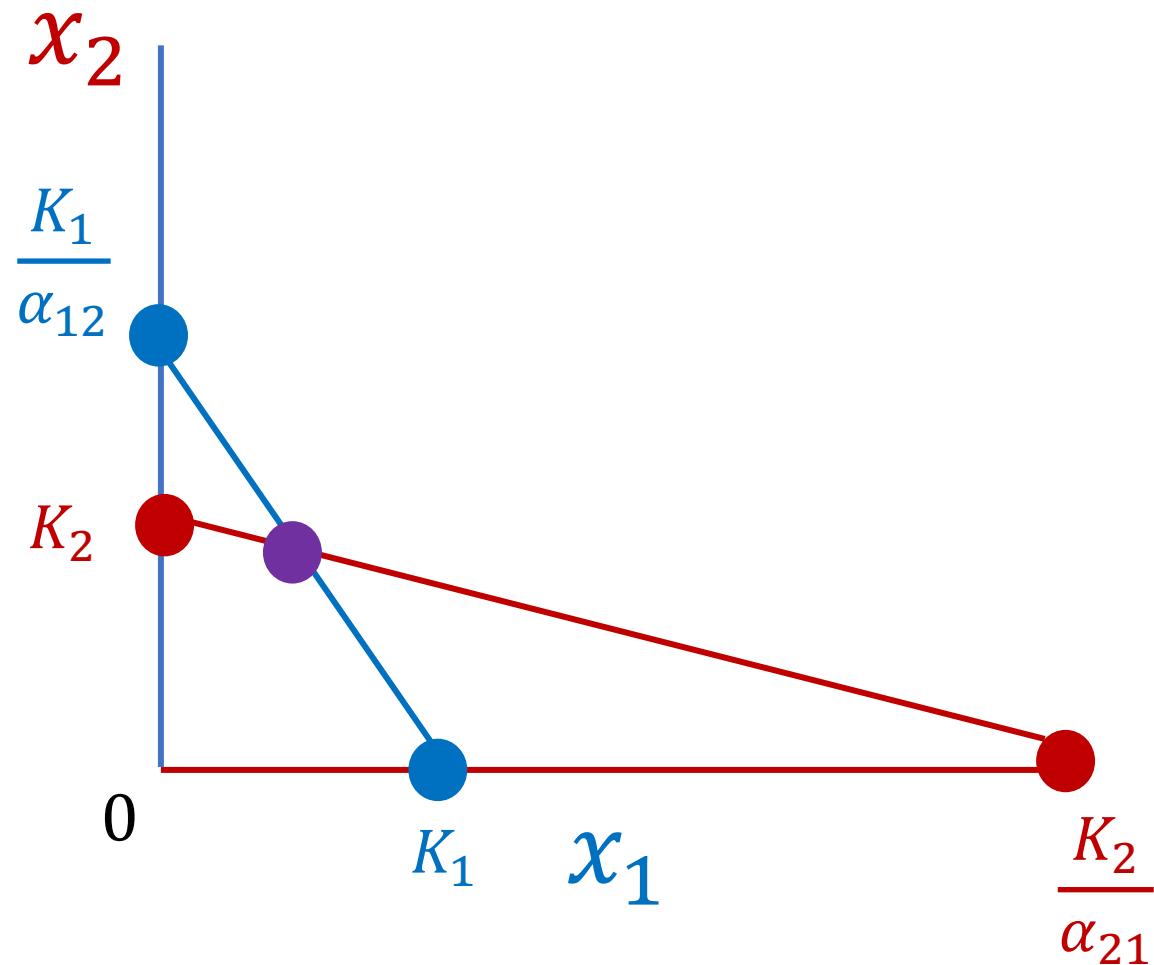
This configuration is a **stable equilibrium**, indicating **stable coexistence** at:

$$x_1^* = \frac{K_1 - K_2 \alpha_{12}}{1 - \alpha_{21} \alpha_{12}} \quad x_2^* = \frac{K_2 - K_1 \alpha_{21}}{1 - \alpha_{12} \alpha_{21}}$$



Given different combinations of x_1 and x_2 what is the outcome of competition?

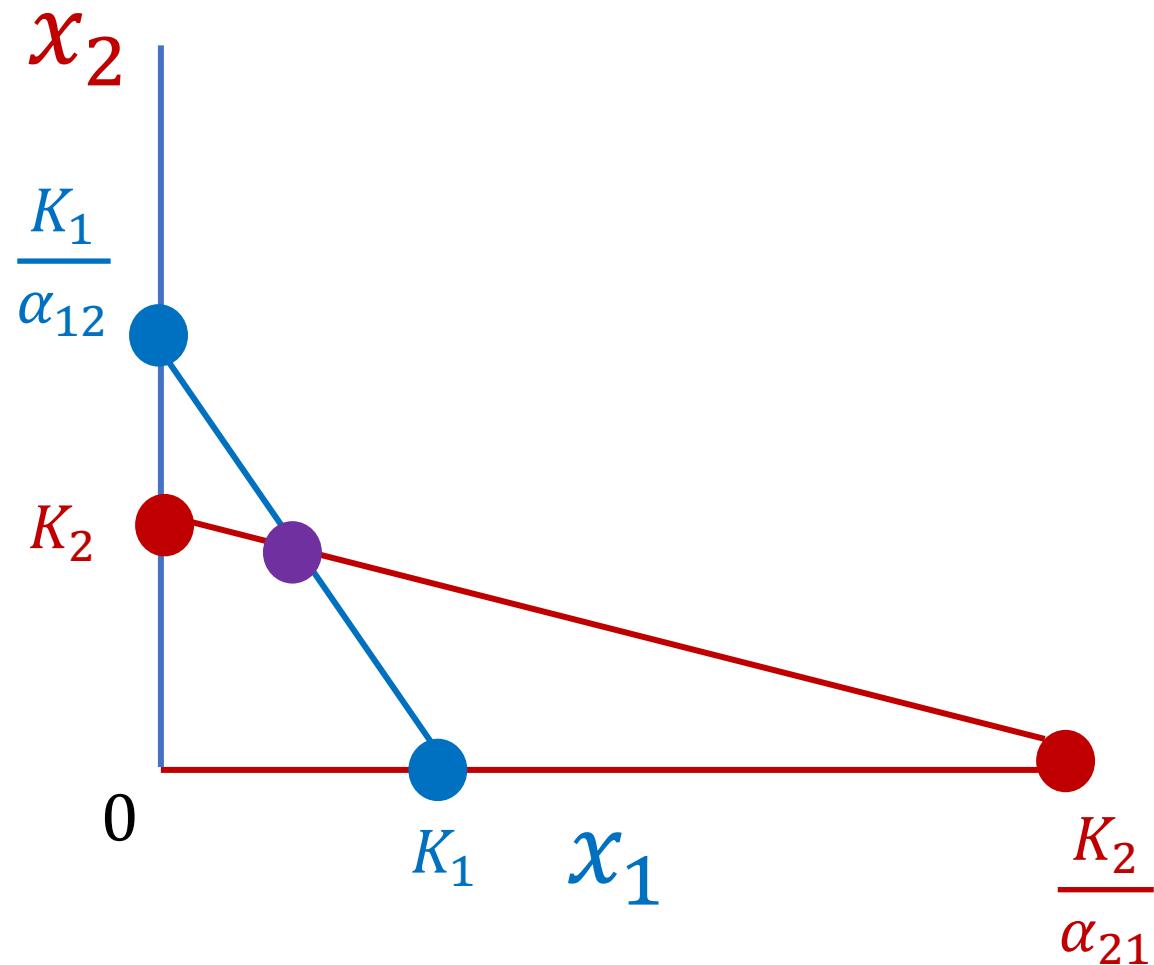
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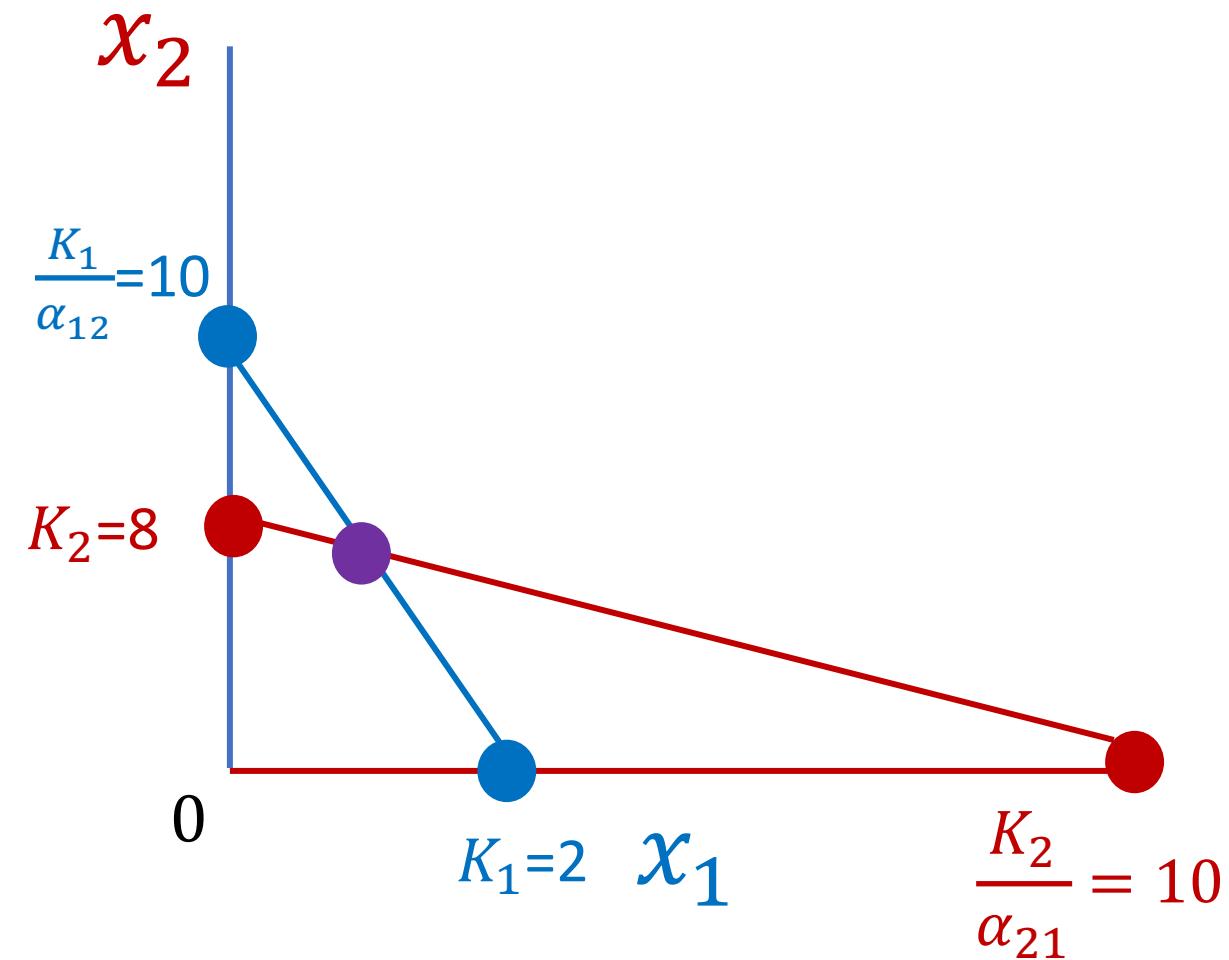


Given different combinations of x_1 and x_2 what is the outcome of competition?

Let's try it!

$$K_1 = 2 ; \alpha_{12} = .3$$

$$K_2 = 8 ; \alpha_{21} = .8$$



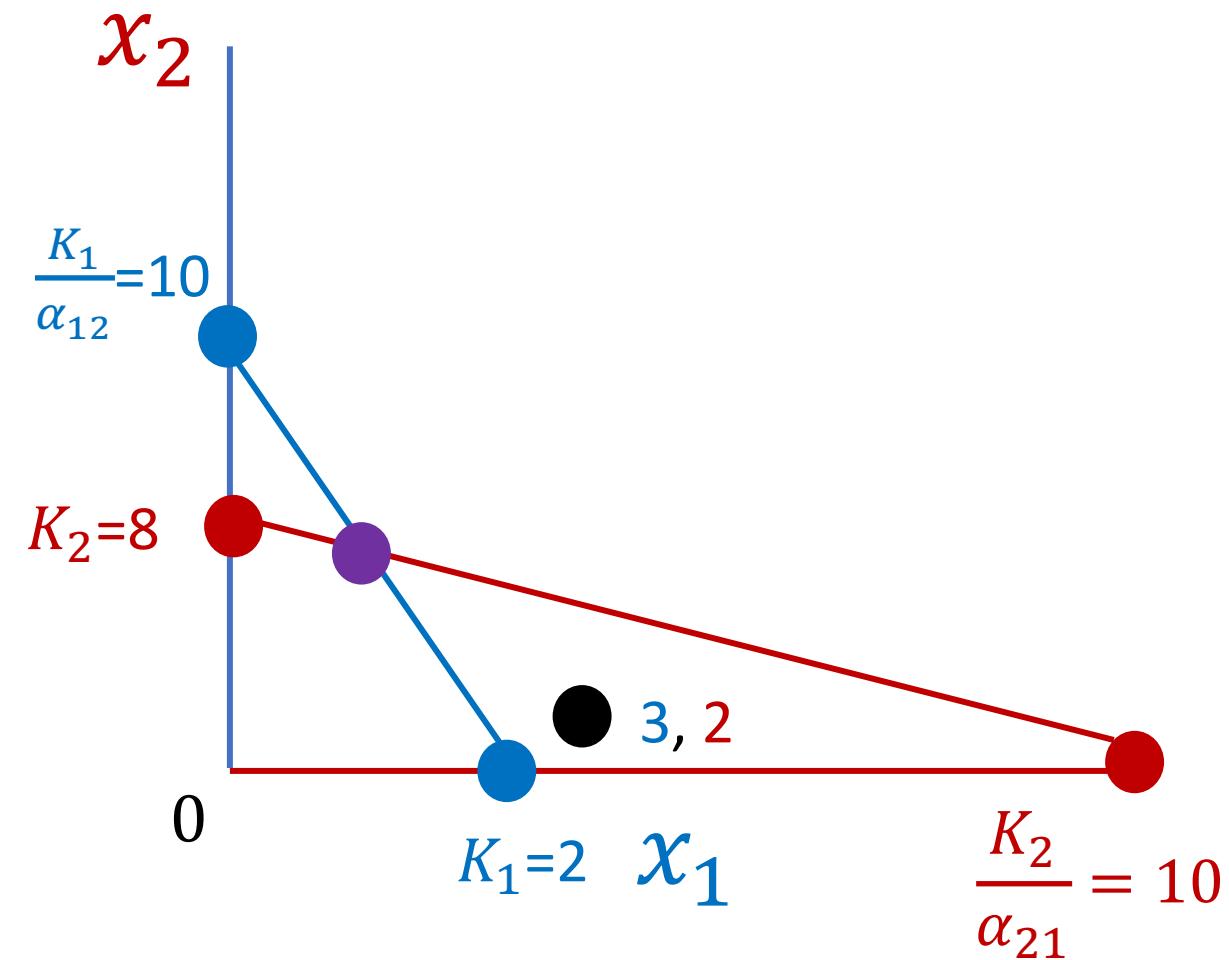
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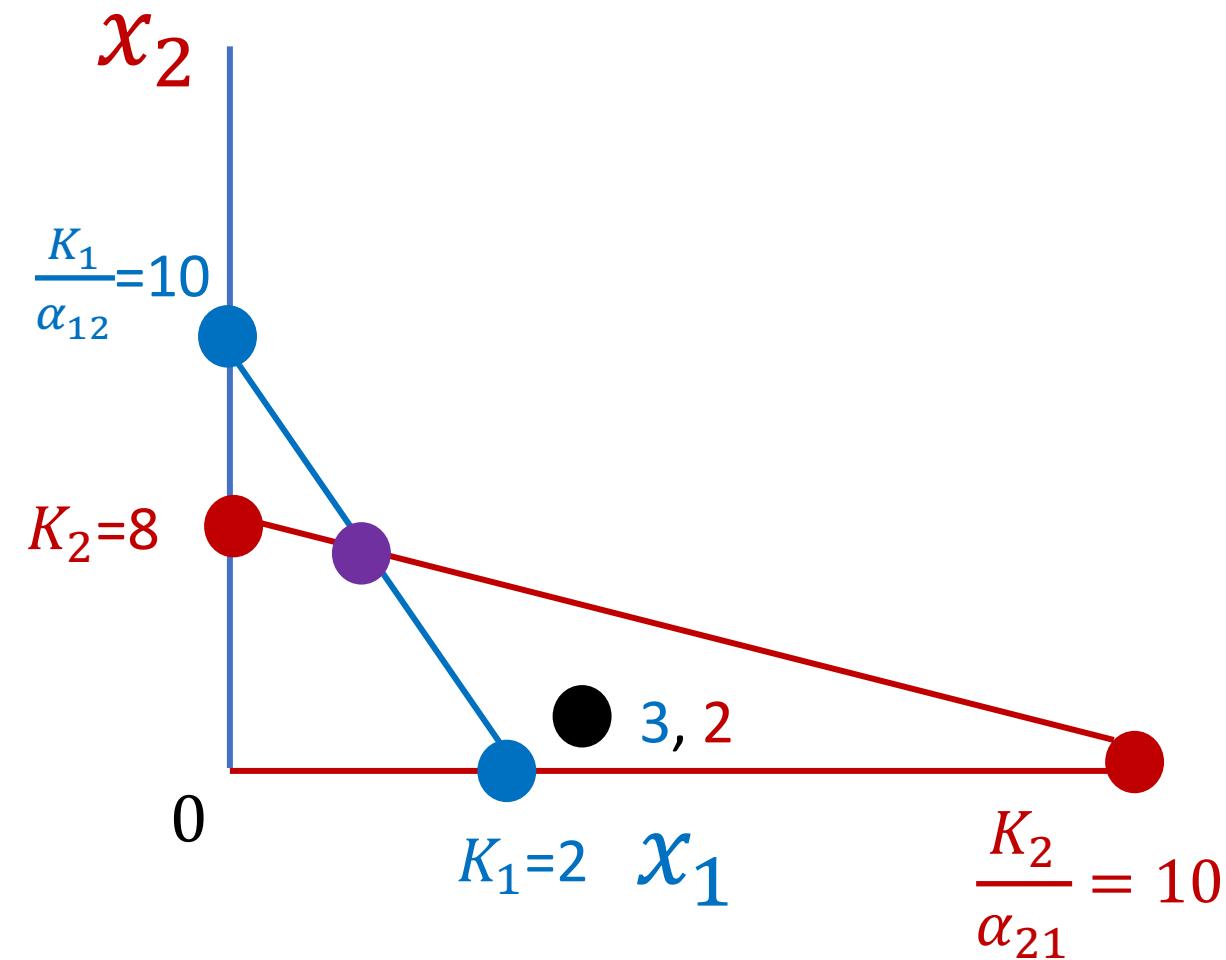
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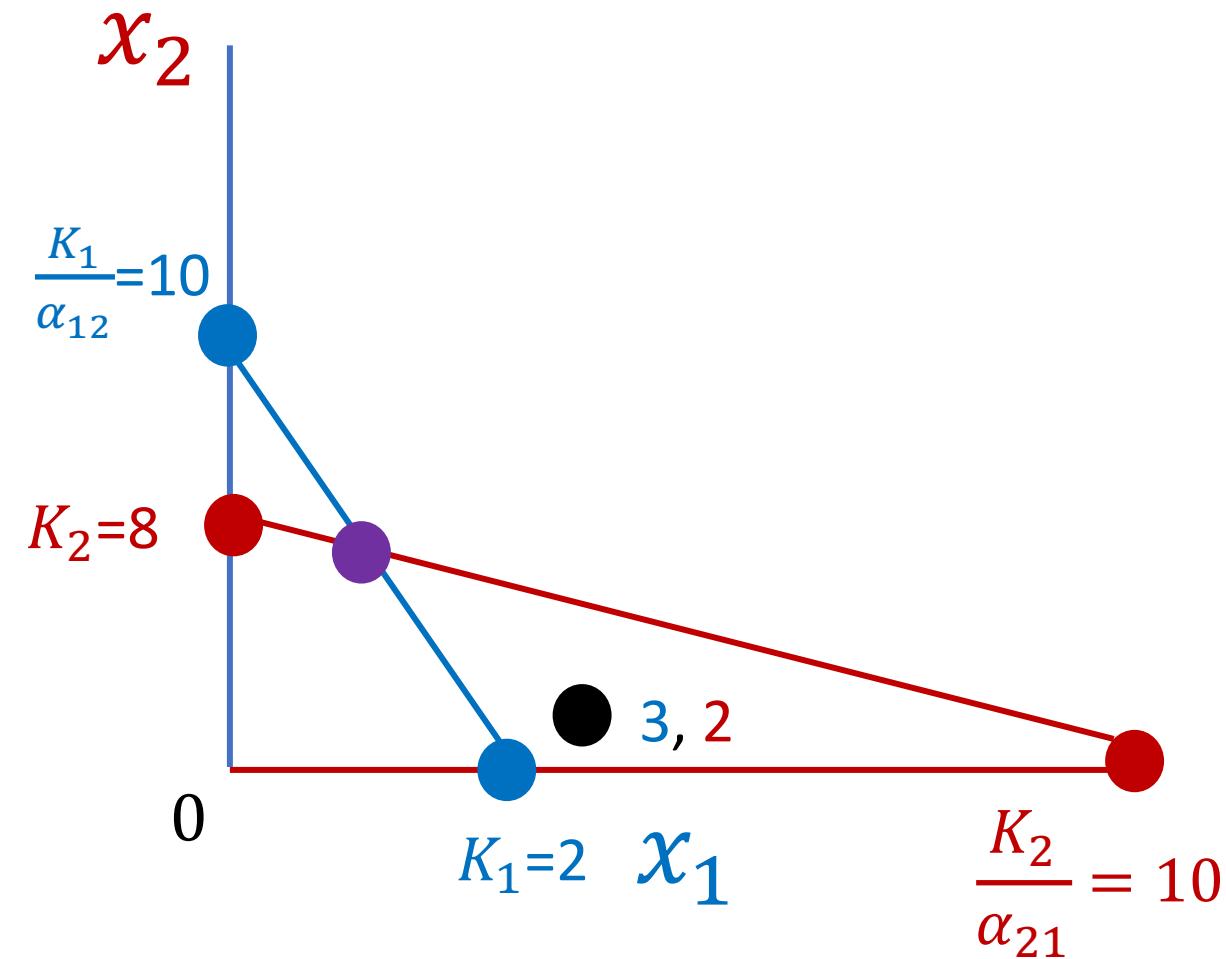
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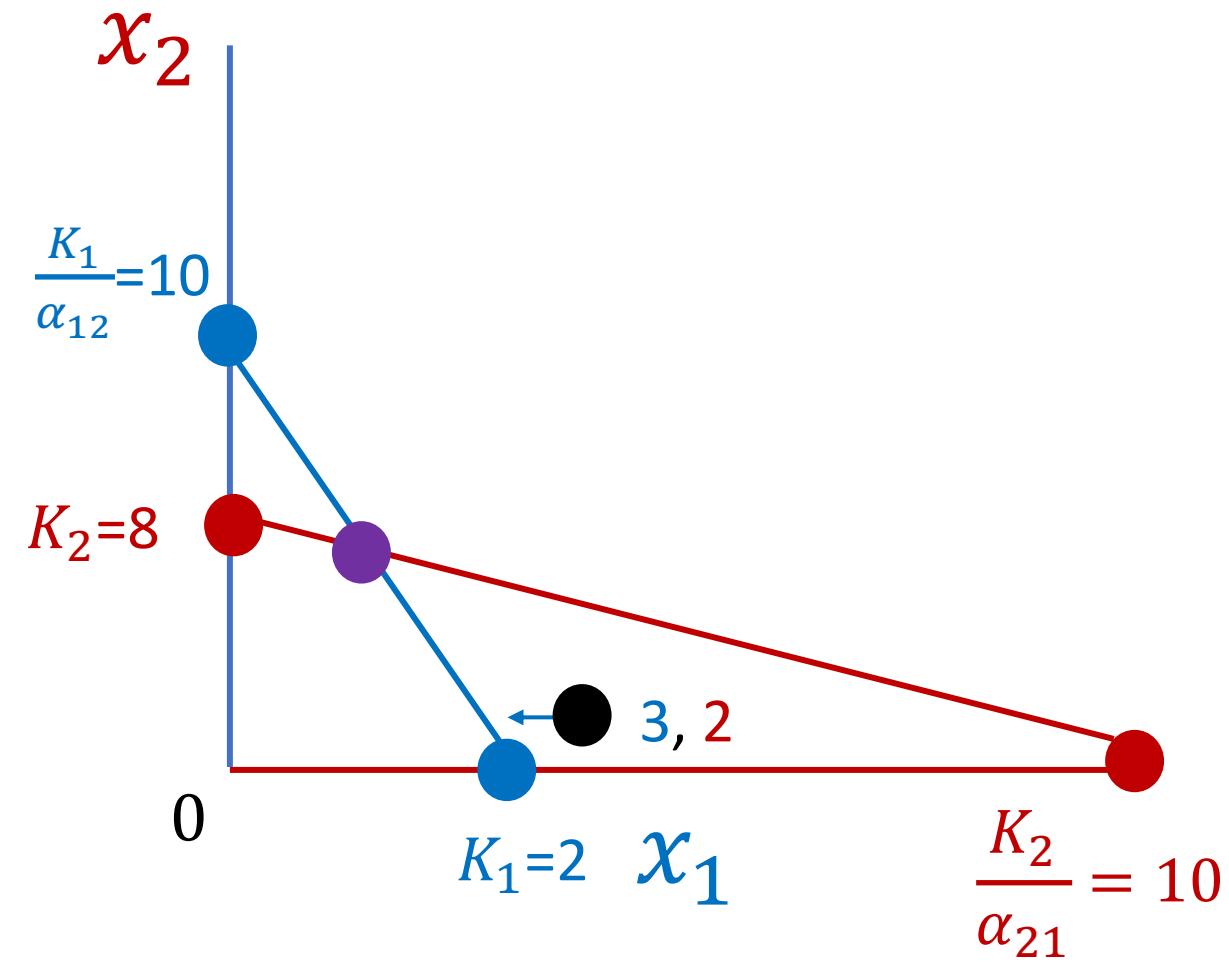
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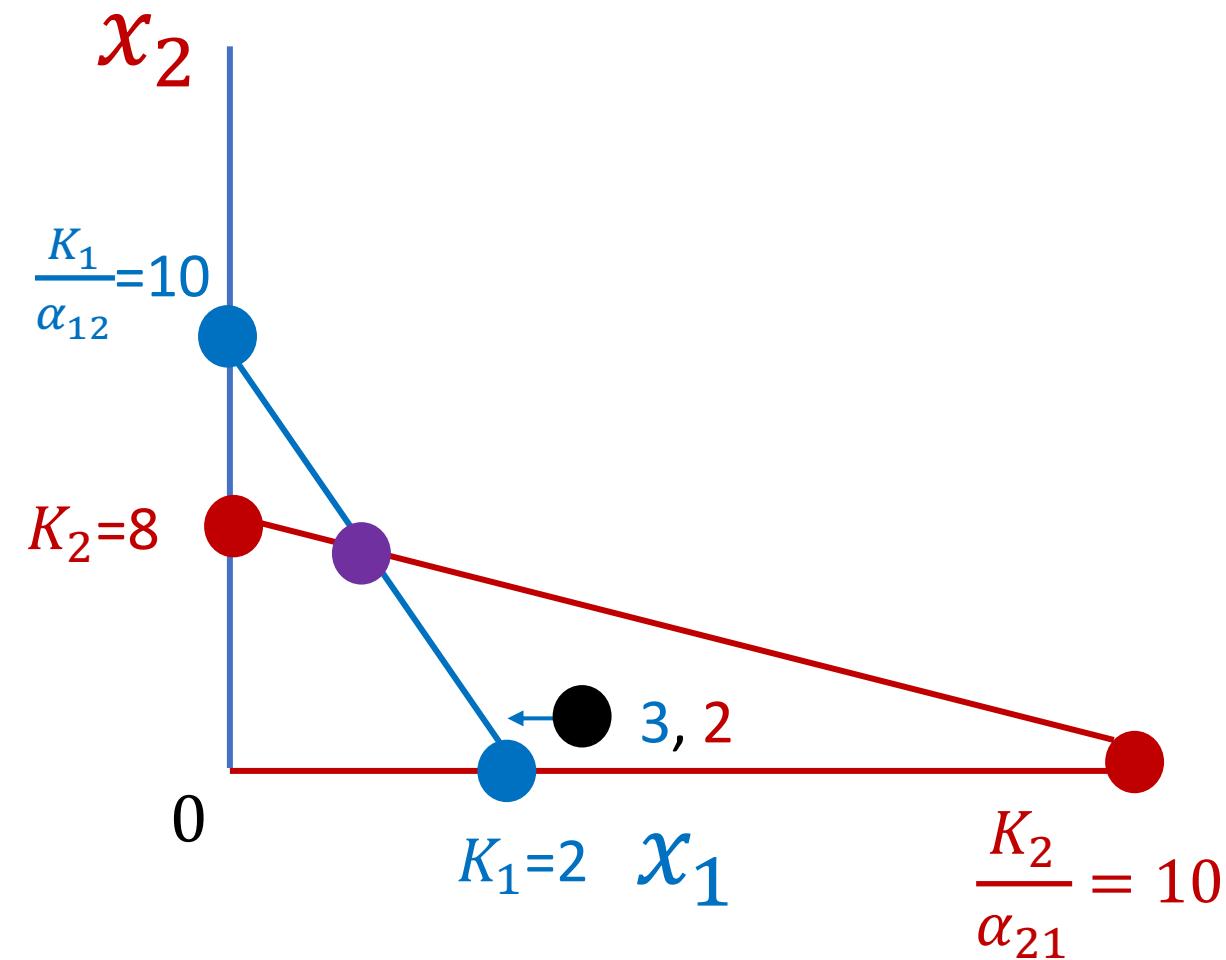
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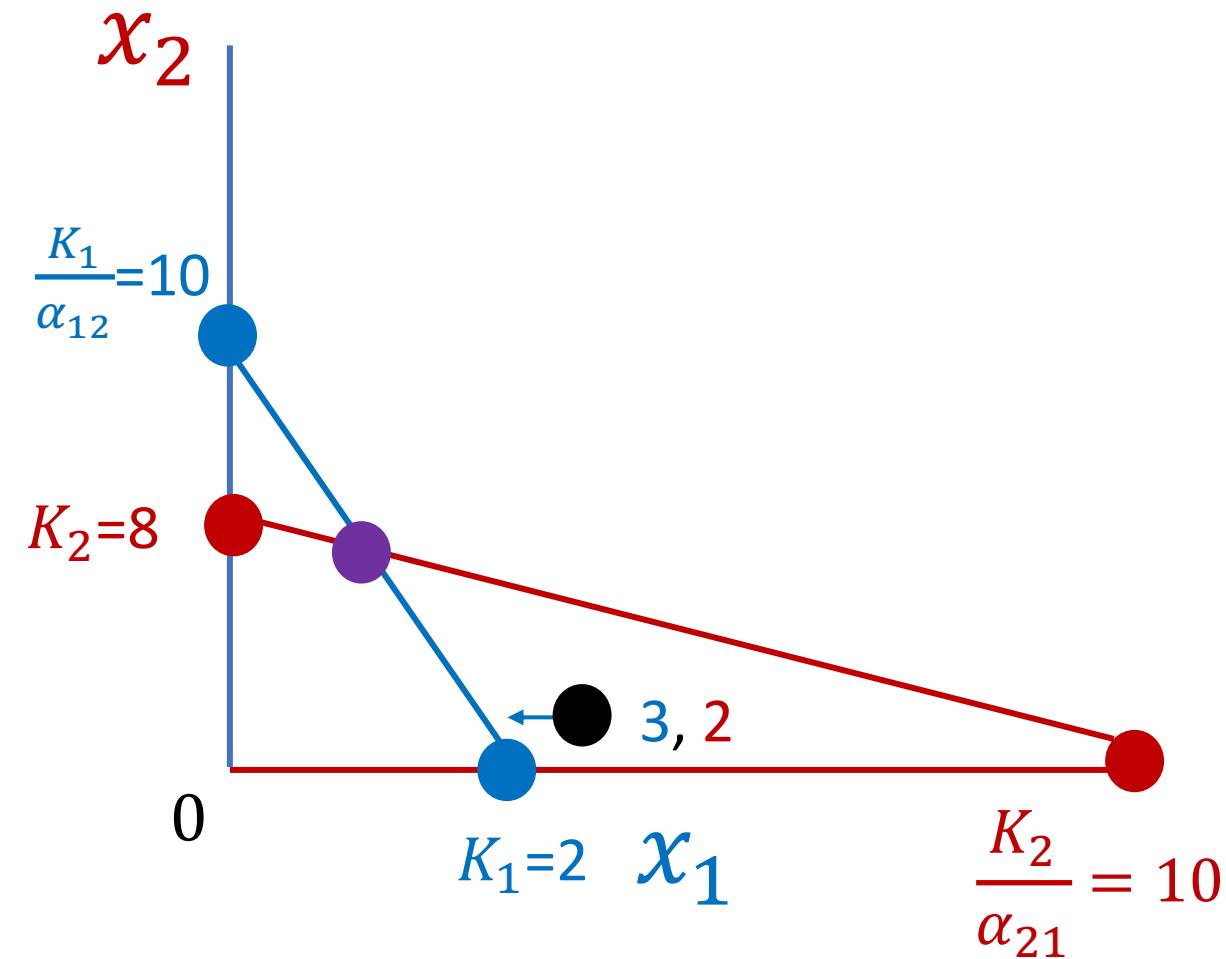
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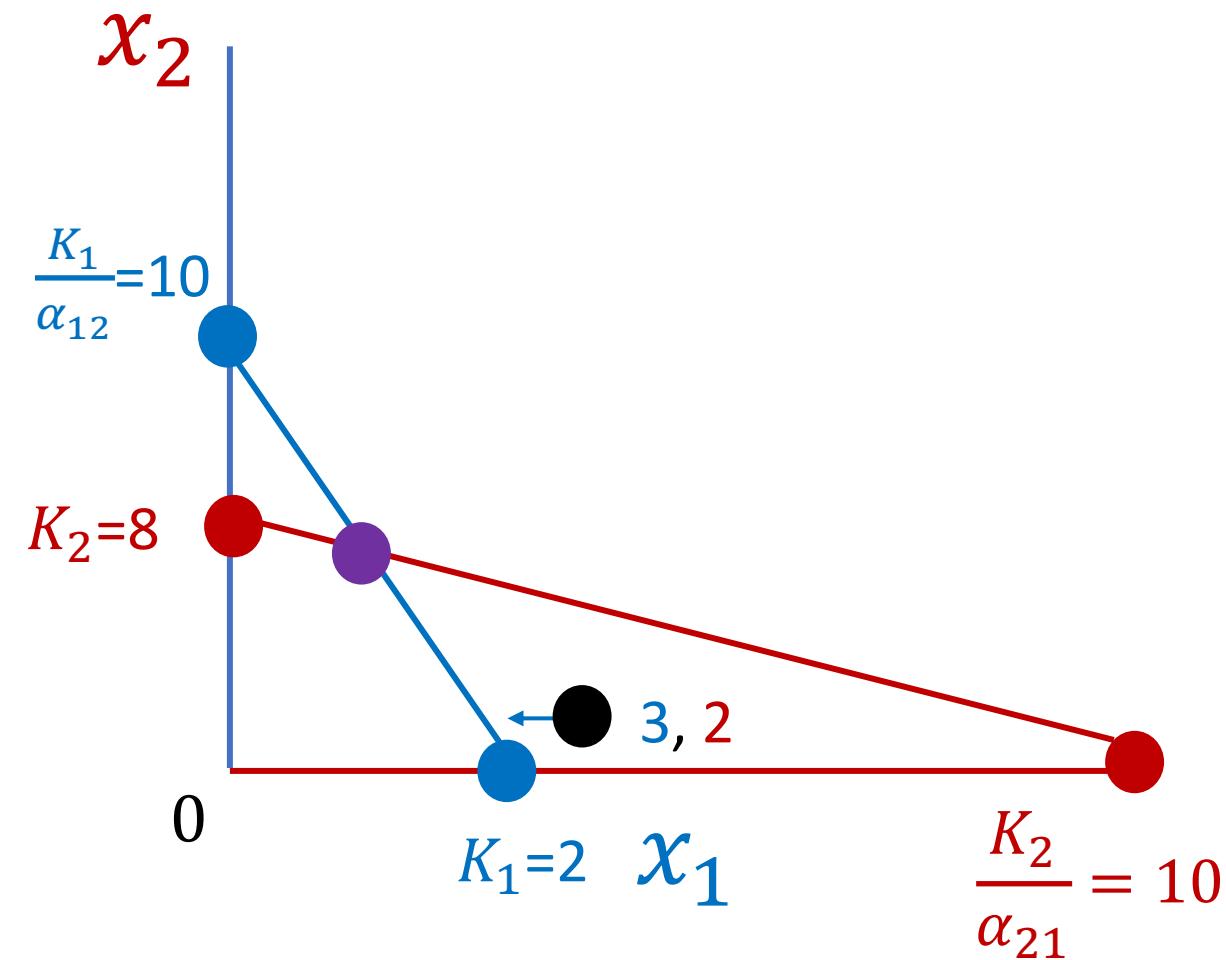
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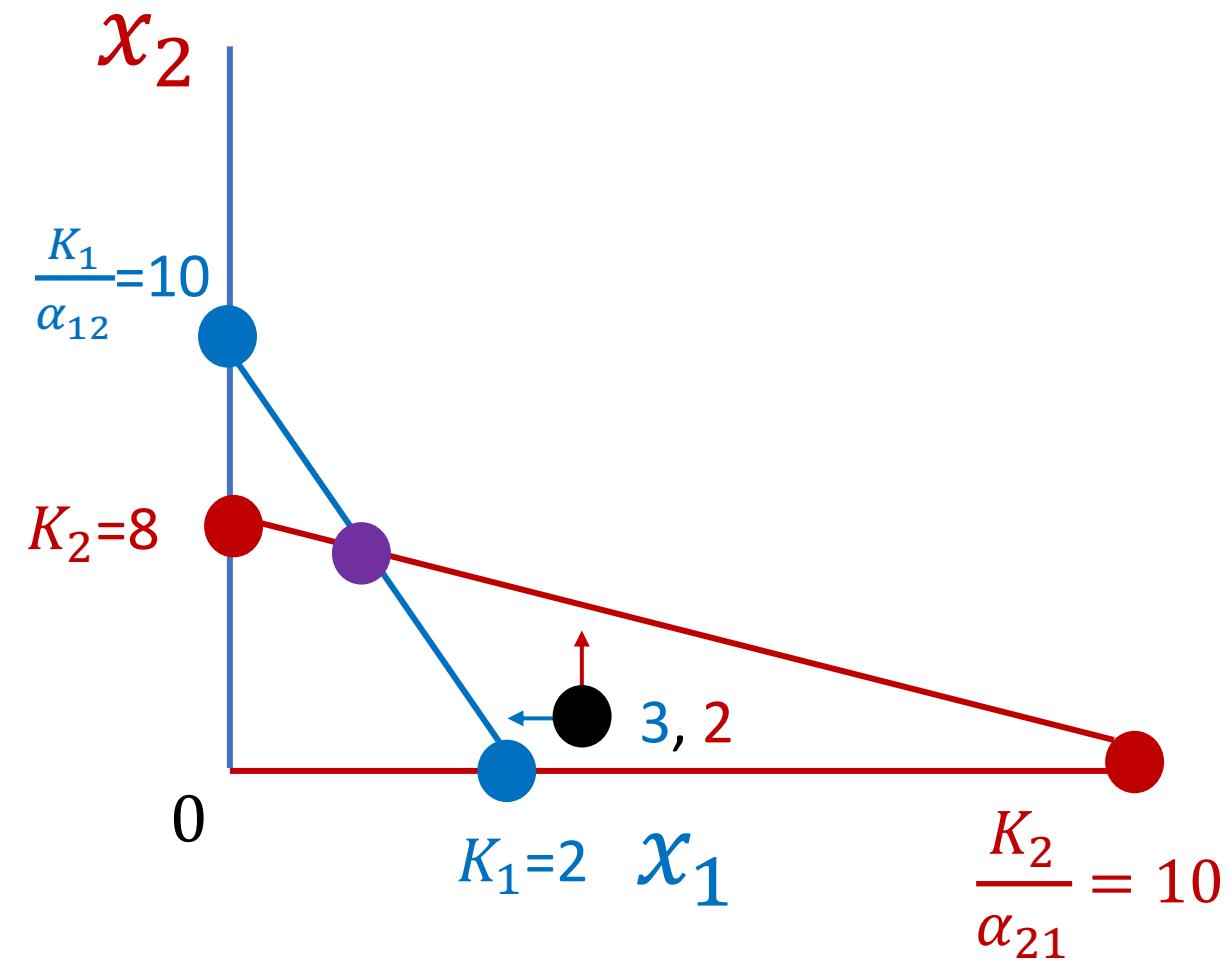
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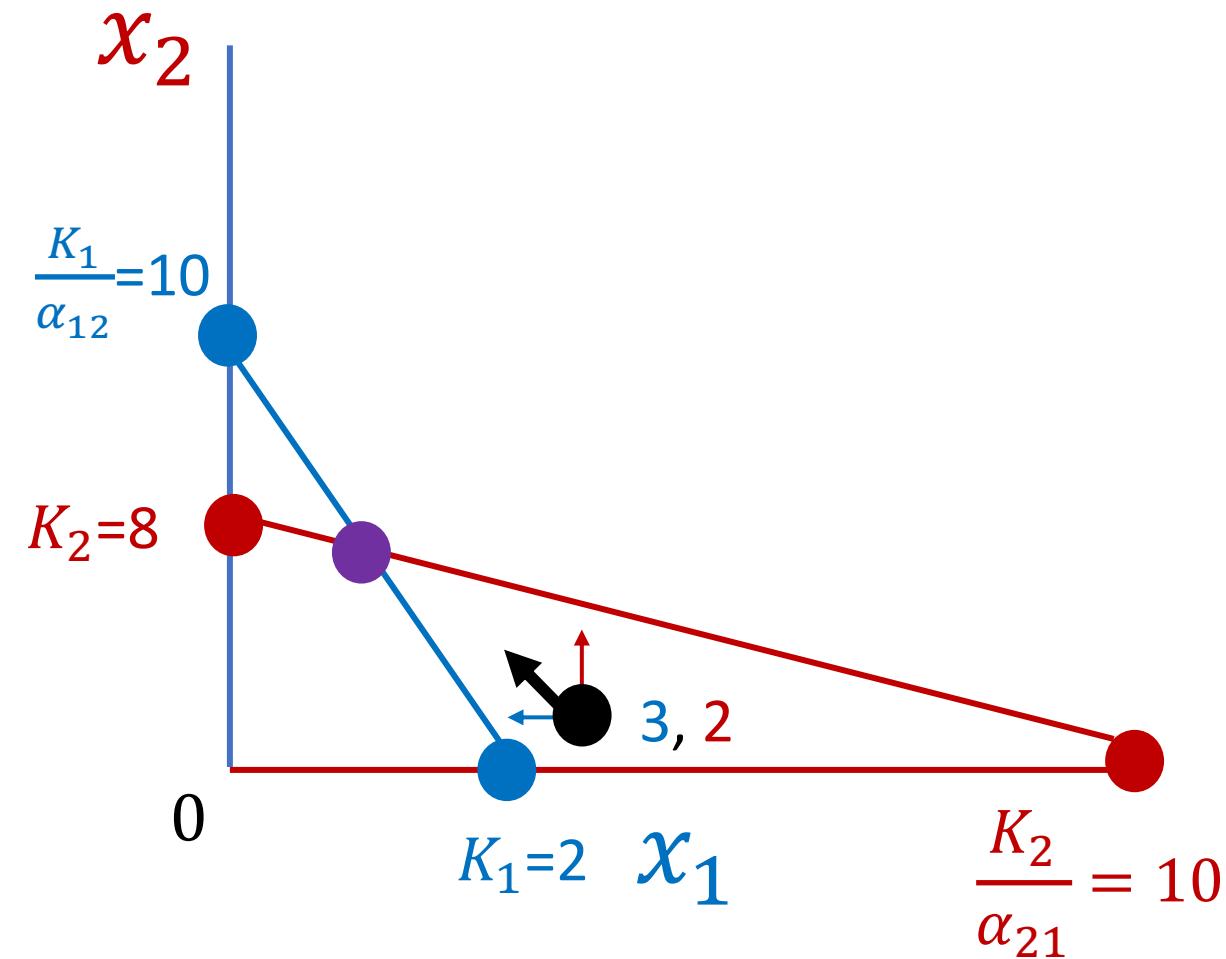
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Results replicate graphical approach!

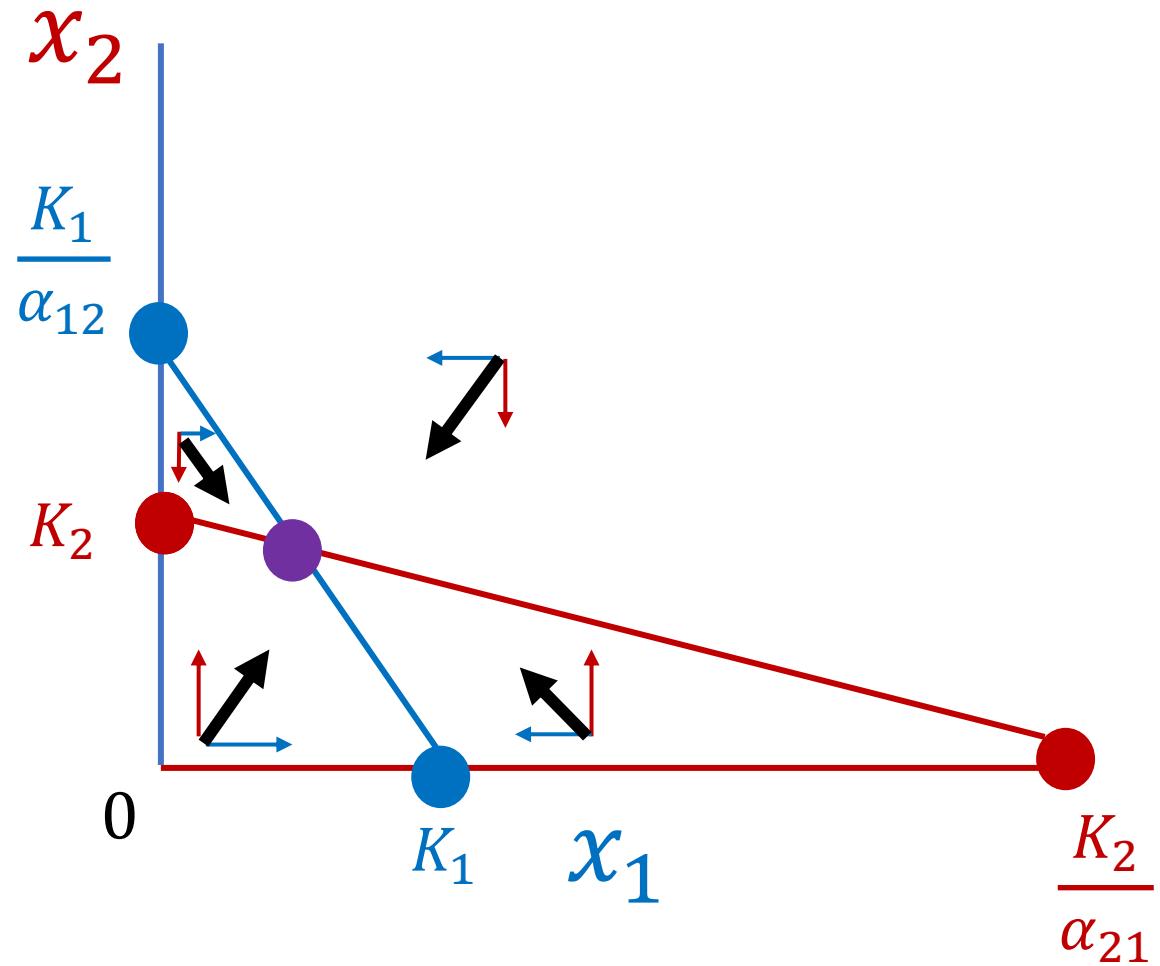


Four possible outcomes for competition

Case 1:

Stable equilibrium, with **coexistence** at:

$$x_1^* = \frac{K_1 - K_2 \alpha_{12}}{1 - \alpha_{21} \alpha_{12}} \quad x_2^* = \frac{K_2 - K_1 \alpha_{21}}{1 - \alpha_{12} \alpha_{21}}$$



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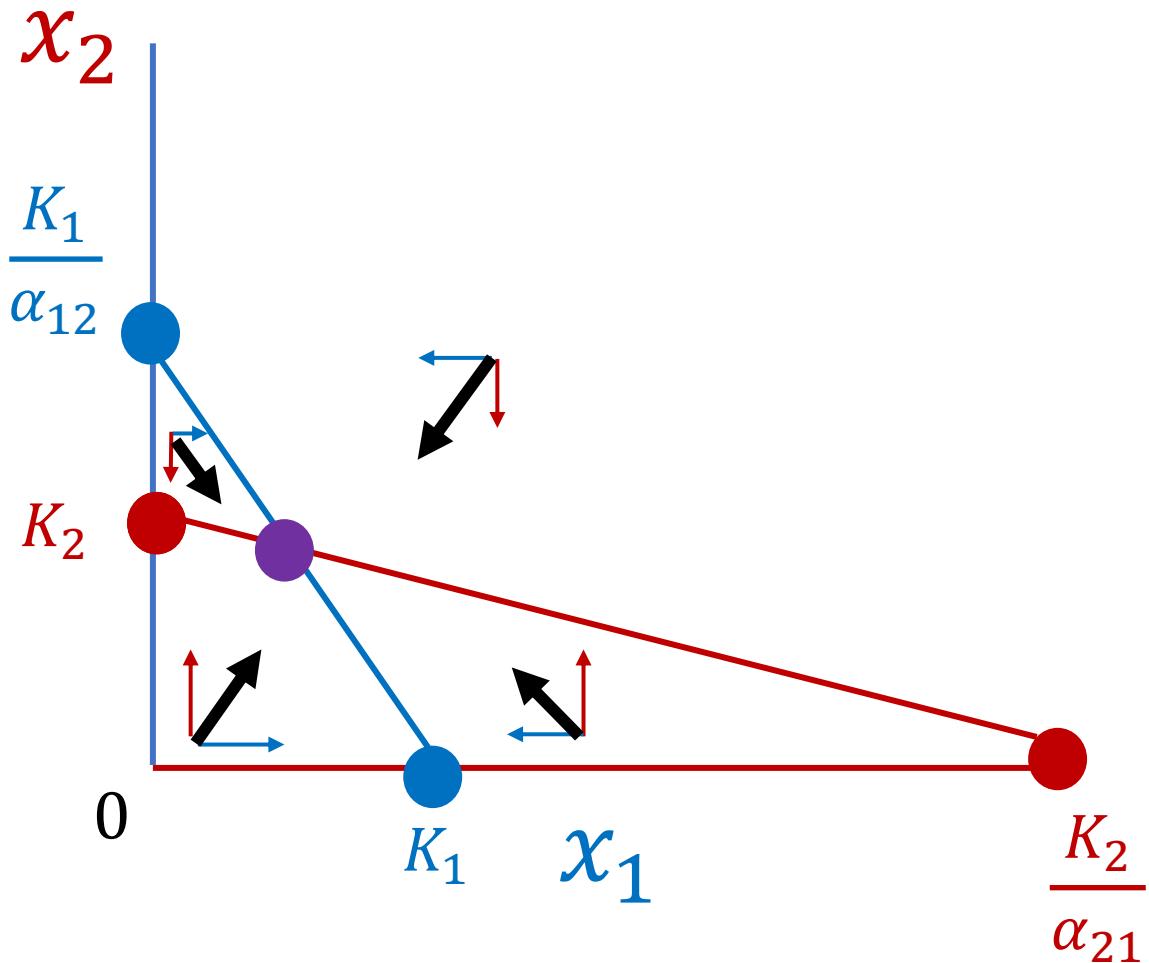
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$$(\alpha_{12} * \alpha_{21} < 1)$$



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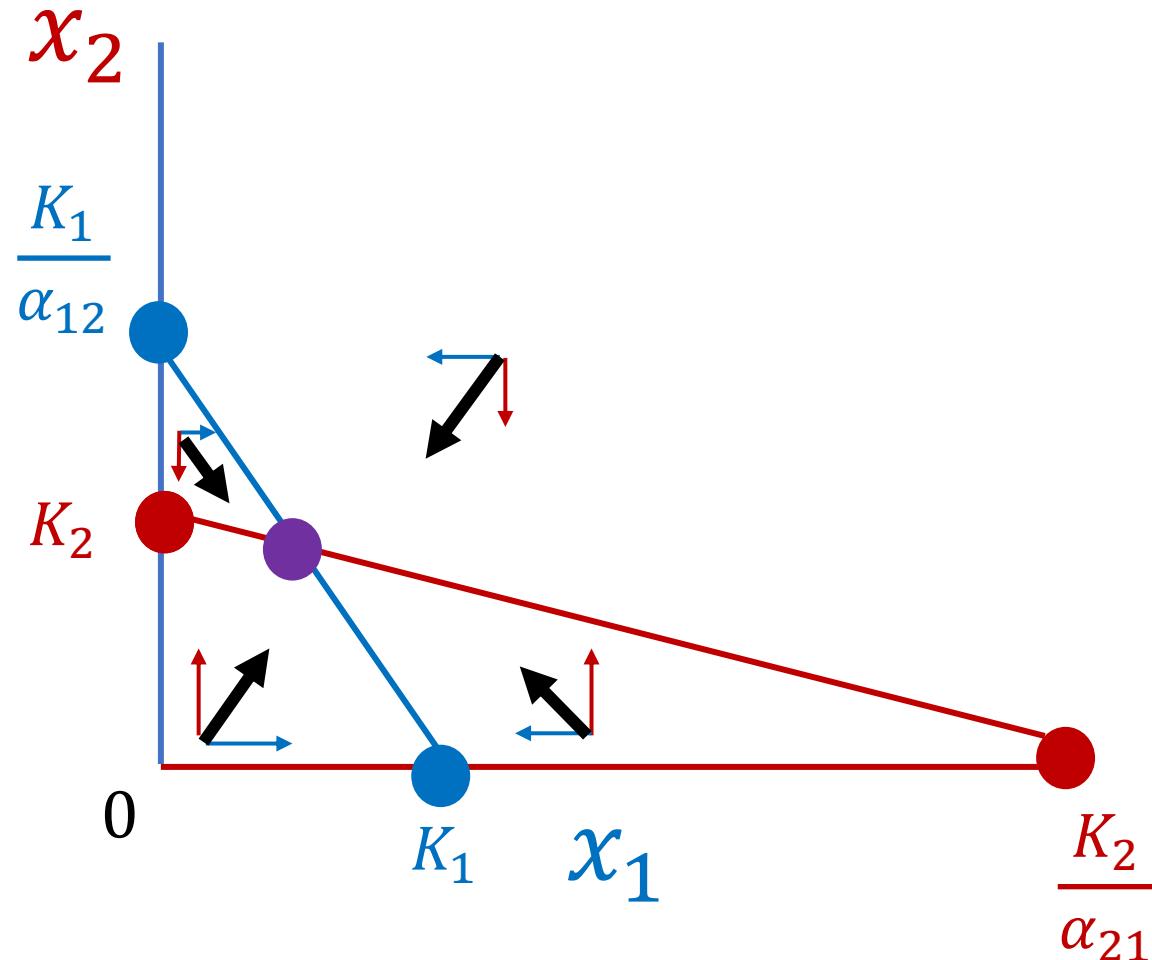
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- Species coexist stably but **below carrying capacity** for each individual population.
- Intraspecific** competition is stronger than **interspecific** competition.

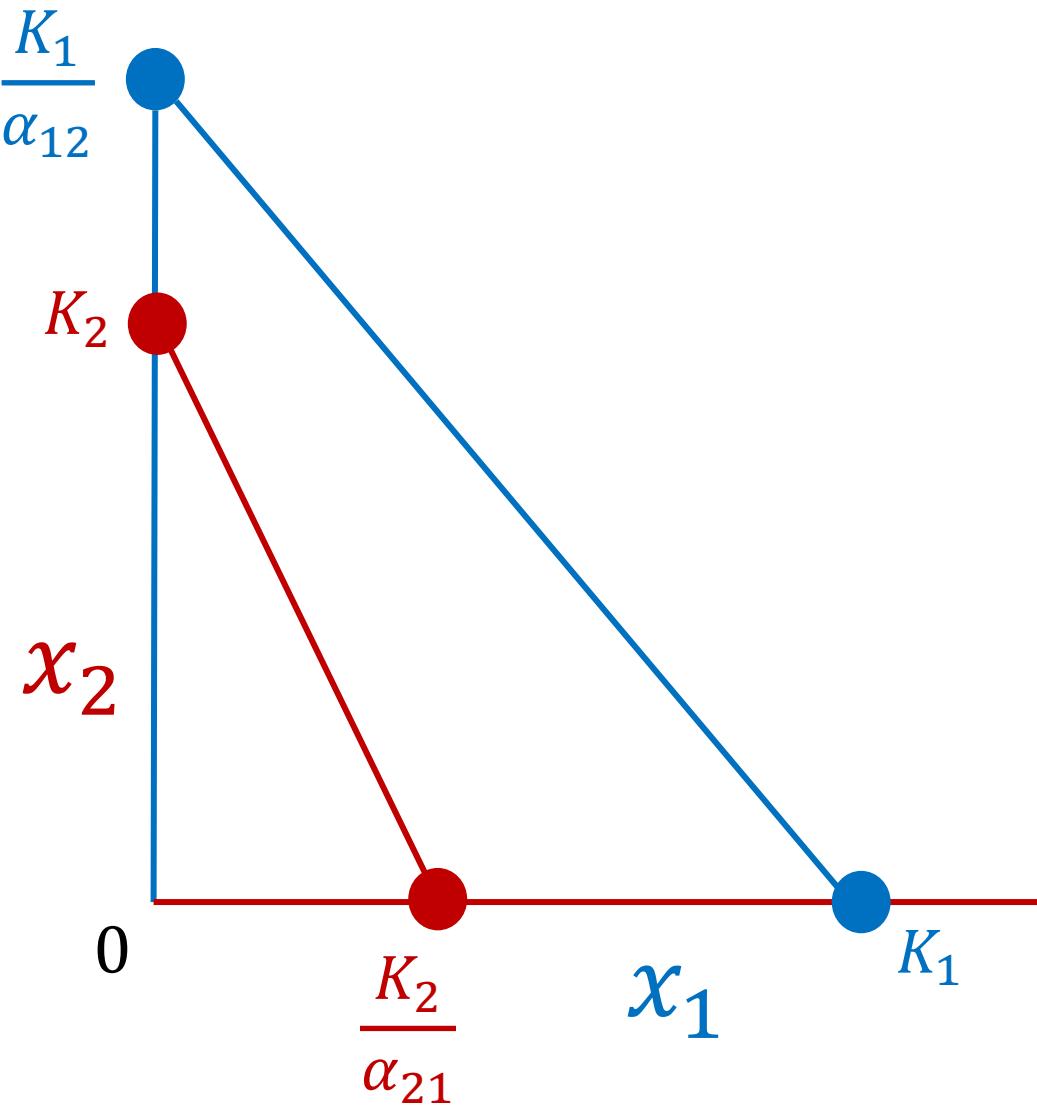


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Case 2:

Species 1 outcompetes species 2

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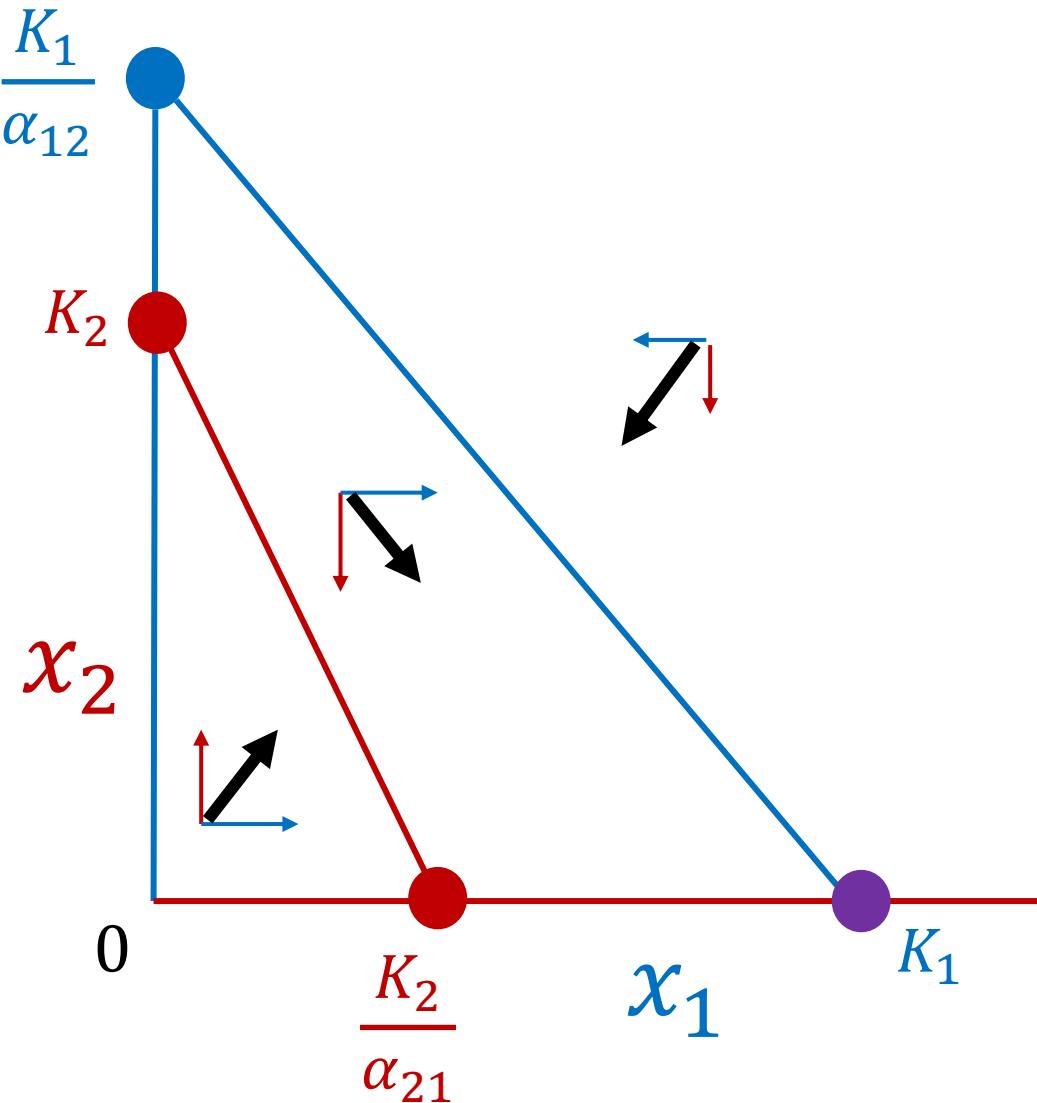
Case 2:

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System collapses to equilibrium:

$$x_1^* = K_1; x_2^* = 0$$

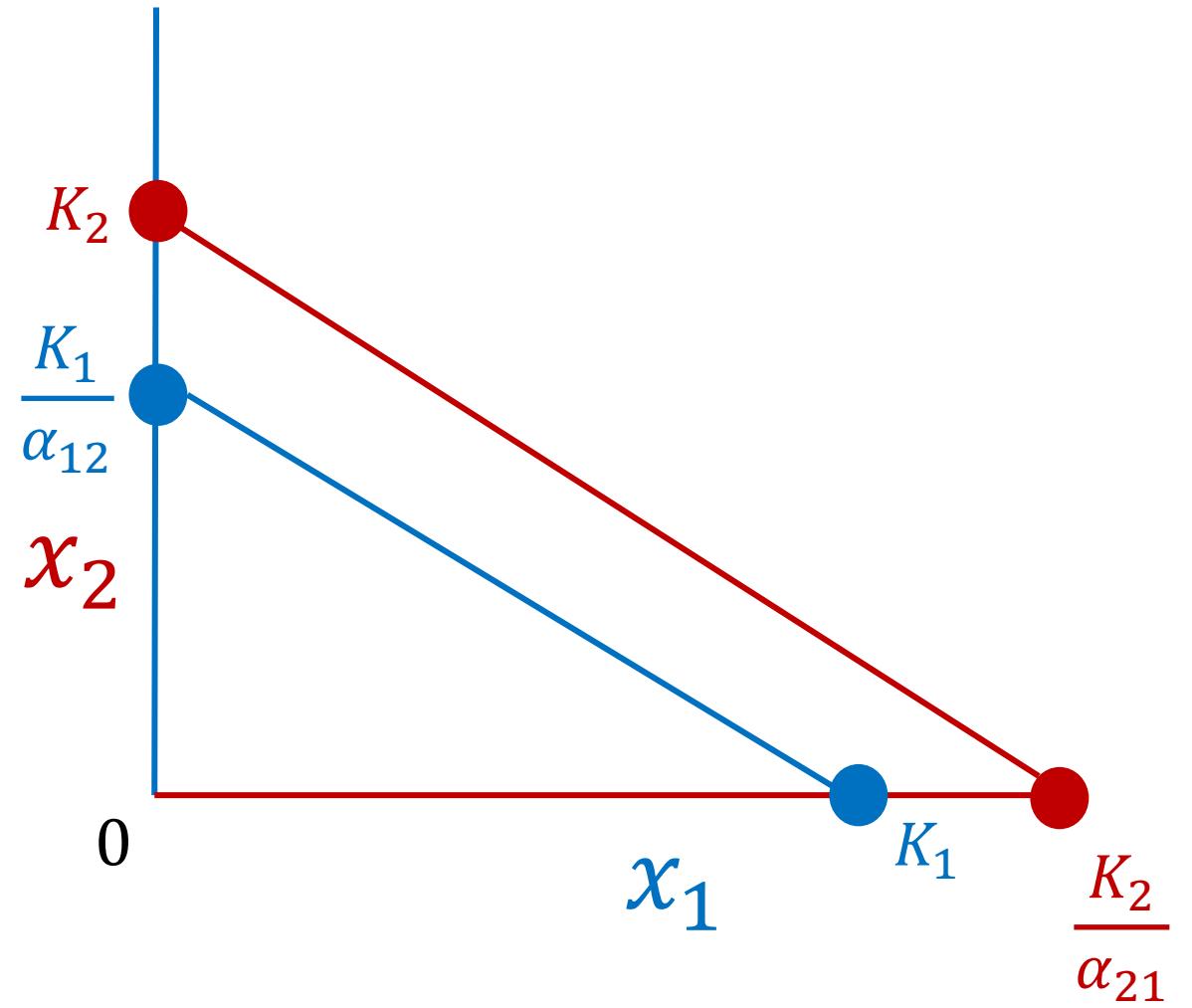


Four possible outcomes for competition

Case 3:

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Four possible outcomes for competition

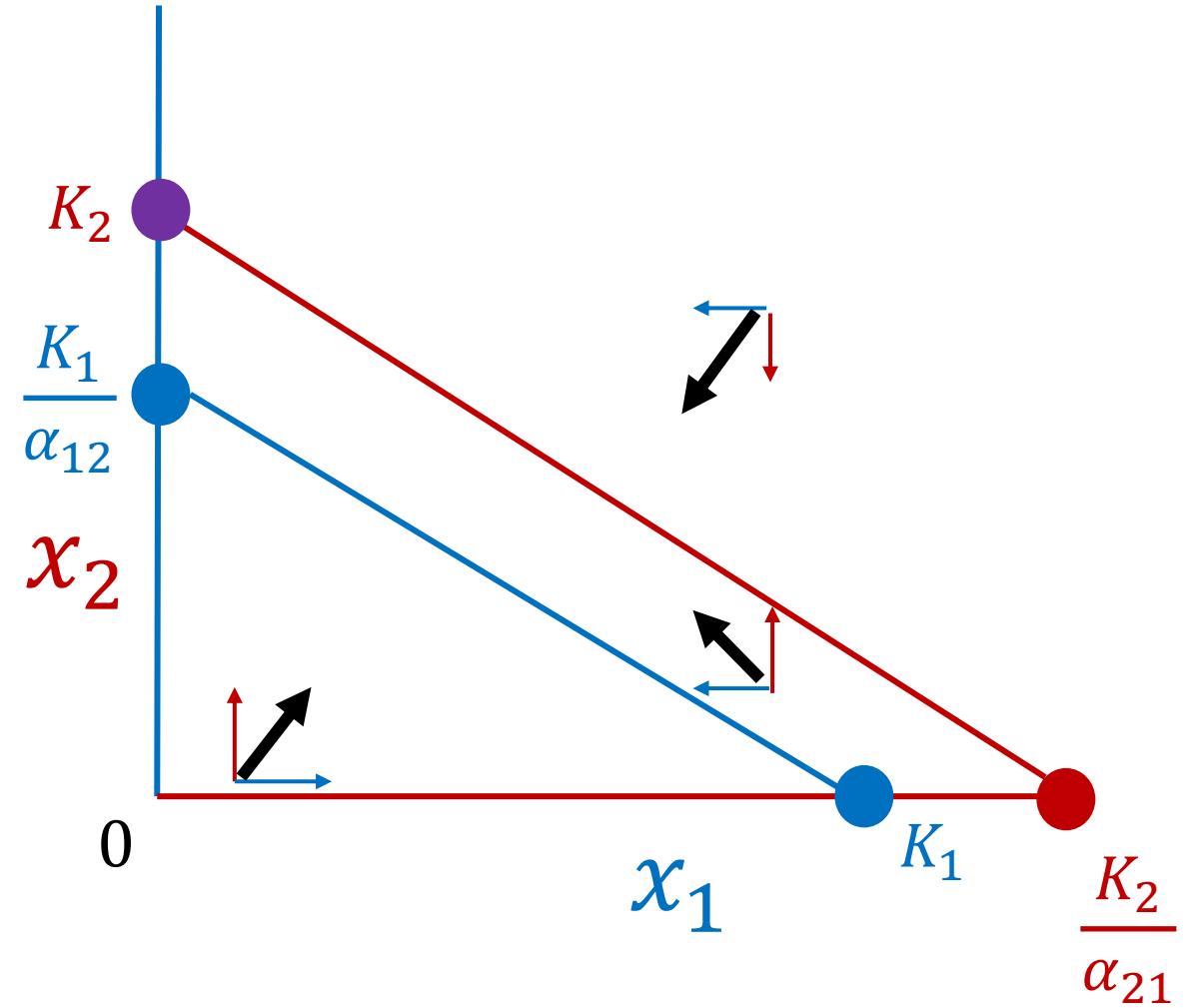
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Species 2 outcompetes species 1

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$$x_1^* = 0; x_2^* = K_2$$

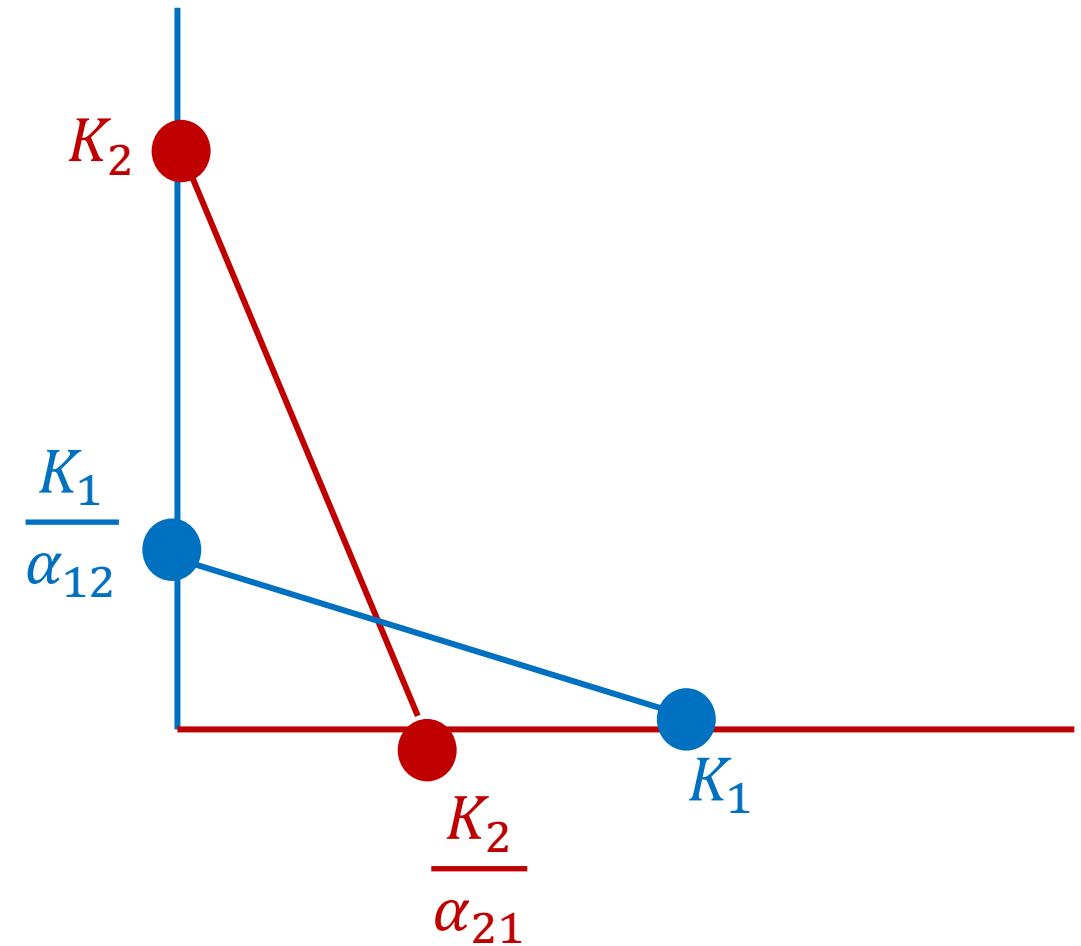


Four possible outcomes for competition

Case 4: Precedence

Aggressive interspecific competition.

Outcome depends on starting conditions.



Four possible outcomes for competition

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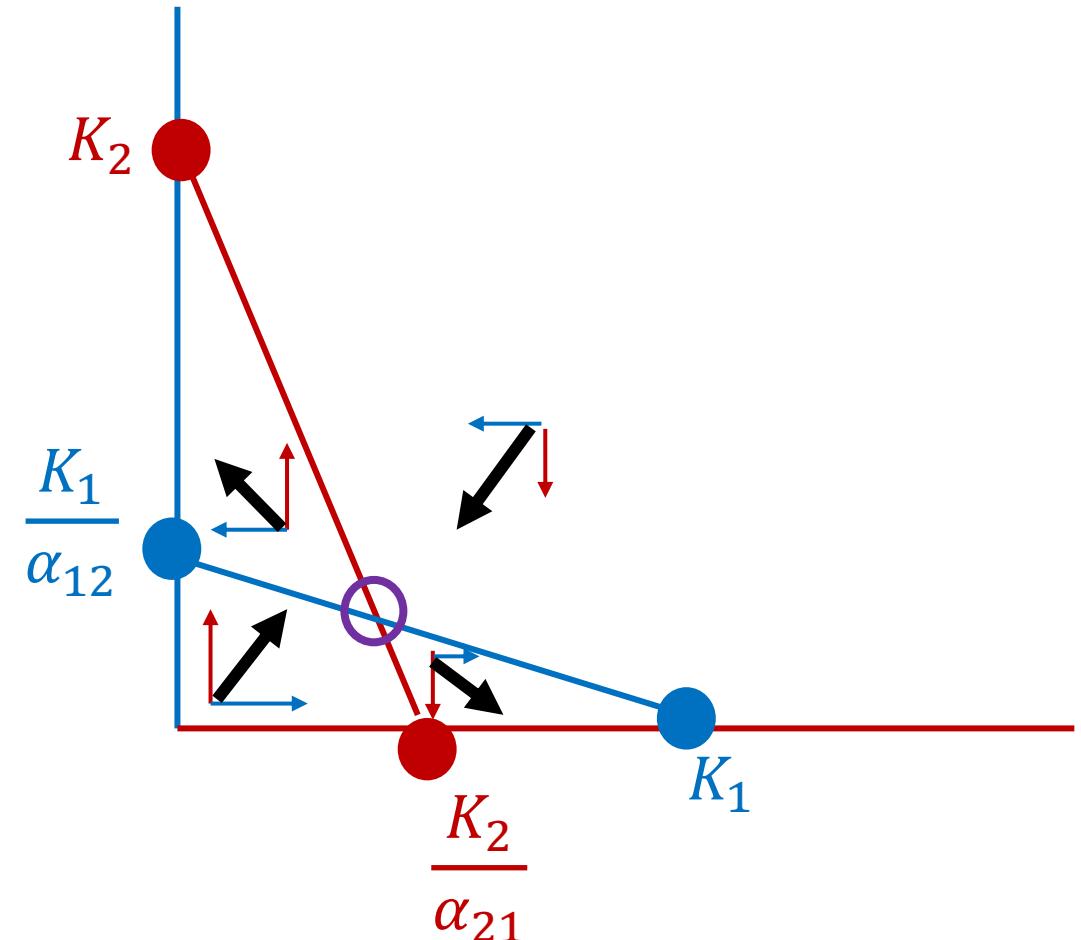
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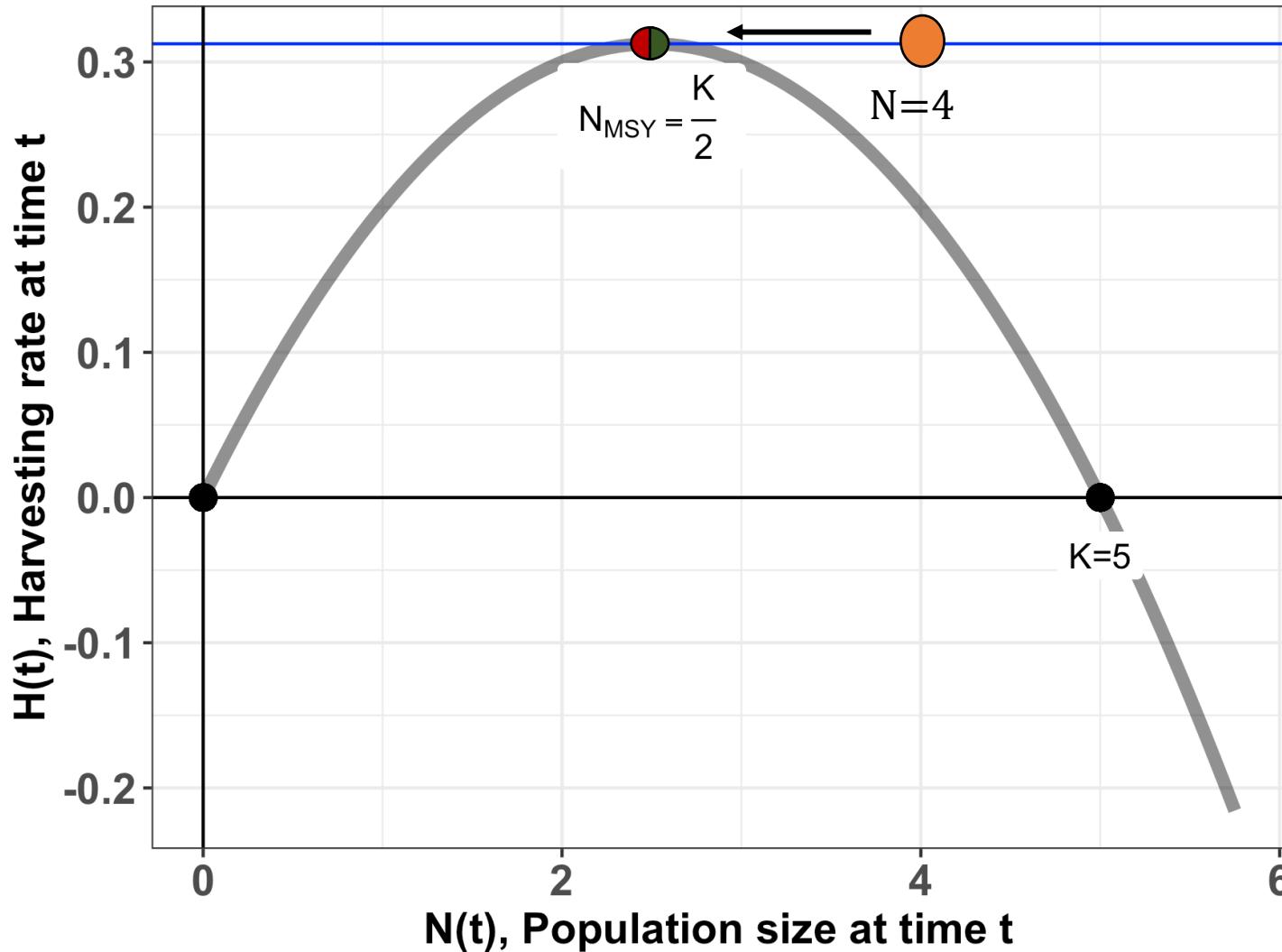
$(\alpha_{12} * \alpha_{21} > 1)$

- **System will move towards either single species equilibria** ($x_1^* = 0$; $x_2^* = K_2$ OR $x_1^* = K_1$; $x_2^* = 0$), depending on starting conditions.
- Under extremely unrealistic starting conditions, system will sit at an **unstable equilibrium** that will collapse in either direction following slight perturbation.



Remember MSY, the semi-stable equilibrium:

$$\frac{dN}{dt} = rN \left(1 - \frac{N}{K}\right) - H$$



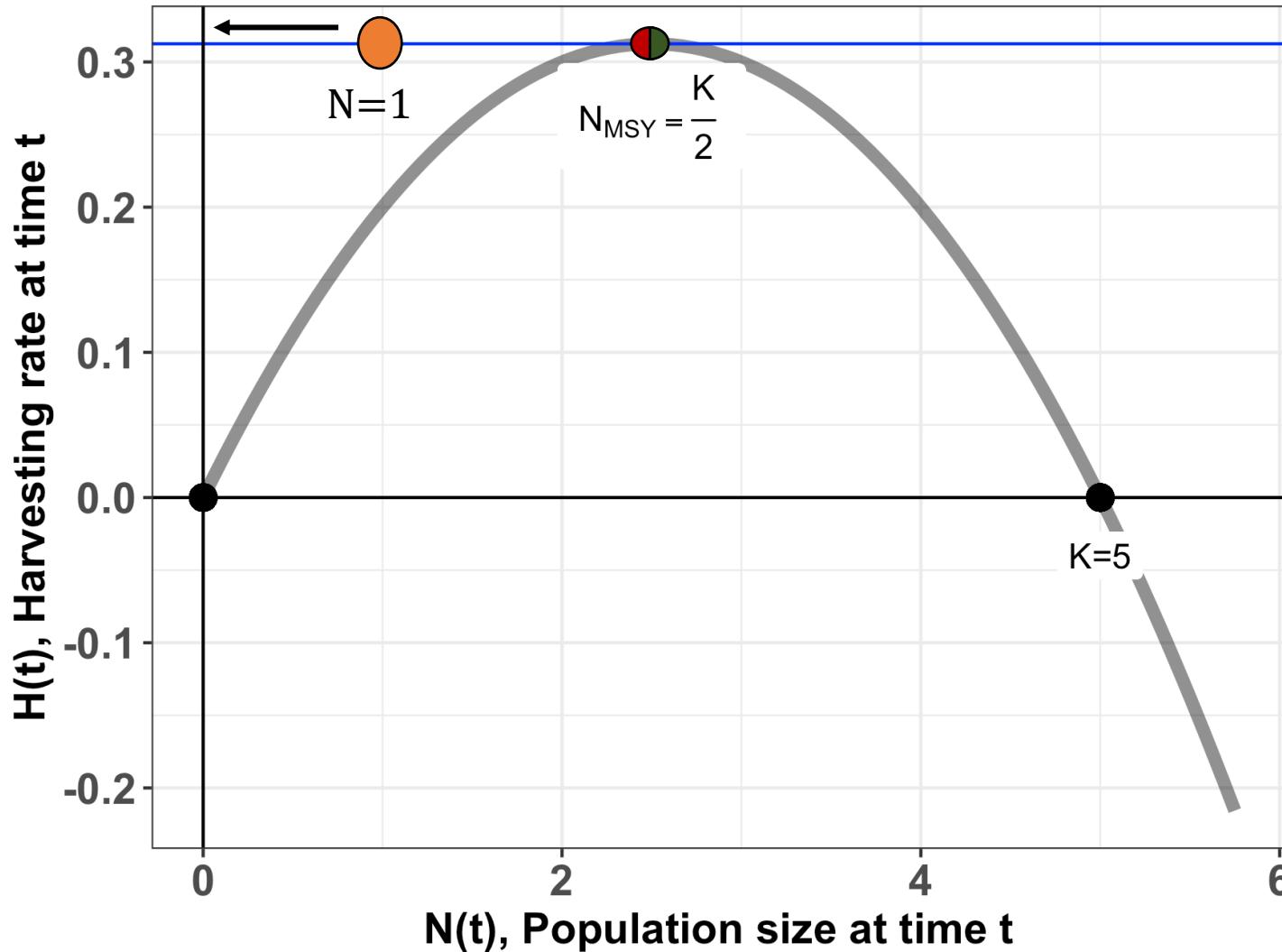
$$K=5$$
$$r=0.25$$
$$H=.3125$$

$$\frac{dN}{dt} = 0.25 * 4 \left(1 - \frac{4}{5}\right) - .3125$$

$$\frac{dN}{dt} = (-)$$

Remember MSY, the semi-stable equilibrium:

$$\frac{dN}{dt} = rN \left(1 - \frac{N}{K}\right) - H$$



$$K=5$$

$$r=0.25$$

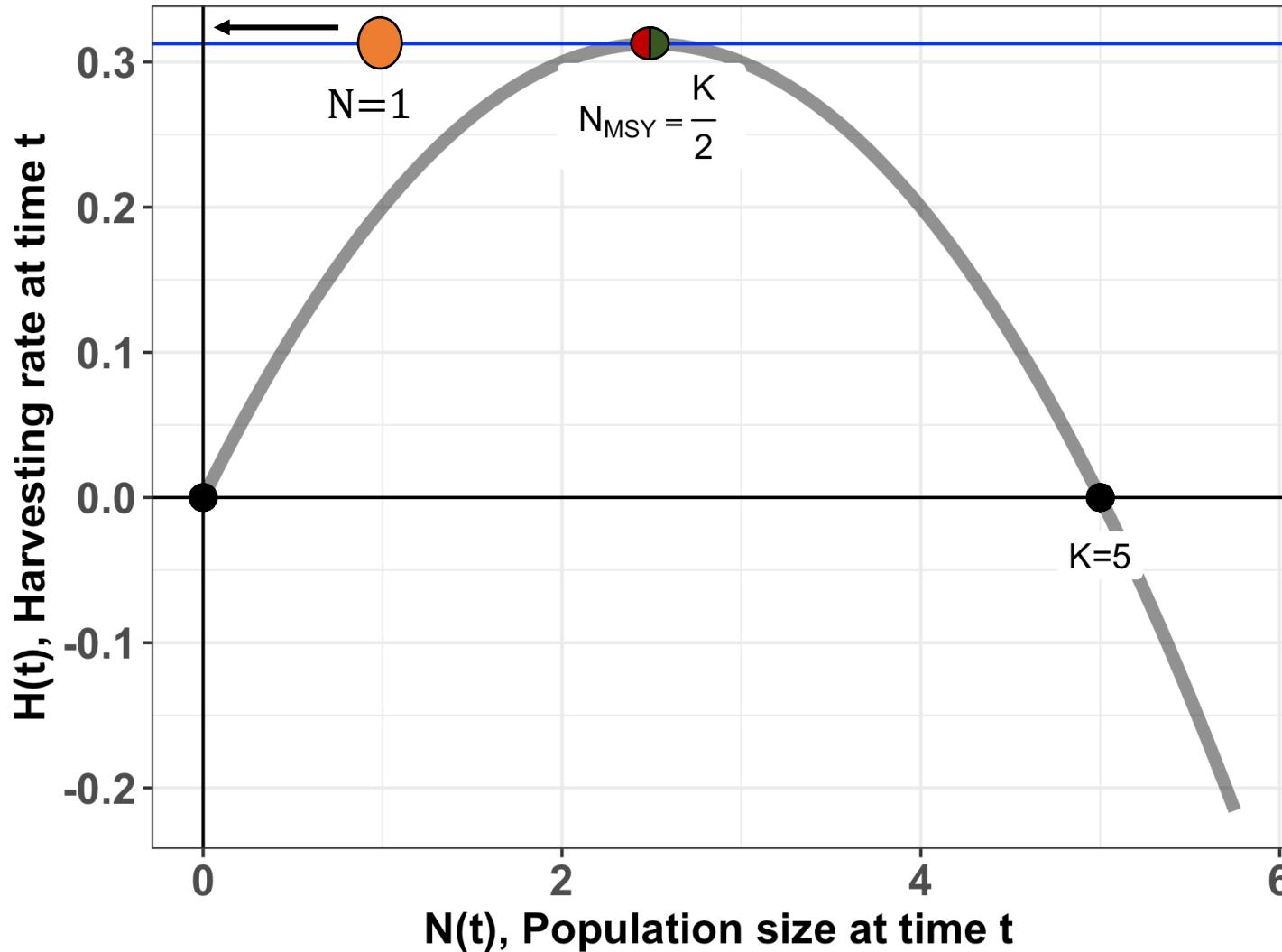
$$H=.3125$$

$$\frac{dN}{dt} = 0.25 * 1 \left(1 - \frac{1}{5}\right) - .3125$$

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$$\frac{dN}{dt} = (-)$$

In a **semi-stable equilibrium**,
perturbations **sometimes** drive the
system away from equilibrium.

Four possible outcomes for competition

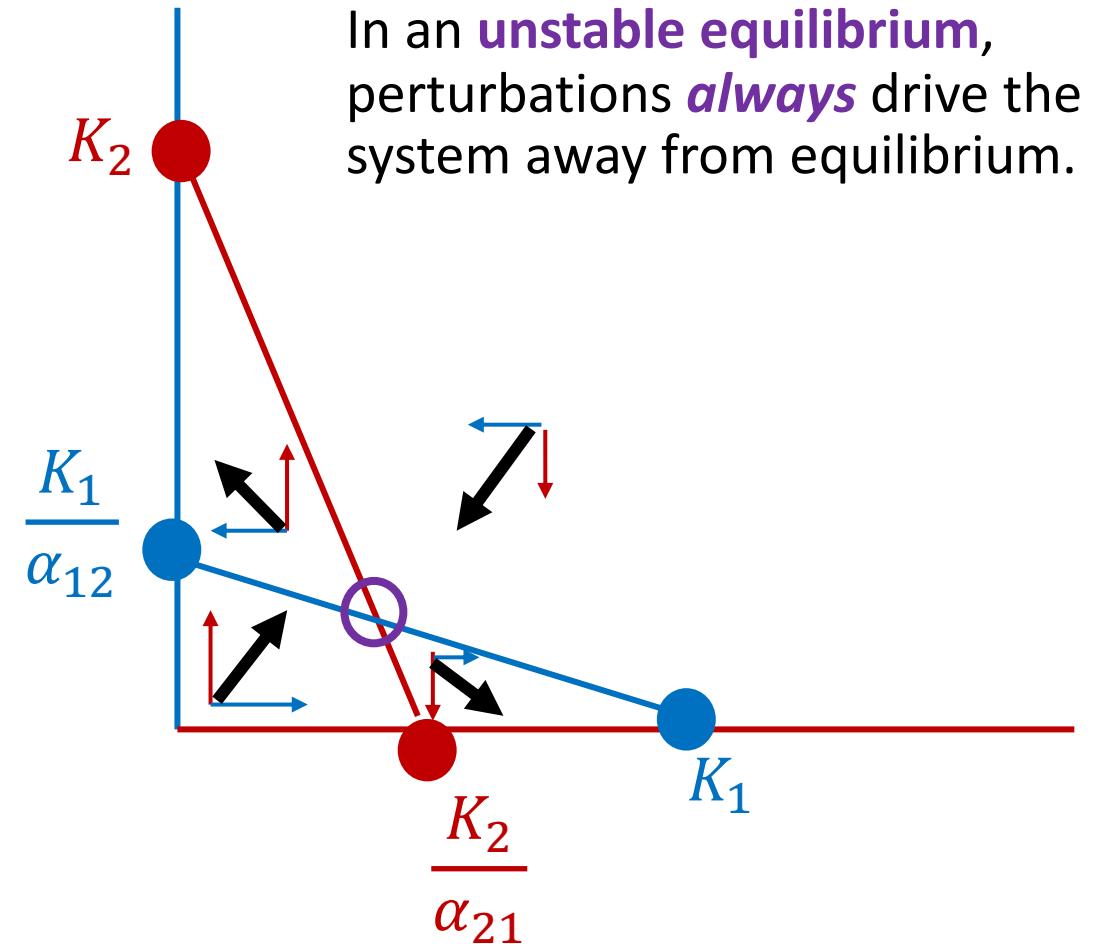
Case 4: Precedence

Aggressive interspecific competition.

Outcome depends on starting conditions.

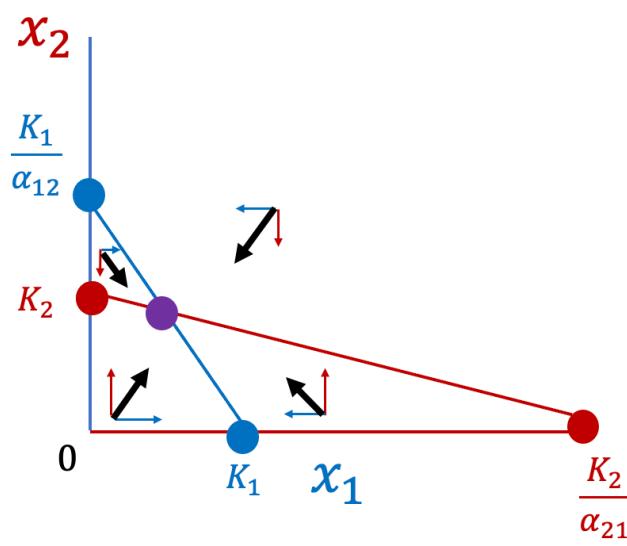
$$\frac{K_1}{\alpha_{12}} < K_2 \text{ & } \frac{K_2}{\alpha_{21}} < K_1$$

$$(\alpha_{12} * \alpha_{21} > 1)$$

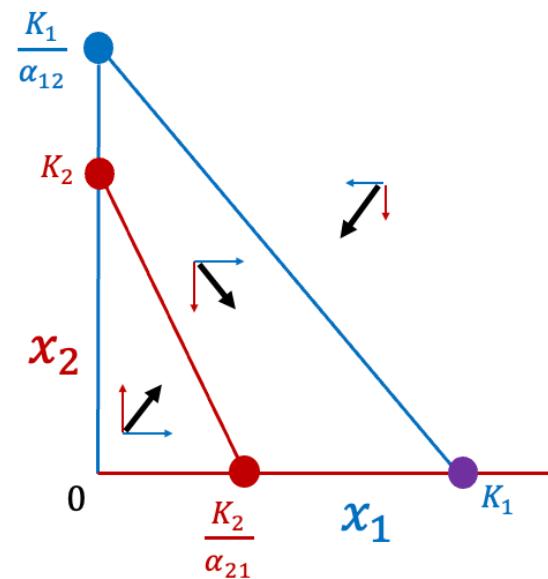


Phase plane analysis: graphical determination of the behavior of the state variables in a dynamical system (here, populations of animals)

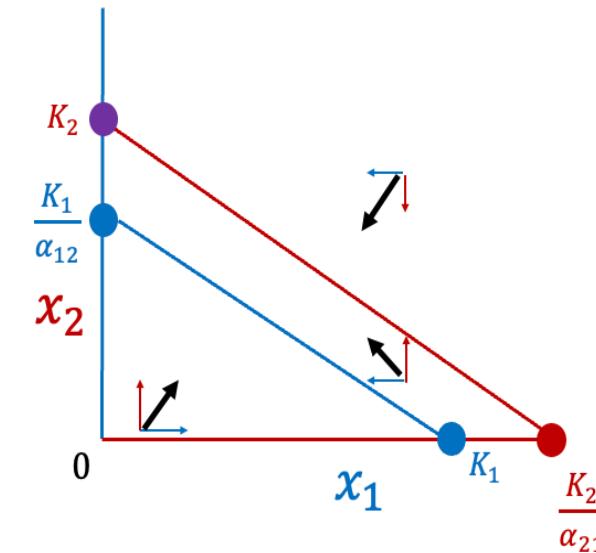
Case 1: Stable coexistence



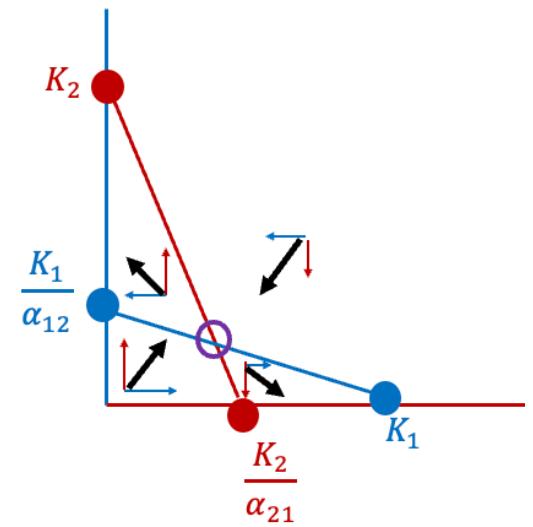
Case 2: Spp. 1 wins



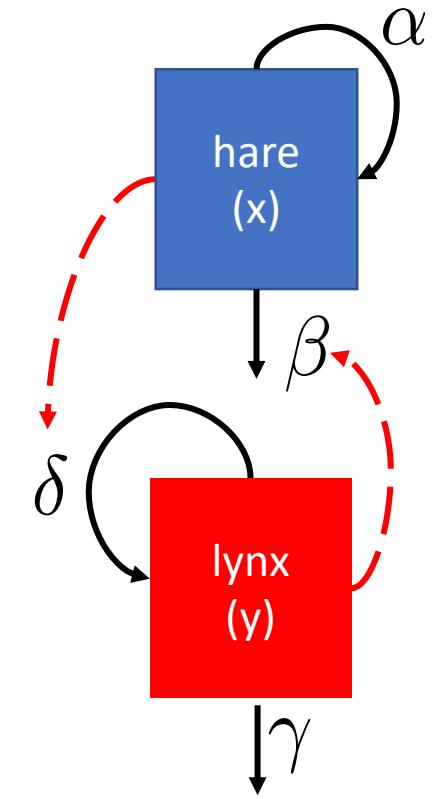
Case 3: Spp. 2 wins



Case 4: Precedence

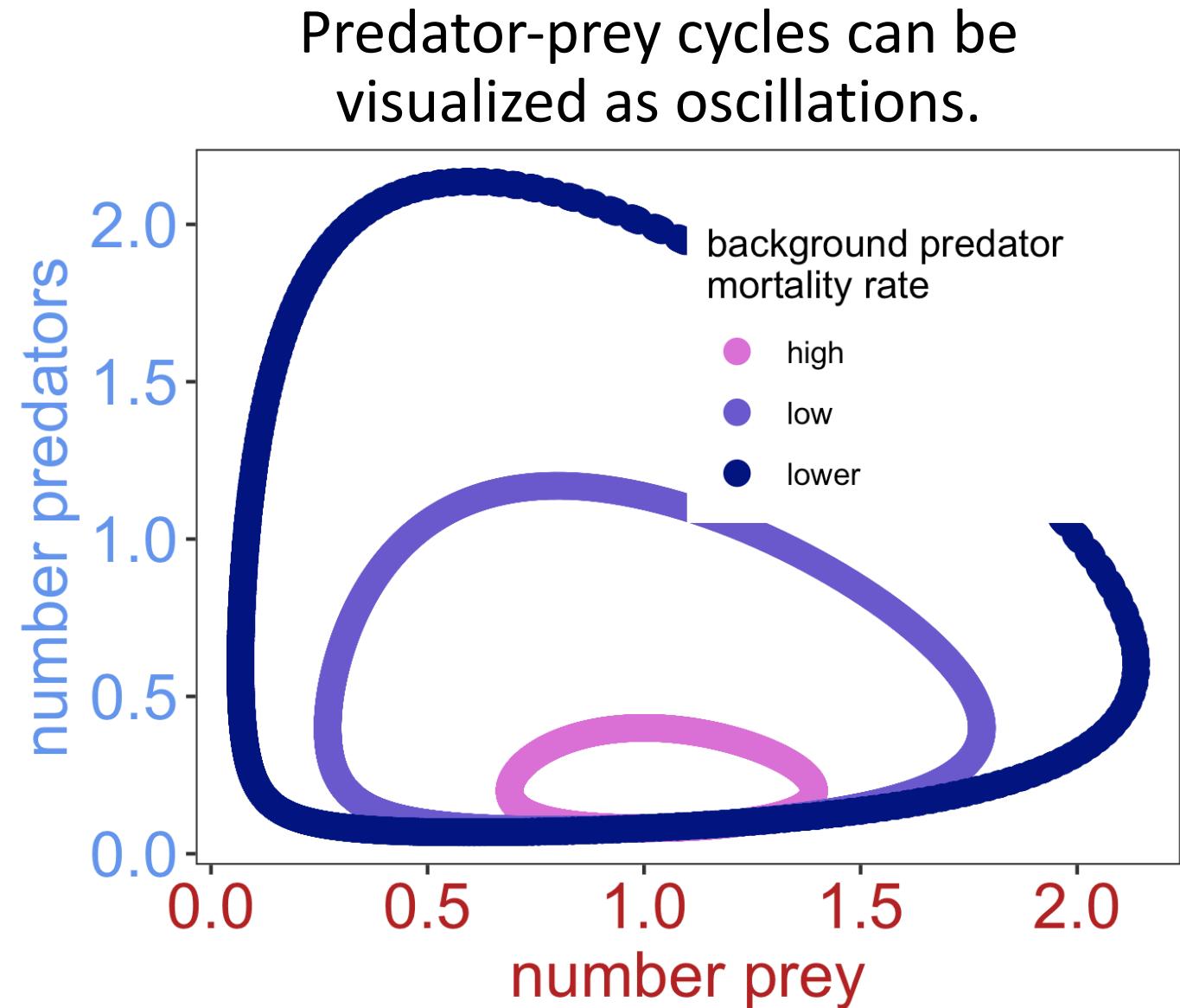


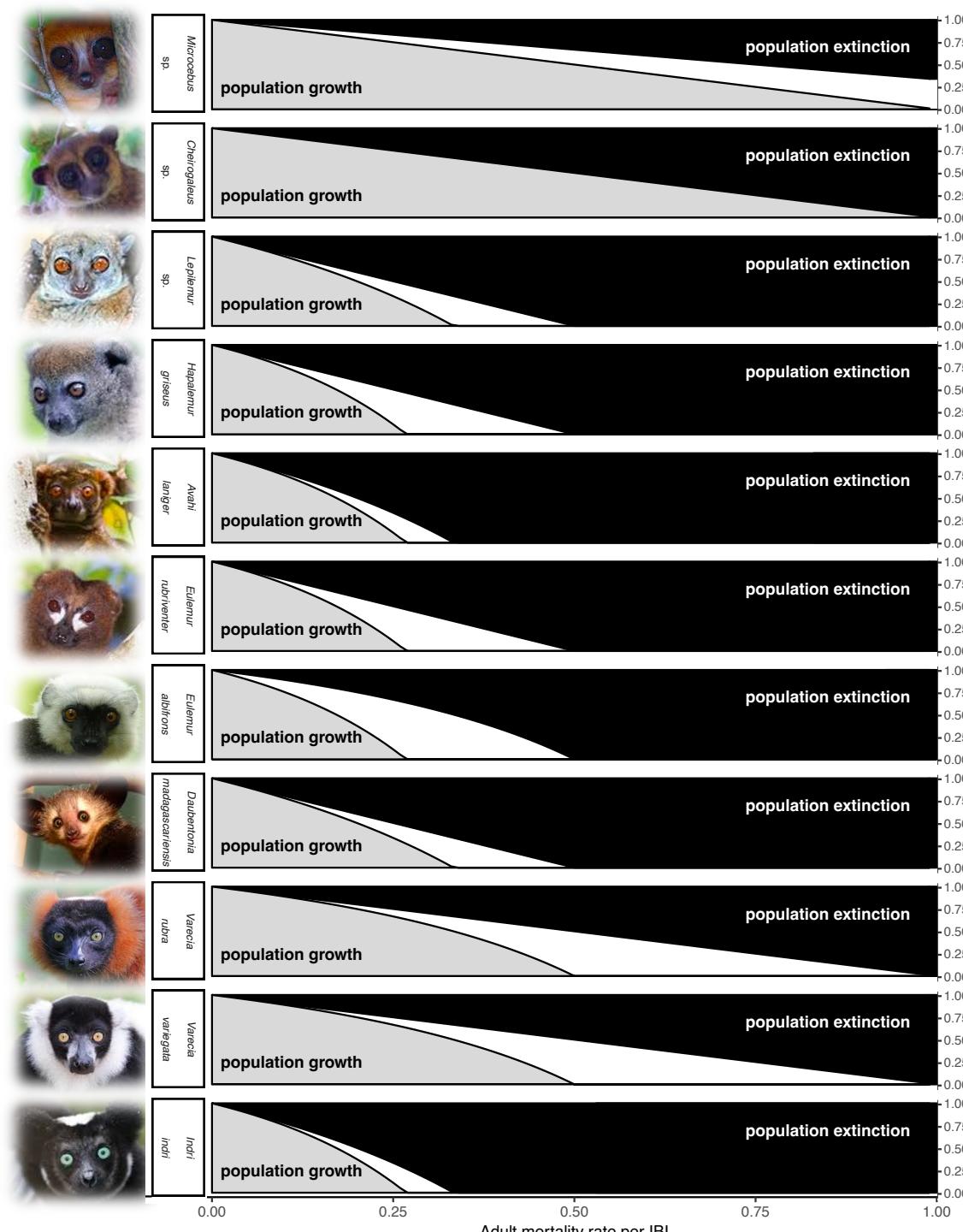
Note the difference with a predator-prey model!



How does **hare** abundance **vary** with changes in **lynx** abundance?

$$\frac{dx}{dt} = \alpha x - \beta xy$$
$$\frac{dy}{dt} = \delta xy - \gamma y$$





We've seen **zero-growth isoclines** before:

$$N_{t+1} = AN_t$$

$$N_{t+1} = \begin{bmatrix} J \\ A \end{bmatrix}_{t+1} = \begin{bmatrix} 0 \\ s_J \end{bmatrix} + \begin{bmatrix} s_A F_A \\ s_A \end{bmatrix} \begin{bmatrix} J \\ A \end{bmatrix}_t$$

We can explore the **zero-growth isocline of $\lambda = 1$** for differing values of s_J , s_A , and F_A .

N = population vector
A = transition matrix

Phase plane analysis: Why do we care?

We can use these tools to make predictions about
the coexistence of species!

Principle of competitive exclusion

*“Two species of approximately the same food habits are not likely to remain long evenly balanced in numbers in the same region. **One will crowd out the other.**”*

- Joseph Grinnell, 1904:



Principle of competitive exclusion

*“Two species of approximately the same food habits are not likely to remain long evenly balanced in numbers in the same region. **One will crowd out the other.**”*

- Joseph Grinnell, 1904:



“Neither can live while the other survives.”

- J.K. Rowling, 2003

Principle of **competitive exclusion**



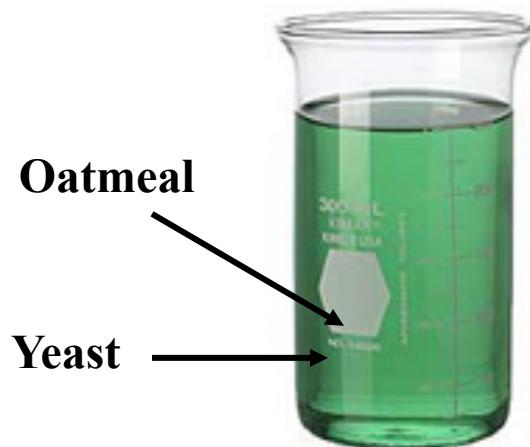
Paramecium aurelia



Paramecium caudatum



Paramecium bursaria



Gause 1934. *J Experimental Biology.*

Gause 1935. *Science.*

Gause first grew each species in isolation



Paramecium aurelia



Paramecium caudatum



Paramecium bursaria



Gause 1934. *J Experimental Biology.*

Gause 1935. *Science.*

In isolation, each species grew logistically.



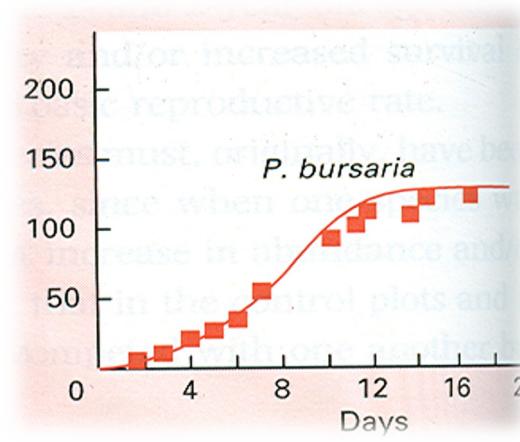
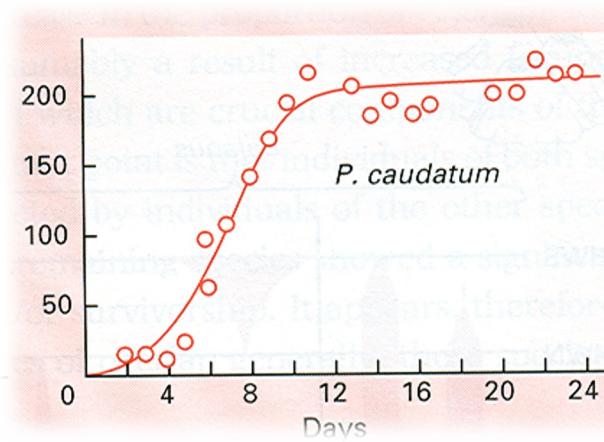
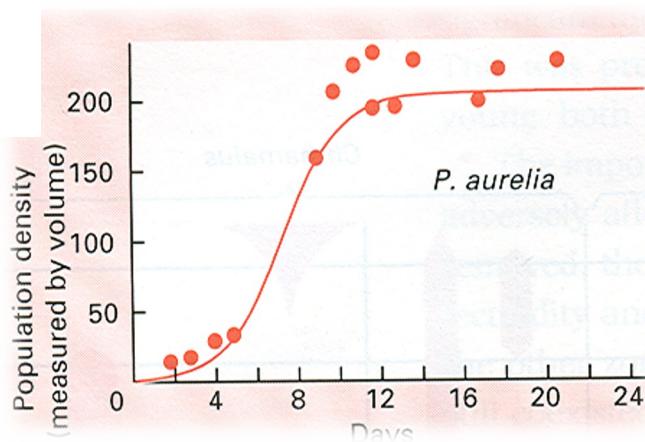
Paramecium aurelia



Paramecium caudatum



Paramecium bursaria



Gause 1934. J Experimental Biology.

Gause 1935. Science.

Then, pairs of species were placed in the same beaker.



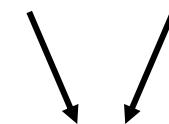
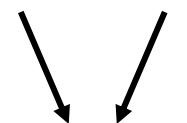
Paramecium aurelia

Paramecium caudatum



Paramecium caudatum

Paramecium bursaria



Gause 1934. *J Experimental Biology.*

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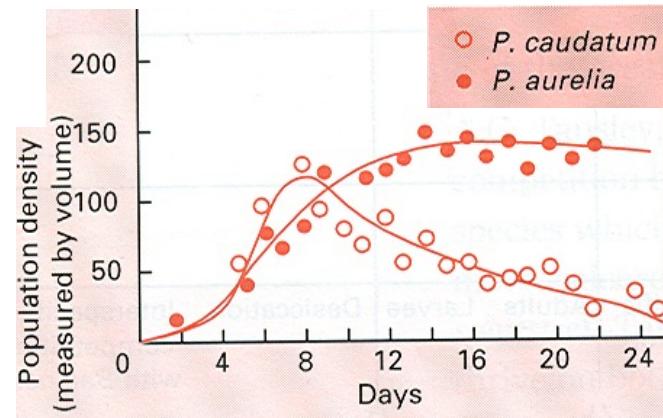
Competitive exclusion
was observed:



Paramecium aurelia



Paramecium caudatum



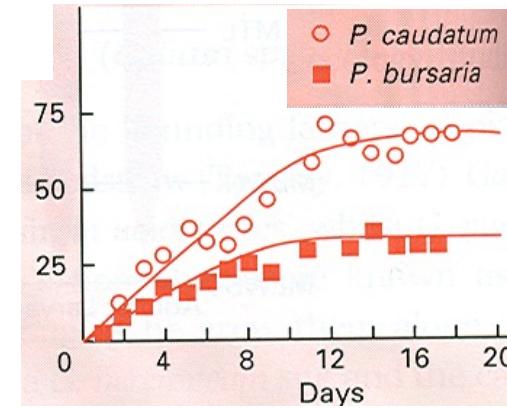
Coexistence was observed:



Paramecium caudatum



Paramecium bursaria



Gause 1934. *J Experimental Biology.*

Gause 1935. *Science.*

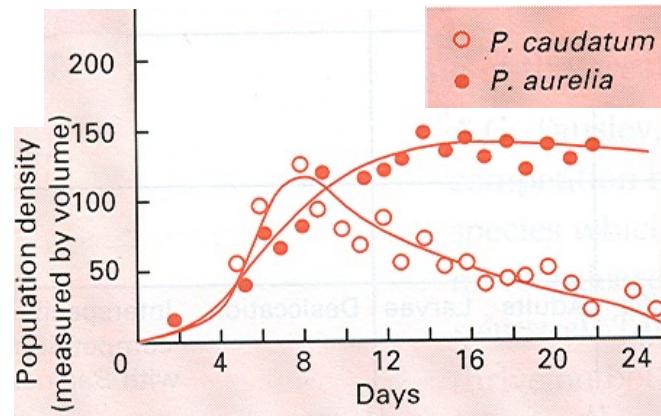
Competitive exclusion
was observed:



Paramecium aurelia



Paramecium caudatum



Species coexisted below
each species' respective
individual carrying capacity.

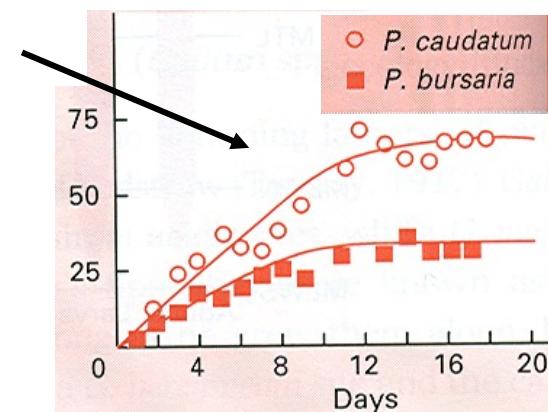
Coexistence was observed:



Paramecium caudatum



Paramecium bursaria



Gause 1934. *J Experimental Biology*.

Gause 1935. *Science*.

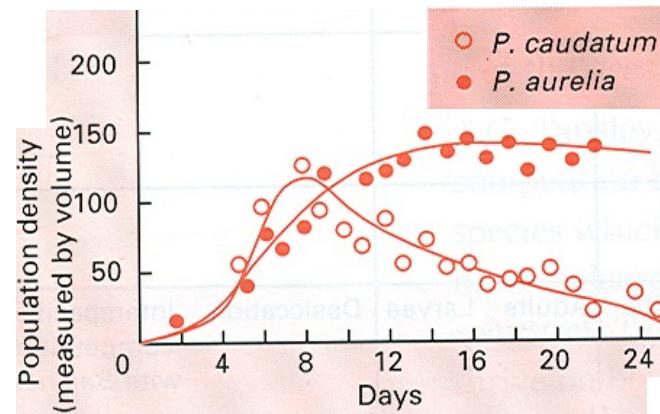
Competitive exclusion
was observed:



Paramecium aurelia



Paramecium caudatum

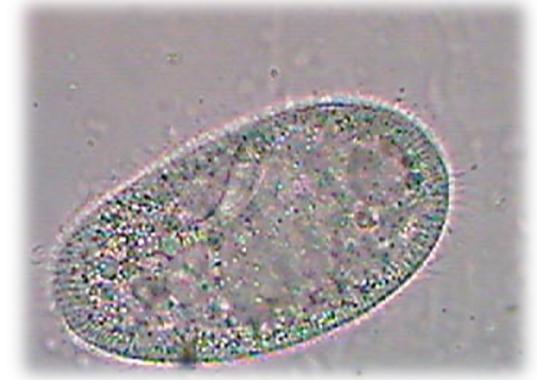


The two coexisting species were largely partitioned in space. *P. bursaria* ate yeast at the bottom and *P. caudatum* consumed bacteria suspended in the medium.

Coexistence was observed:

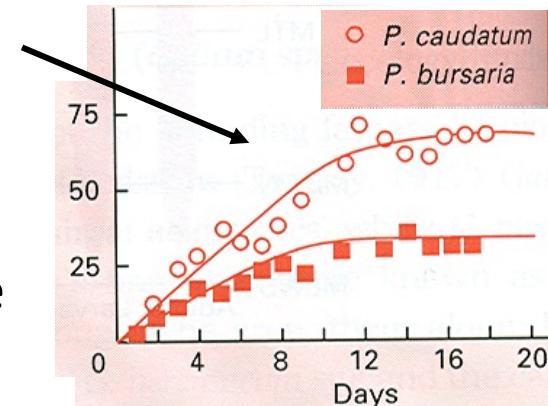


Paramecium caudatum



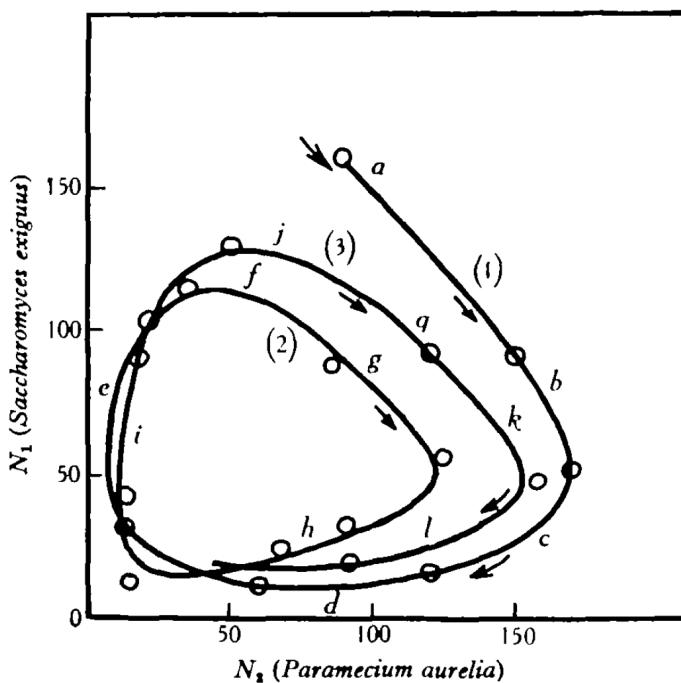
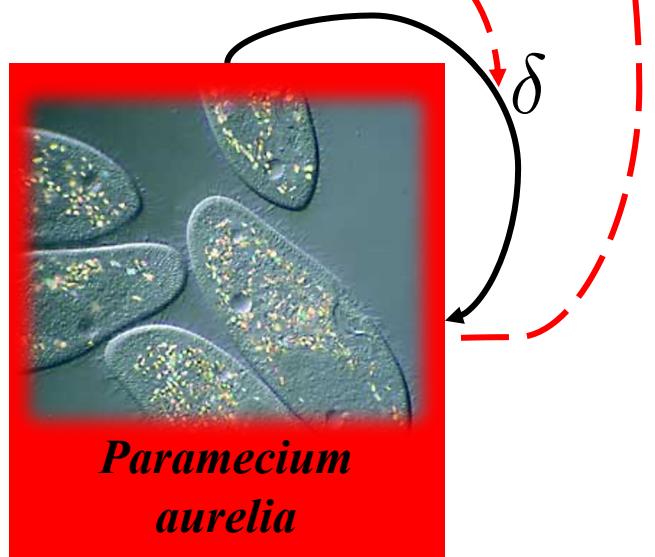
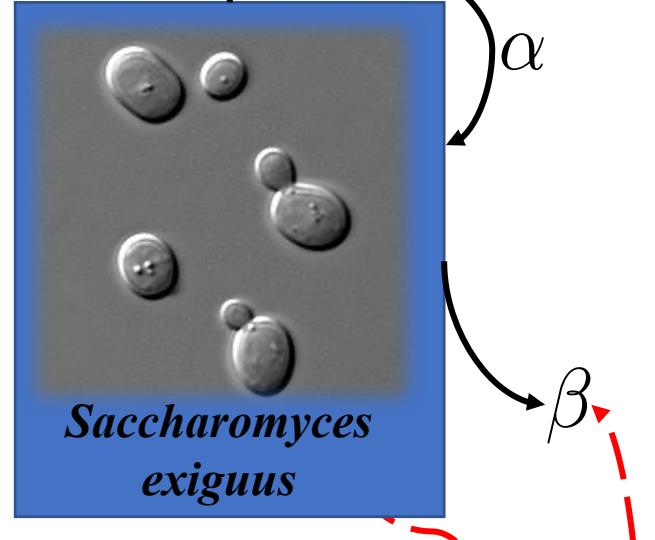
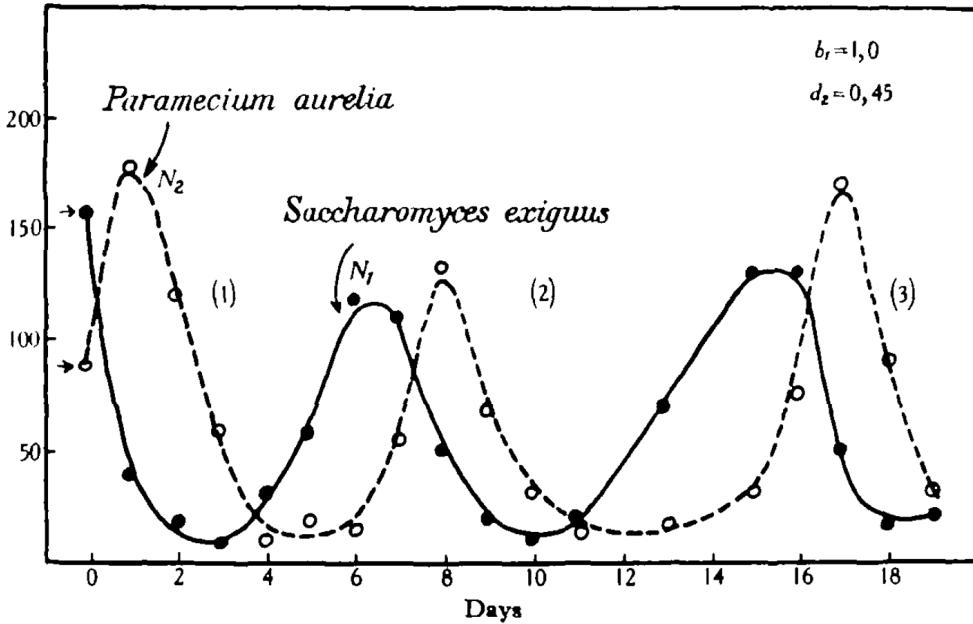
Paramecium bursaria

Species coexisted below each species' respective individual carrying capacity.



Gause 1934. *J Experimental Biology*.
Gause 1935. *Science*.

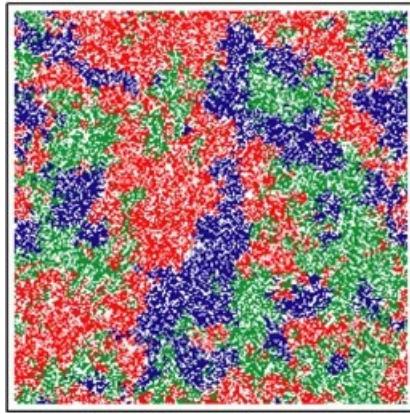
Gause also demonstrated real-life predator-prey cycles with his experiments:



Gause 1935. *Science*.

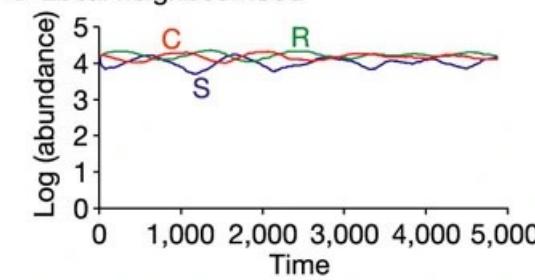
Sometimes **stochasticity** and **space** are all you need to ensure **coexistence** in a competitive environment

a Time step 3,000



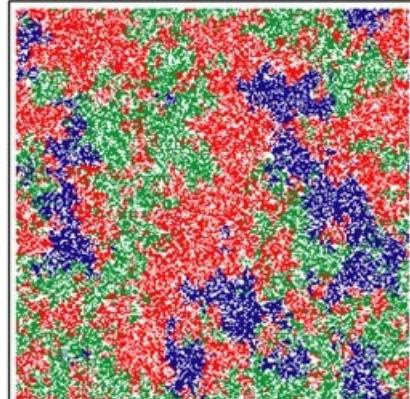
c

Local neighbourhood



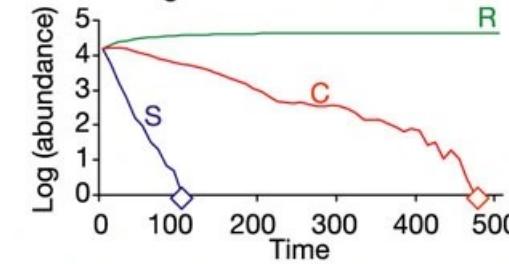
- Kerr et al. modeled a community of 3 strains of *E. coli* with **overlapping resource requirements** (C, R, and S), occupying distinct spatial patches in a metapopulation.

b Time step 3,200

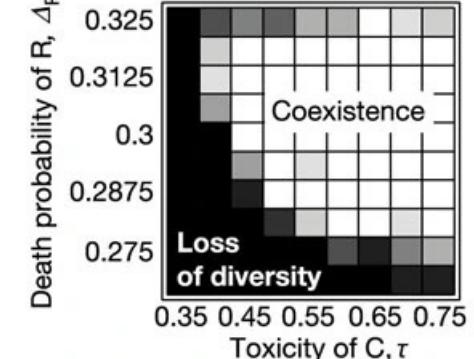


d

Global neighbourhood

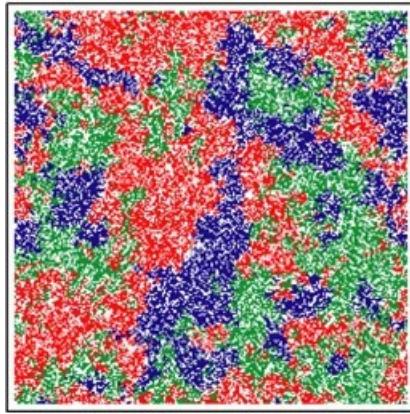


e

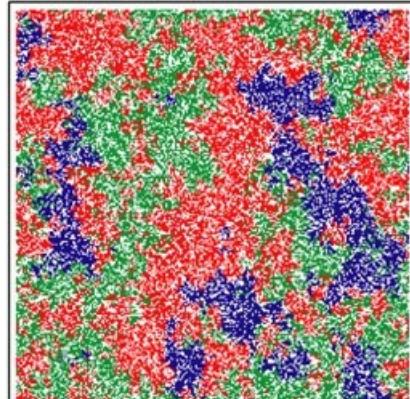


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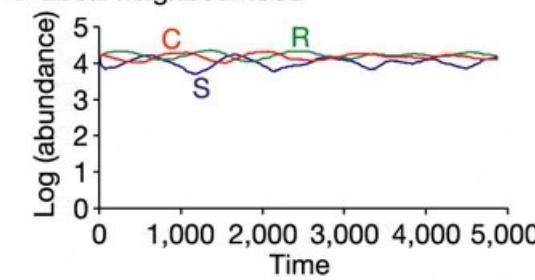
a Time step 3,000



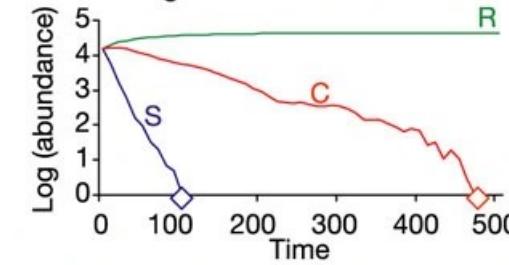
b Time step 3,200



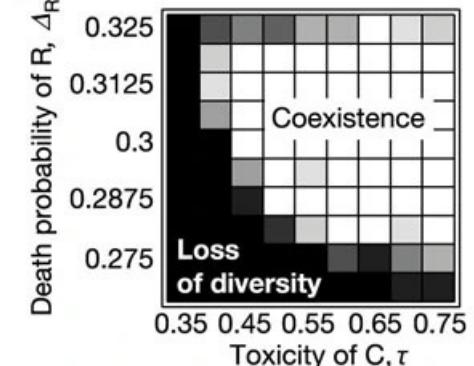
c Local neighbourhood



d Global neighbourhood



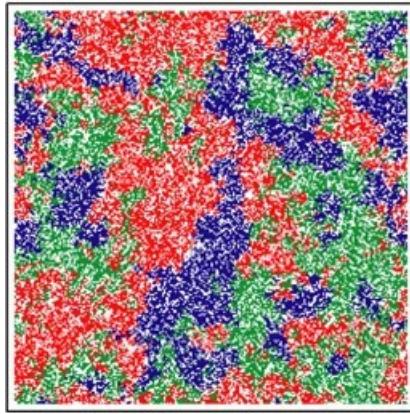
e



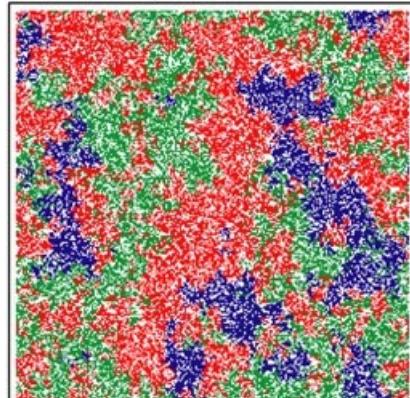
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Sometimes **stochasticity** and **space** are all you need to ensure **coexistence** in a competitive environment

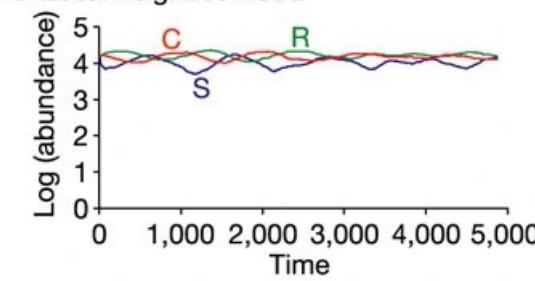
a Time step 3,000



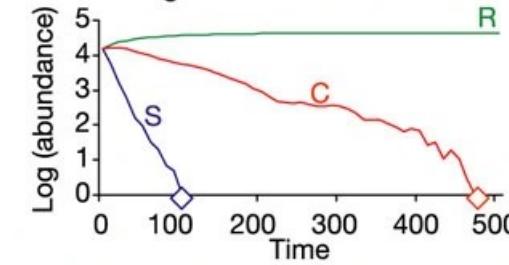
b Time step 3,200



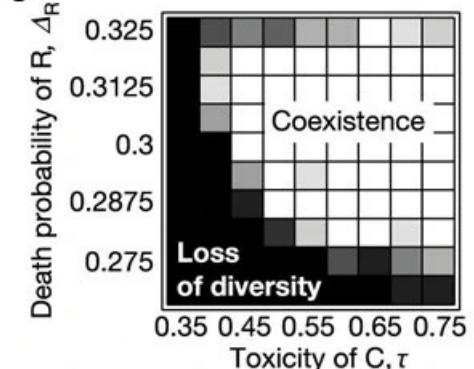
c Local neighbourhood



d Global neighbourhood

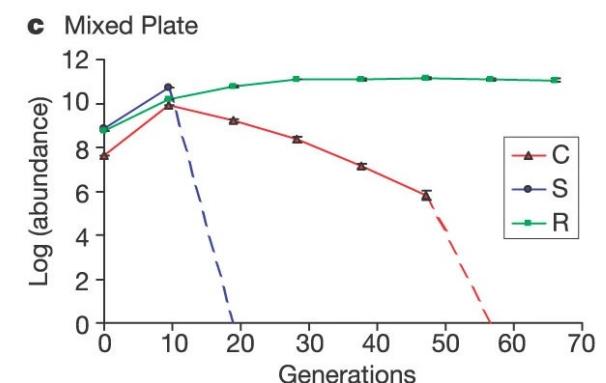
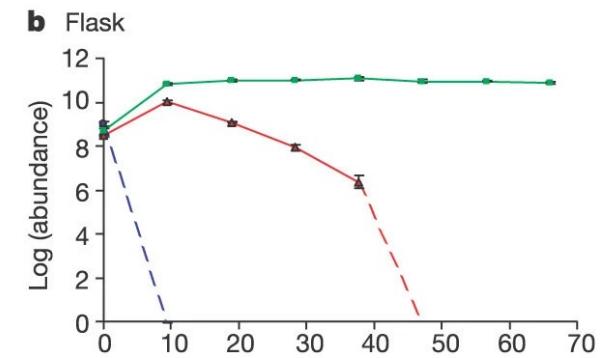
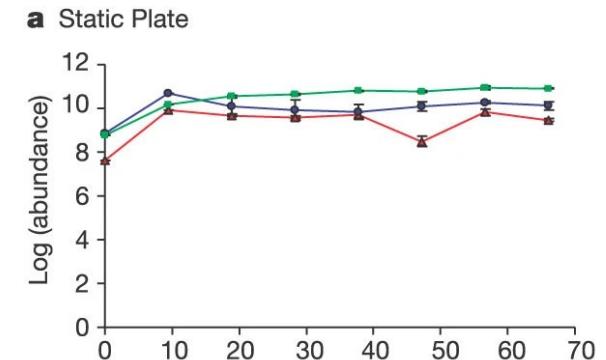
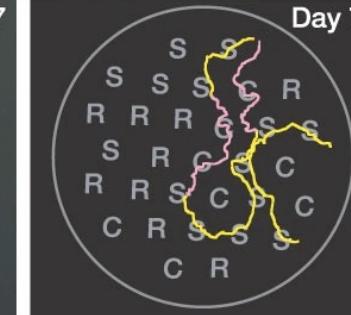
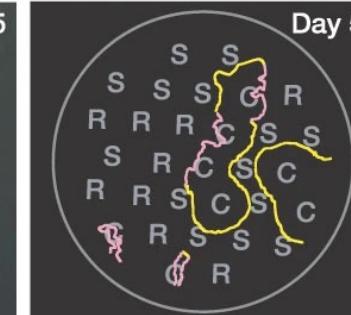
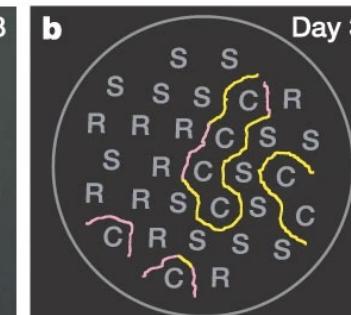
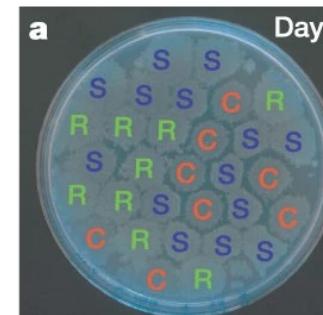
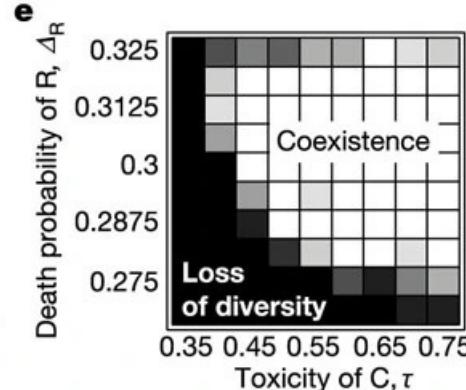
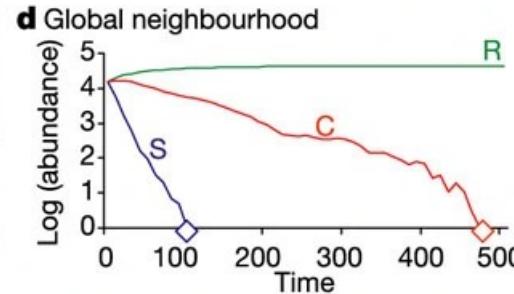
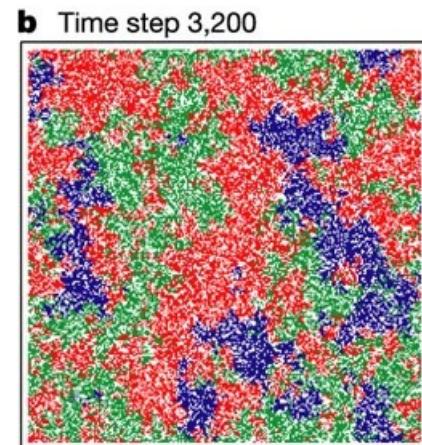
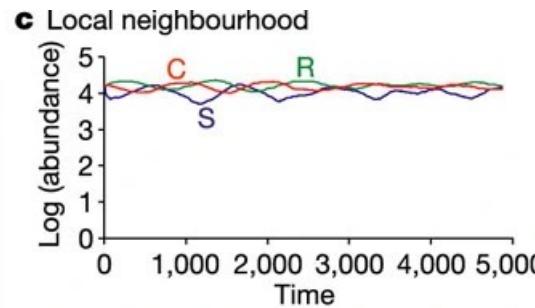
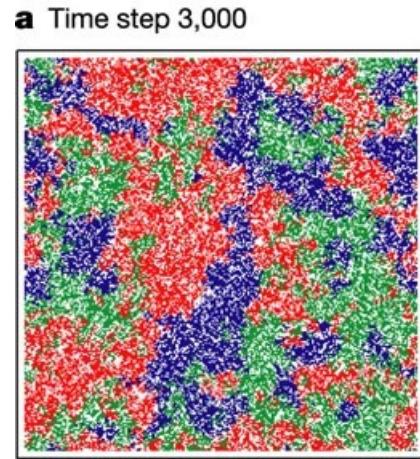


e



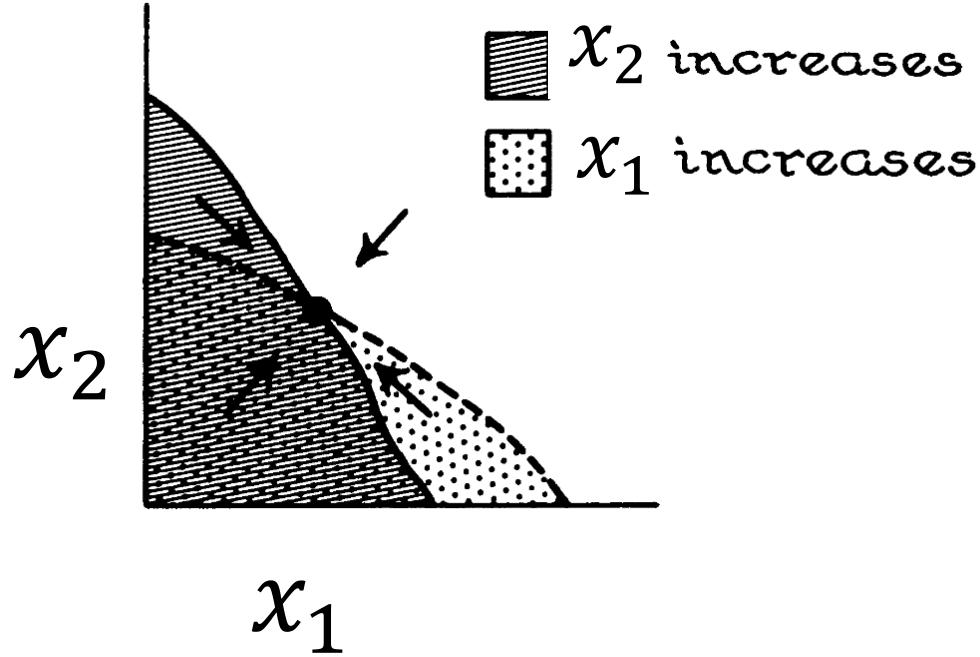
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- They produced simulations allowing for a perfectly mixed population (global neighborhood), or a population in which dispersal (mixing) happened only locally.
- **Local interactions allowed for the coexistence of all three strains** (in theory). What about experimentally?

Sometimes adding **stochasticity** and **space** (remember metapopulations!) is all you need to ensure **coexistence**!

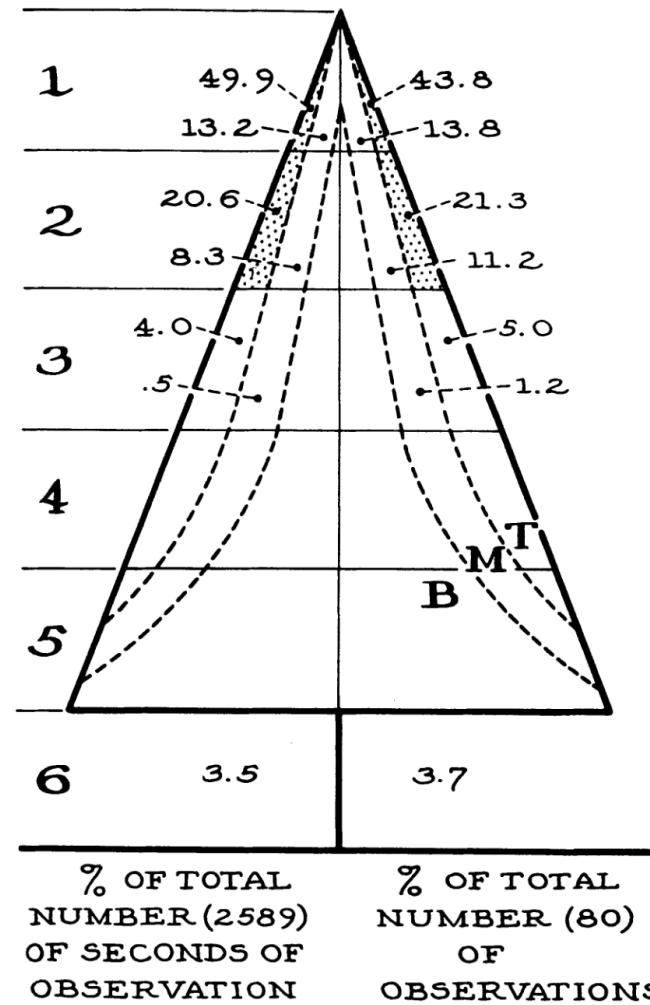


Niche partitioning enables organisms to avoid competitive exclusion

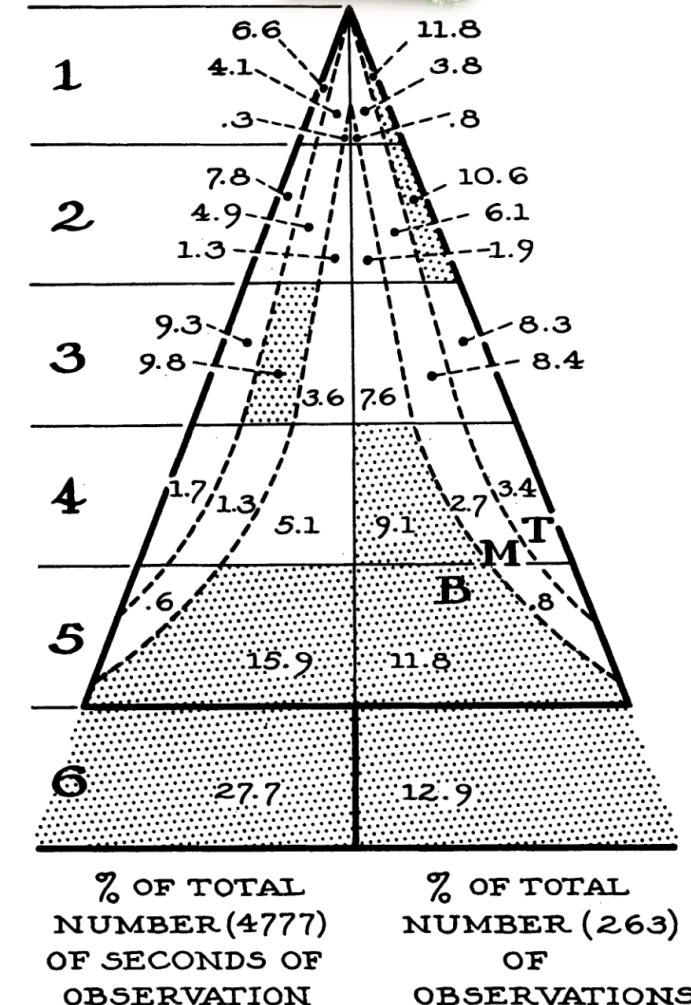
Niche: a match of a species to a specific environmental condition



Cape May
Warbler

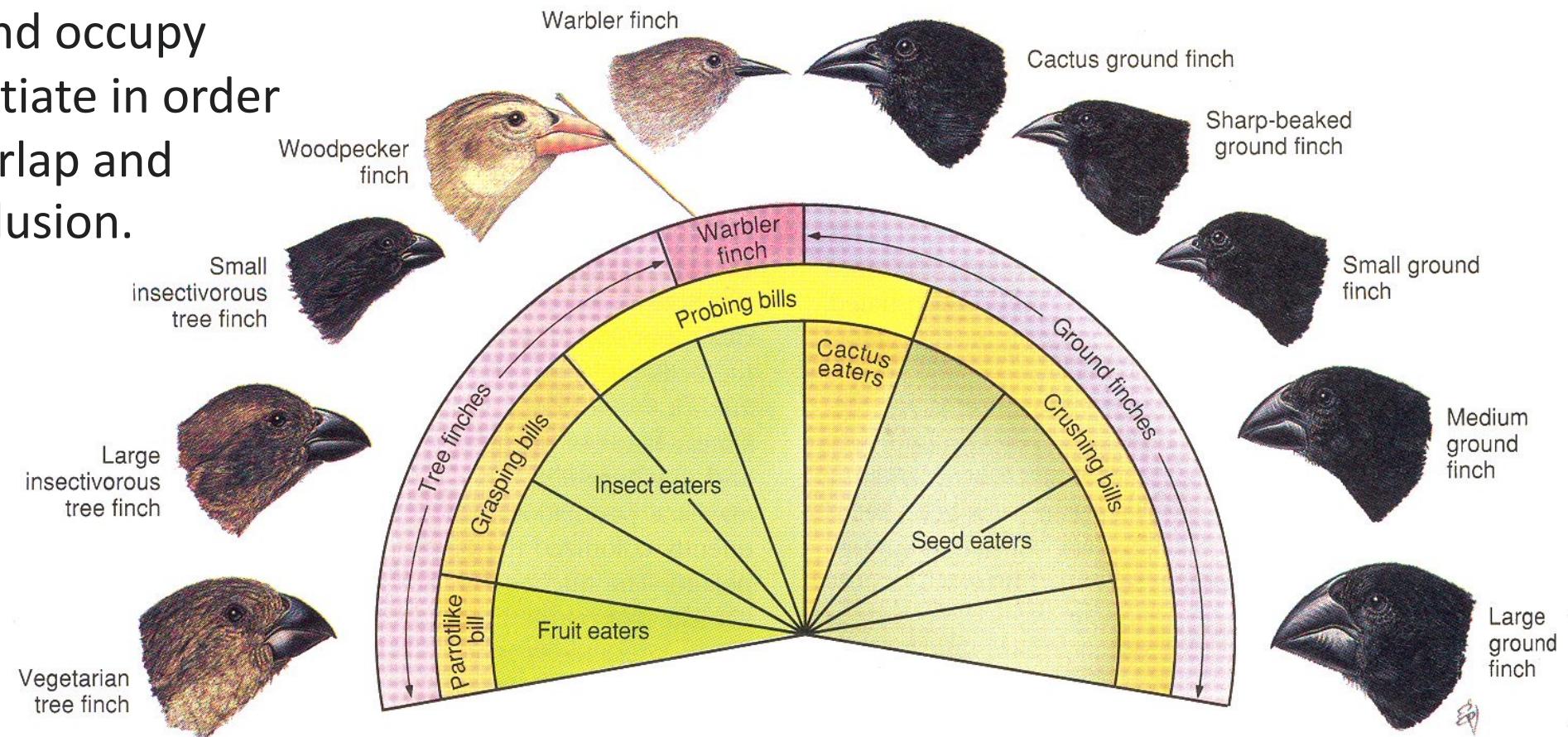


Myrtle
Warbler



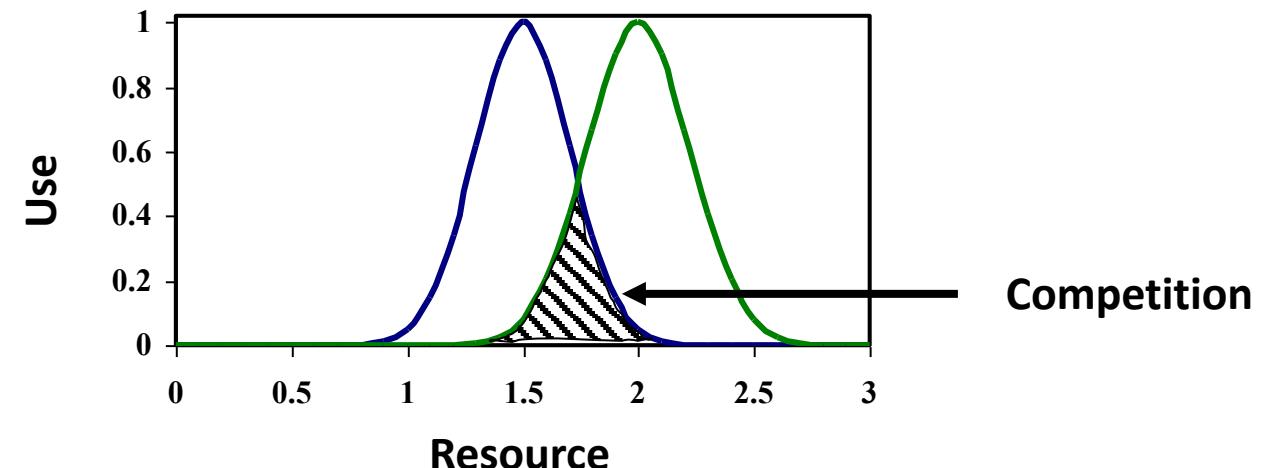
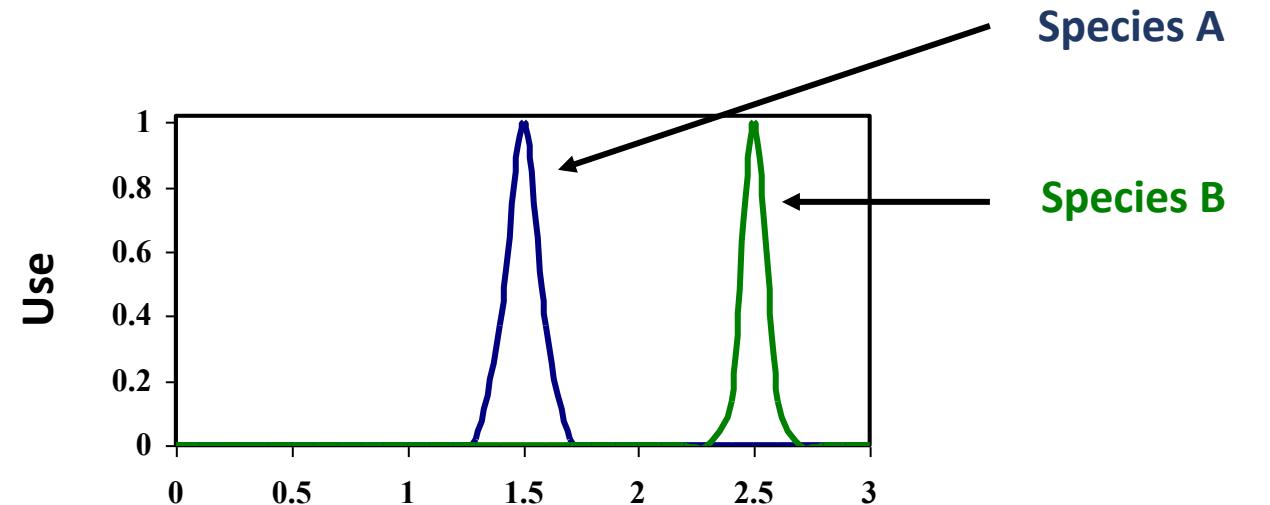
Niche partitioning enables organisms to avoid competitive exclusion

Character displacement: similar species that live in the same geographical region and occupy similar niches differentiate in order to minimize niche overlap and avoid competitive exclusion.



Niche partitioning enables organisms to avoid competitive exclusion

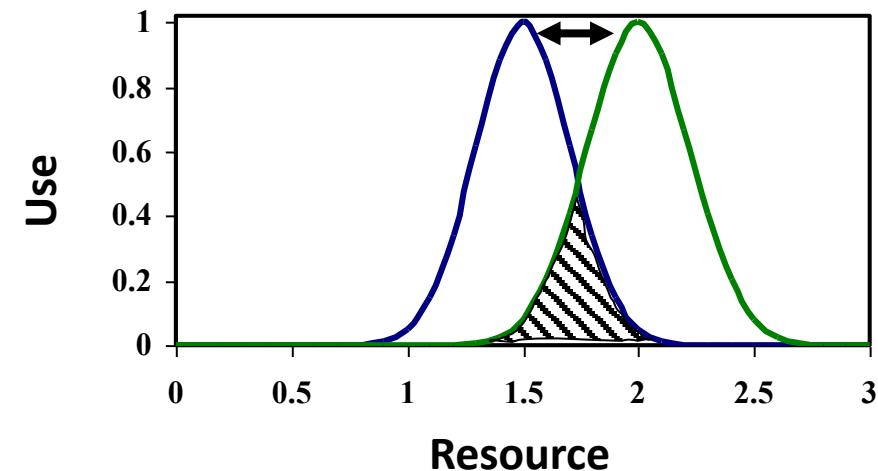
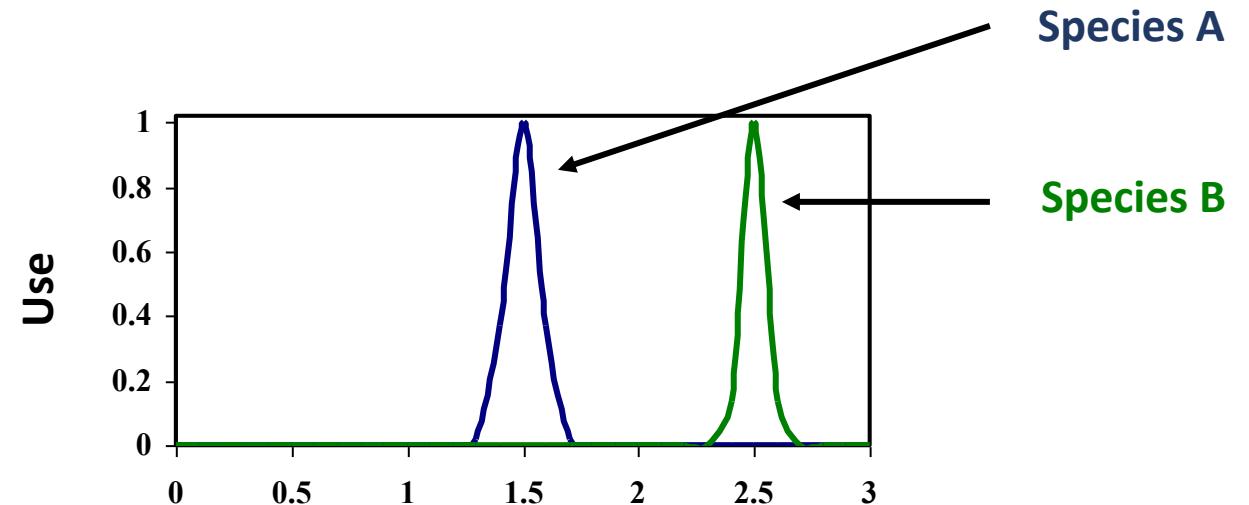
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When niches overlap, competition results

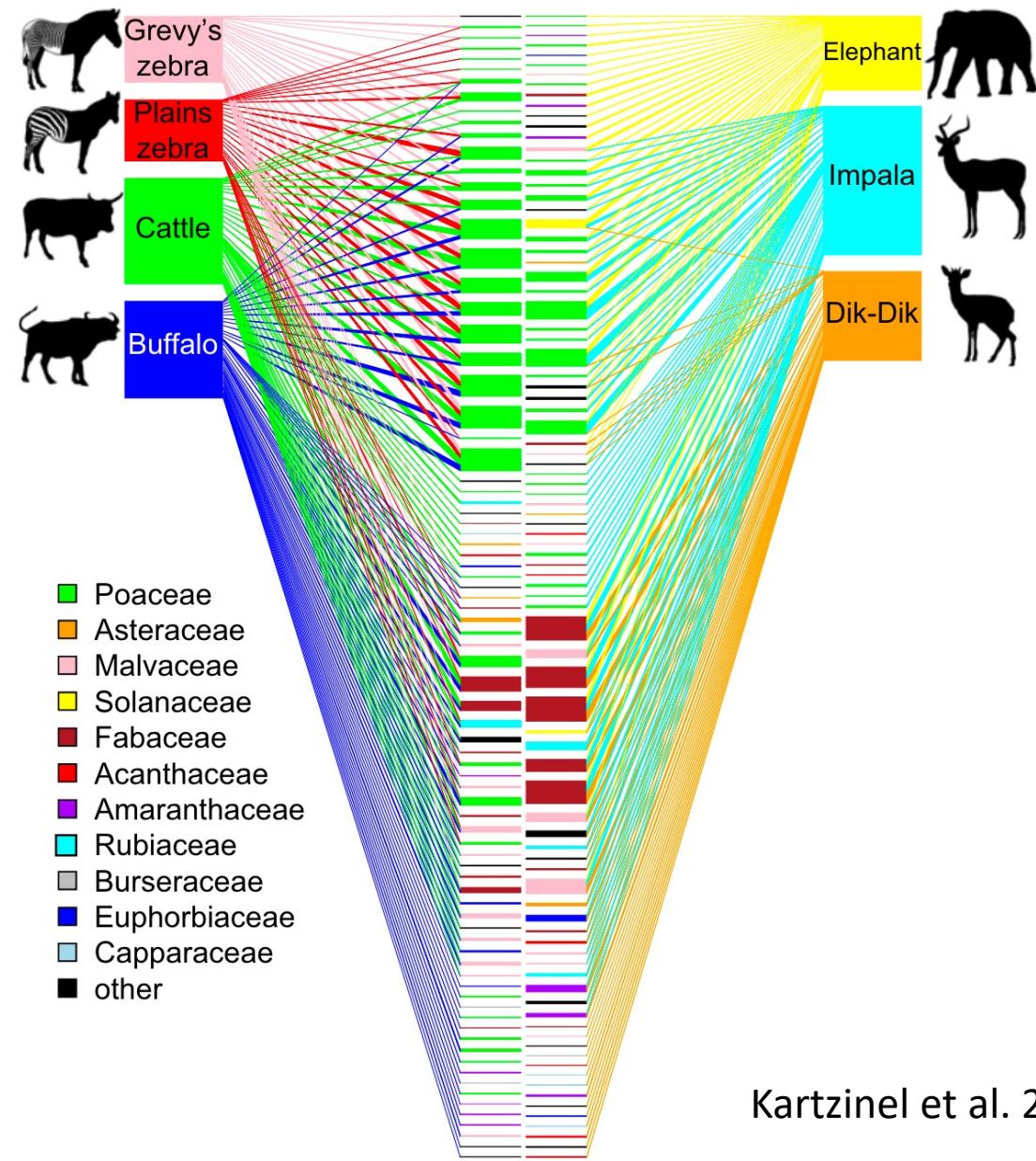
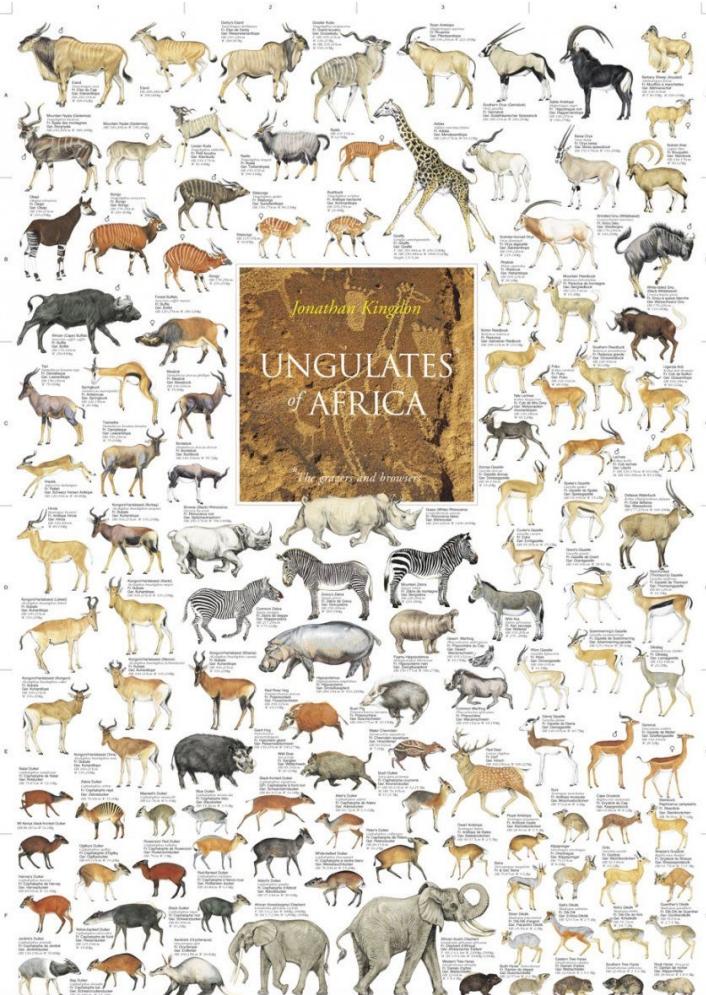
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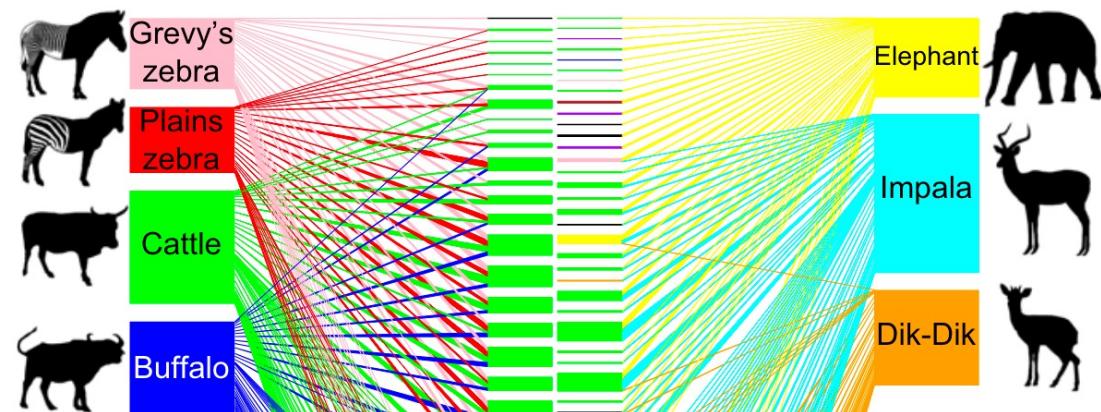
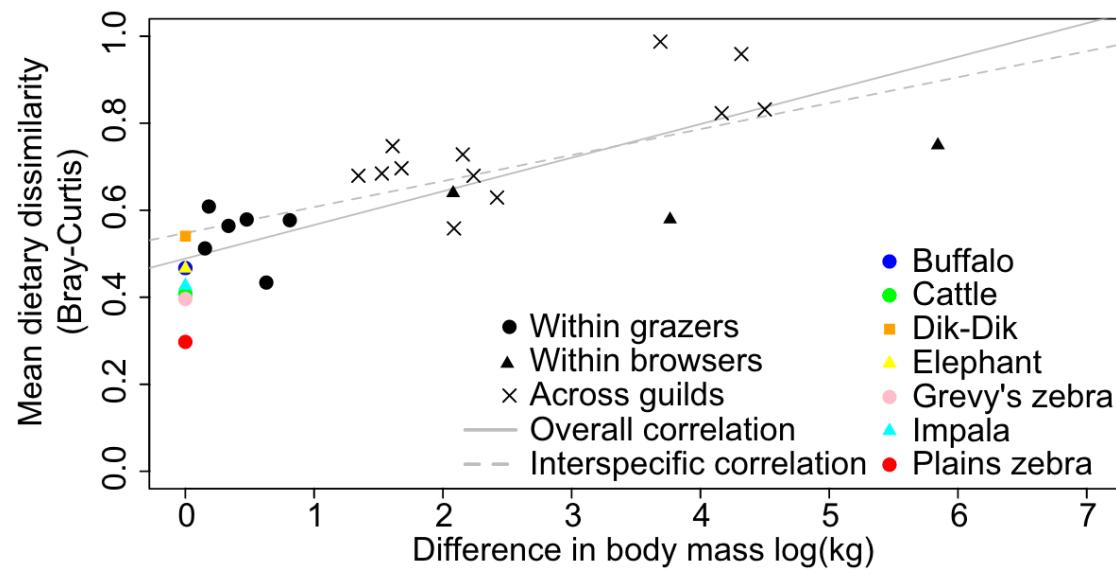
Often 10-25 large mammalian herbivores coexisting in the same African savanna!



Kartzin et al. 2015. PNAS.

Niche partitioning enables organisms to avoid competitive exclusion

Dietary overlap is higher in similar-sized mammals



- Poaceae
- Asteraceae
- Malvaceae
- Solanaceae
- Fabaceae
- Acanthaceae
- Amaranthaceae
- Rubiaceae
- Burseraceae
- Euphorbiaceae
- Capparaceae
- other

Lotka-Volterra equation can be **generalized** to
encompass **many interacting species**

i species

$$\frac{dx_i}{dt} = x_i f_i(x)$$

where $f = r + Ax$

vector of
intrinsic growth
rates for i
species

community
matrix of
interactions
between
species i and j

Lotka-Volterra equation can be **generalized** to encompass **many interacting species**

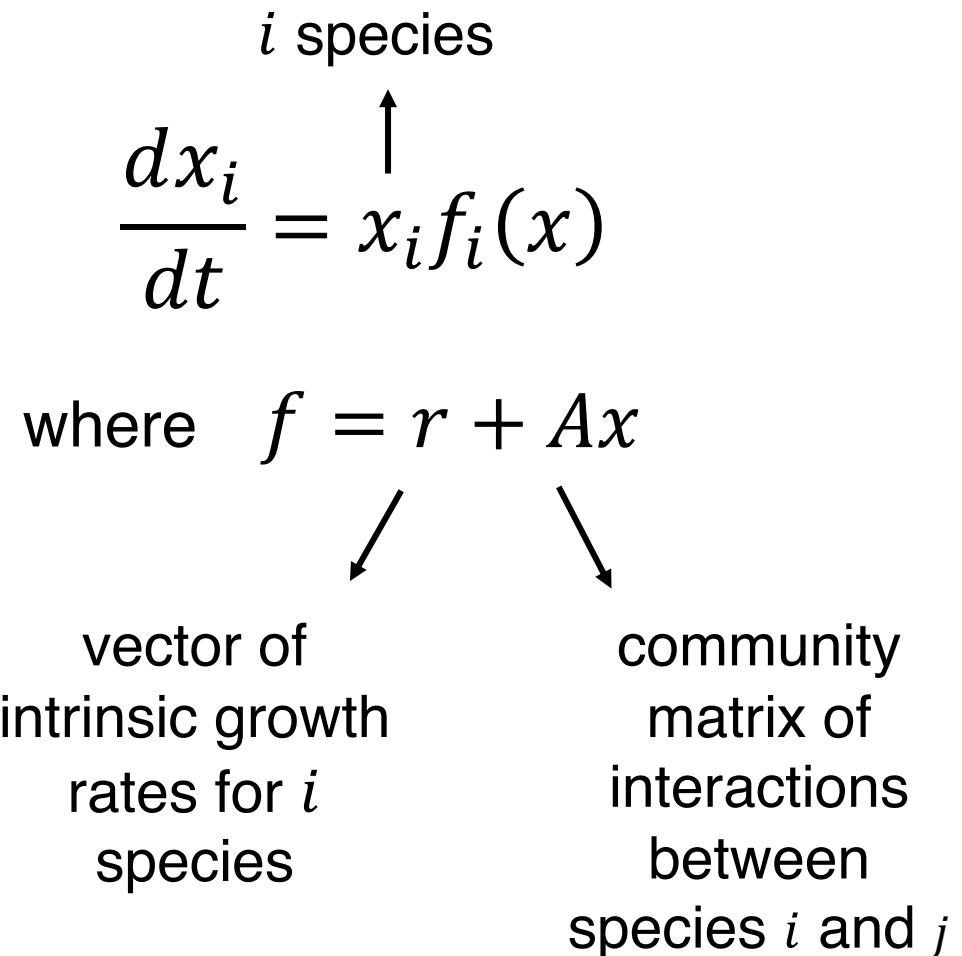
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where $f = r + Ax$

i species

vector of intrinsic growth rates for *i* species

community matrix of interactions between species *i* and *j*

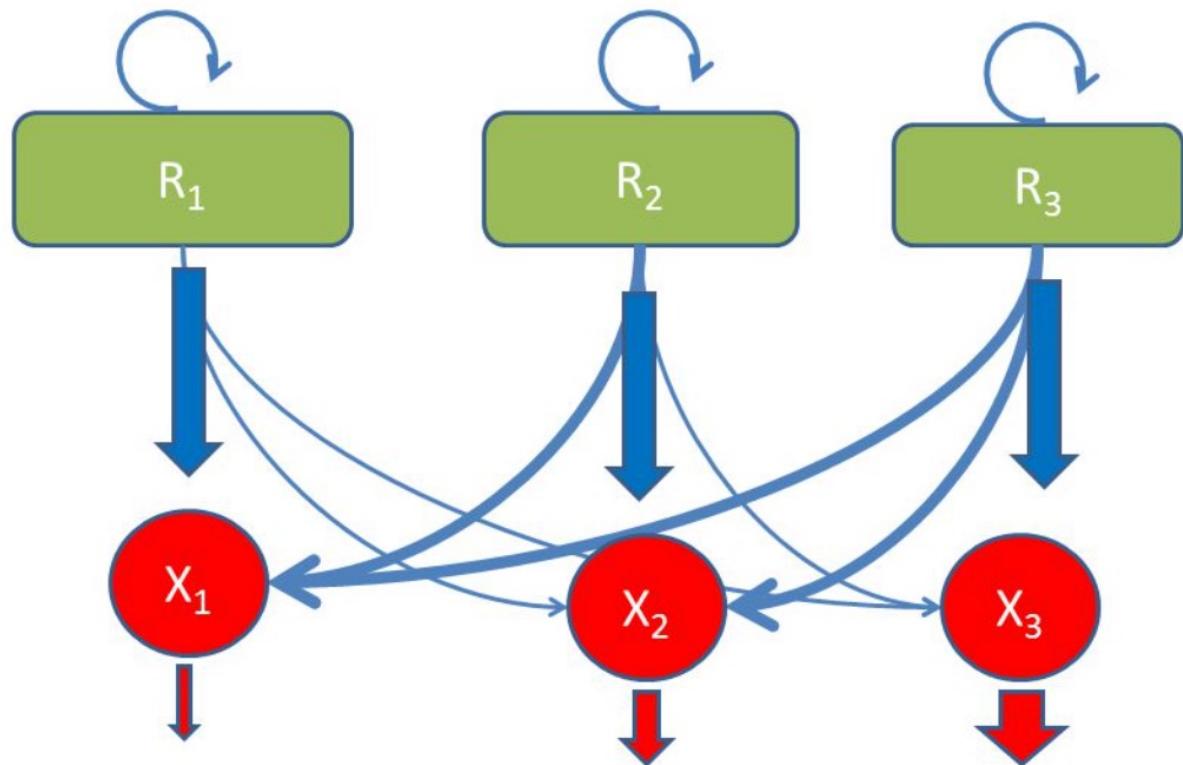


The simple condition that “intra-specific competition must exceed inter-specific competition for coexistence” does not hold for more than two competitors!

Stability assessed from the eigenvalues of the community matrix.

Dynamics get much more complex.

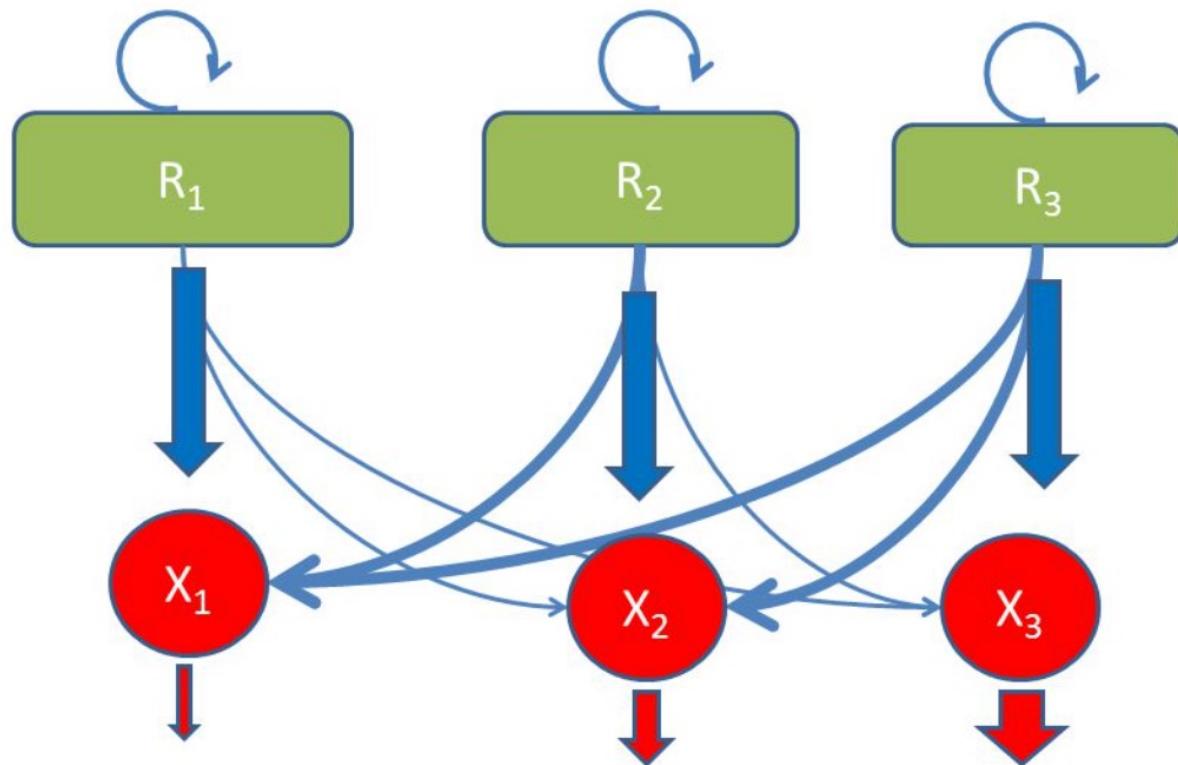
In later work, **consumer-resource models** added definition to competitive interactions



Fitness gradient: $X_1 > X_2 > X_3$

Here, ecologists explicitly model individual resources consumed by competing species, **providing mechanism for the interaction terms (α_{21} & α_{12}) of Lotka-Volterra.**

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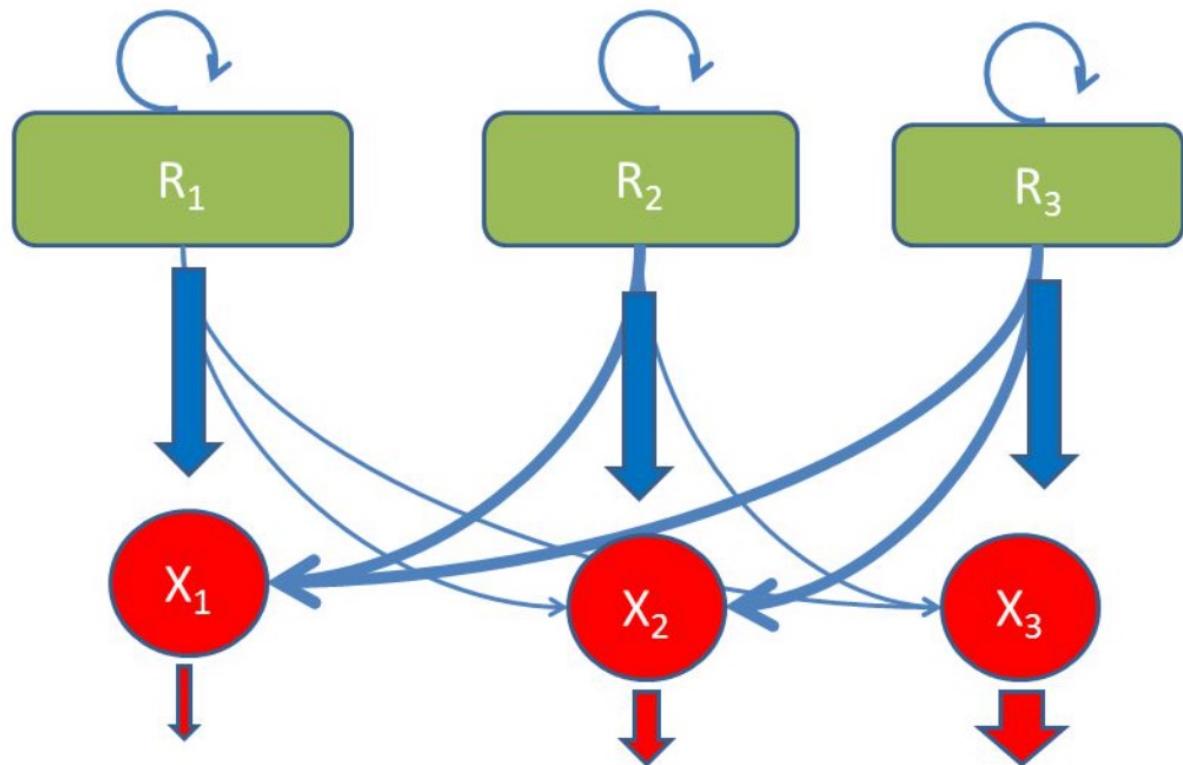


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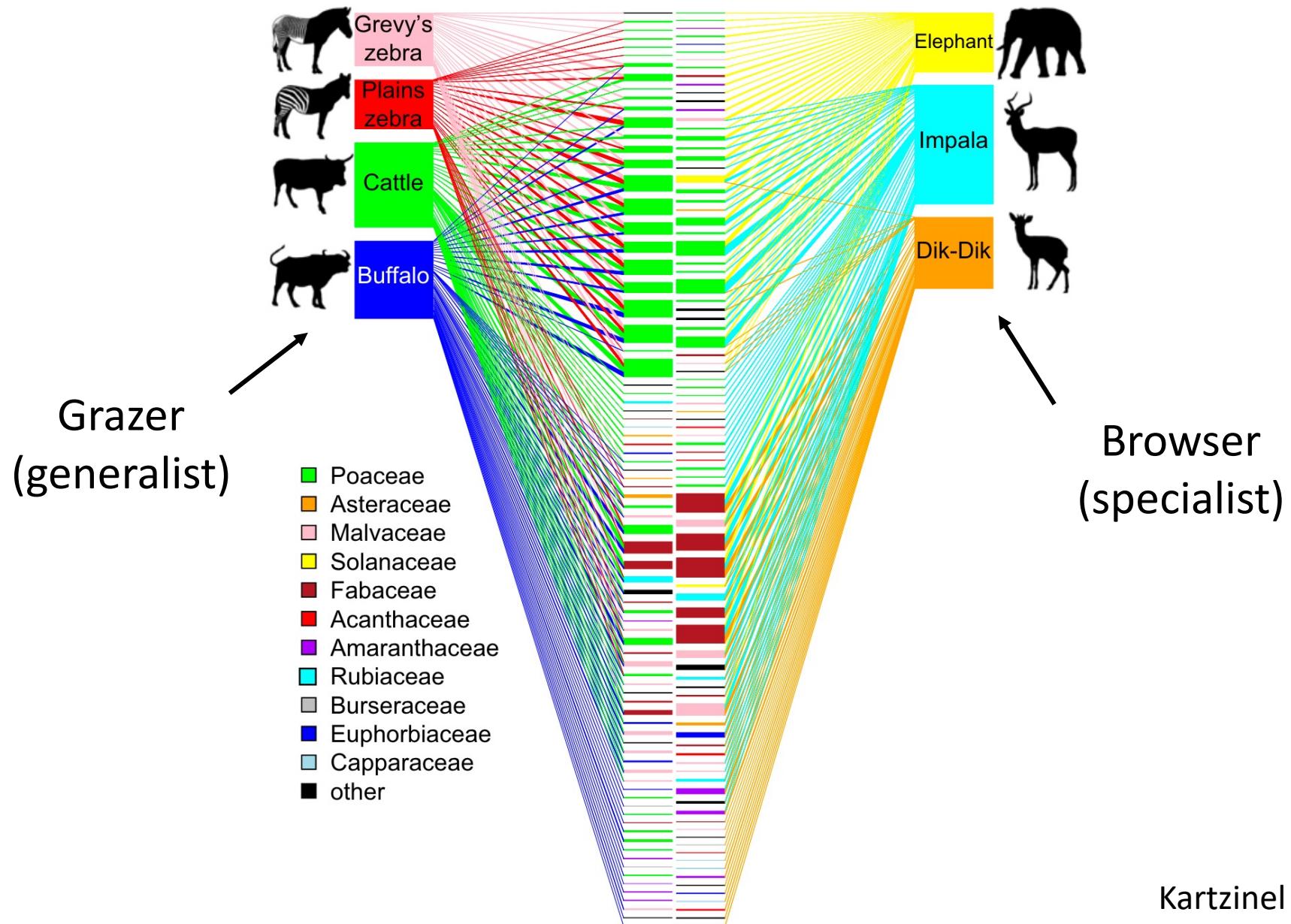
Competitive exclusion still applies, as, theoretically, **complete competitors require unique resources to coexist.**

Generalists are species that exploit a strategy of inefficient consumption of many resources, while **specialists** are species that can outcompete all others on a particular resource.

MacArthur 1969. PNAS.

MacArthur & Levins 1964. PNAS.

Consumer resource partitioning in the African savanna



Tilman modeled competition for limited resources, both theoretically and empirically

$$\frac{dN_j}{dt} = N_j(a_j R - d)$$

j species species resource consumption by species *j* *j* species mortality

$$\frac{dR}{dt} = r - R \sum_j a_j N_j$$



Cedar Creek experiment from the University of Minnesota

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growth of resource in absence of consumption

consumption of resource by all interacting species



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j species
species resource consumption by species j
 d
 N_j
 a_j
 R
 d

\downarrow

\downarrow

j species mortality

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dR/dt
 r
 R
 \sum_j
 a_j
 N_j

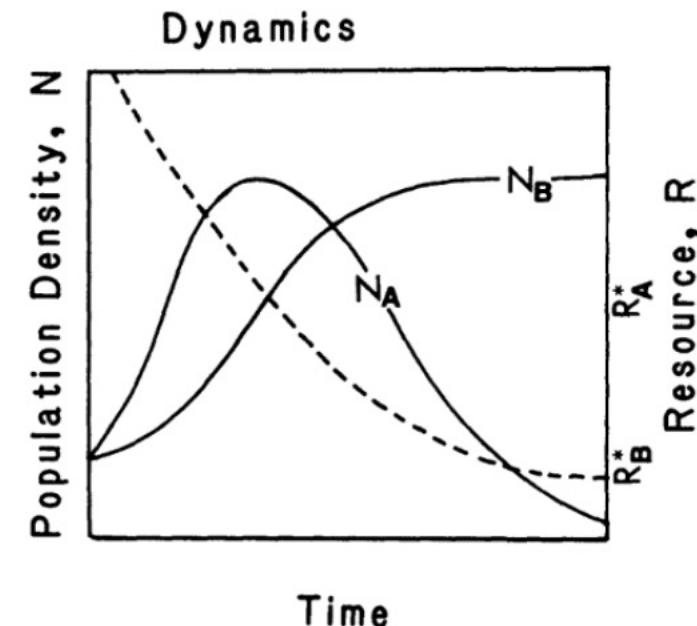
\uparrow

growth of resource in absence of consumption
consumption of resource by all interacting species

$$R_j^* = \frac{d}{a_j}$$

equilibrium resource density

Each consumer has a distinct R^* for each resource



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j species
species resource consumption by species j
 d mortality

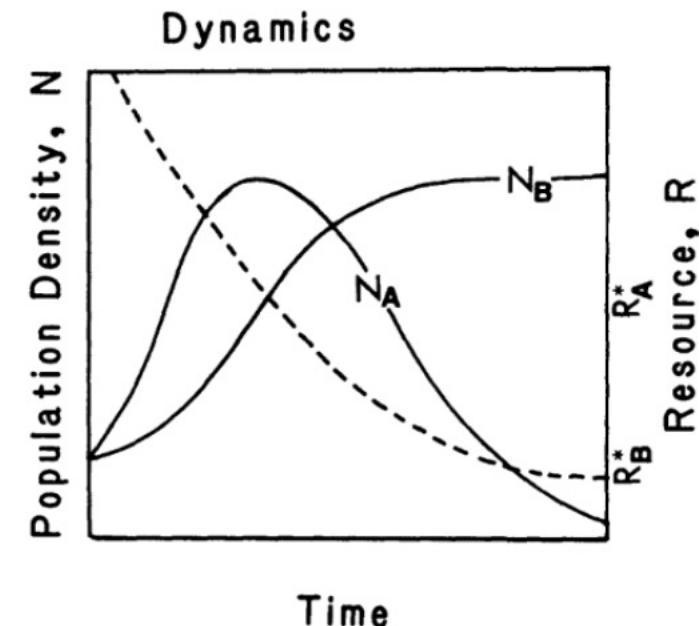
$$\frac{dR}{dt} = r - R \sum_j a_j N_j$$

r growth of resource in absence of consumption
 $\sum_j a_j N_j$ consumption of resource by all interacting species

$$R_j^* = \frac{d}{a_j}$$

equilibrium resource density

If multiple species compete for the same limiting resource, **the species with the lowest equilibrium resource level (R^*) will competitively exclude** the others.



Tilman modeled competition for limited resources, both theoretically and empirically

$$\frac{dN_j}{dt} = N_j(a_j R - d)$$

species resource consumption by species j
 \downarrow
 dN_j
 \downarrow
 j species mortality

$$\frac{dR}{dt} = r - R \sum_j a_j N_j$$

\uparrow
 growth of resource in absence of consumption
 \downarrow
 consumption of resource by all interacting species

$$R_j^* = \frac{d}{a_j}$$

equilibrium resource density

Tilman reproduced these theoretical results empirically at Cedar Creek

growth of resource in absence of consumption

