

Selection

Consider two species x, y with reproductive rates + death rates + growth rates of a, b :

$$\dot{x} = ax \quad \dot{y} = by$$

If a, b constant $x = x_0 e^{at}$ $y = y_0 e^{bt}$

Let $\rho = \frac{x}{y}$ be the ratio:

$$\dot{\rho} = \frac{\dot{x}y}{y^2} - \frac{x\dot{y}}{y^2} = \frac{ax - by}{y} = (a-b)\frac{x}{y} = (a-b)\rho$$

So if $a > b$ $\rho \rightarrow \infty$ if $a < b$ $\rho < 0$
x wins y wins

Let's keep total pop constant: say

$$x + y = 1 \Rightarrow \text{relative abundance}$$

abundance

$$\dot{x} = x(a - \phi) \quad \dot{y} = y(b - \phi)$$

pick ϕ so that $x + y = 1$ for all time

$$x + y = 1 \Rightarrow \dot{x} + \dot{y} = 0$$

$$\Rightarrow xa + yb - (x+y)\phi = 0 \quad \text{but } x+y=1$$

$$\Rightarrow \phi = (xa + yb) \leftarrow \text{mean growth rate}$$

so since $x + y = 1 \Rightarrow y = 1 - x$ so

$$\phi = ax + b(1-x)$$

$$\text{and } \dot{x} = x(a - \phi) = x(a - ax - b(1-x)) \\ = x(1-x)(a-b)$$

so if $a > b$ then $x \rightarrow 1$ if $a < b$ $x \rightarrow 0$

More generally $f_i = \text{"fitness"}$

$$\dot{x}_i = x_i f_i$$

$$\phi = \sum_{i=1}^n x_i f_i \quad \leftarrow \begin{array}{l} \text{suppose } \sum_{i=1}^n x_i = 1 \\ \text{mean} \\ \text{fitness} \end{array}$$

$$\text{Then } \dot{x}_i = x_i (f_i - \phi)$$

Recall that if $x_i = \text{prob of } i$ Then

$$\sum x_i f_i = \text{mean } f_i \quad (\text{weighted sum})$$

If your fitness $<$ mean die
 $>$ mean grow!

$$\text{Verify } \sum_{i=1}^n \dot{x}_i = \sum_{i=1}^n x_i f_i - \phi \sum_{i=1}^n x_i = \phi - \phi \cdot 1 = 0$$

$$\text{Suppose } \dot{x} = ax^c - \phi x \quad \phi = ax^c + by^c \\ y = by^c - \phi y \quad \text{to keep } x+y=1$$

$$\dot{x} = x(1-x) [ax^{c-1} - b(1-x)^{c-1}]$$

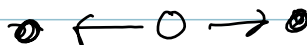
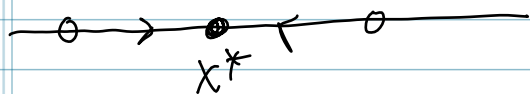
If $c < 1$ slower than exponential
 $c > 1$ greater " " " "

Verify \exists fixed points $x=0, x=1$
and $ax^{c-1} = b(1-x)^{c-1}$

$$\Rightarrow \left(\frac{a}{b}\right)^{\frac{1}{c-1}} x = (1-x) \rightarrow x^* = \frac{1}{1 + \left(\frac{a}{b}\right)^{\frac{1}{c-1}}}$$

$c < 1$ Neither win

$c > 1$ one or other wins



$c > 1$ favors whoever was biggest to start
 $c < 1$ " survival of all

Now let's look at evolutionary games

Game Theory invented by John von Neumann
& Oskar Morgenstern

John Nash - "Nash equilibrium"

1 page paper in PNAS 1950

Nobel PRIZE Economics 1994

By then he was ~~mentally ill~~ mentally ill

Evolutionary game theory does not rely on rationality, rather

individuals employ strategies that are fixed, interact & the payoffs are added up. (payoff \times times)

Example two phenotypes A, B

A can move, B cannot

A pays a cost to move eg using energy, but gains so suppose fitness of A is 1.1

& B 1 /

Then A wins & eventually takes over (cf. earlier)

Suppose fitness is density dependent.

Like if there are lots of A or B around moving doesn't do much good, so then fitness

B & fitness A.

$x_A =$ ~~fitness~~^{freq} of A $x_B =$ ~~fitness~~ freq of B

$$\vec{x} = (x_A, x_B)$$

$$\dot{x}_A = x_A (f_A(\vec{x}) - \phi) \quad \phi = x_A f_A(\vec{x}) + x_B f_B(\vec{x})$$

$$\dot{x}_B = x_B (f_B(\vec{x}) - \phi)$$

Let $x = x_A$ $1-x = x_B$ Then: $f_A(x) = f_A(x)$
 $f_B(x) = f_B(x)$

$$\dot{x} = x(1-x) [f_A(x) - f_B(x)]$$

Equilibria $x=0, x=1, x^*$ $f_A(x^*) = f_B(x^*)$

Stability: of \bar{x}

$$\dot{y} = \left[(1-\bar{x}) [f_A(\bar{x}) - f_B(\bar{x})] - x [f_A(\bar{x}) - f_B(\bar{x})] + \bar{x}(1-\bar{x}) [f_A'(\bar{x}) - f_B'(\bar{x})] \right] y$$

$\bar{x} = 0$

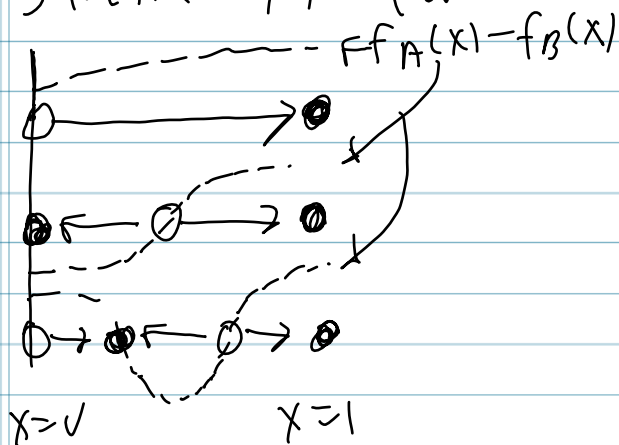
$$\dot{y} = [f_A(0) - f_B(0)] y \quad \text{if } f_A(0) < f_B(0) \text{ stable}$$

$$\bar{x} = 1 \quad \dot{y} = [f_B(1) - f_A(1)] y \quad \text{stable if } f_A(1) > f_B(1)$$

$x = x^*$

$$\dot{y} = x^*(1-x^*) [f_A'(x^*) - f_B'(x^*)] y$$

stable if $f_A'(x^*) < f_B'(x^*)$



Two player game.

Strategies are A + B

When A plays A ^{A, B, M} get payoff a

When A plays B A gets b, B gets c

When B plays B ^{A, B, M} get d

$$\begin{matrix} & \begin{matrix} A & B \end{matrix} \\ \begin{matrix} A \\ B \end{matrix} & \begin{pmatrix} a & b \\ c & d \end{pmatrix} \end{matrix}$$

Let $X_A = \text{freq playing A}$

$X_B = \text{freq playing B}$

If play A expected payoff U

$$f_A = aX_A + bX_B$$

$$f_B = cX_A + dX_B$$

$$f_A(x) = ax + b(1-x)$$

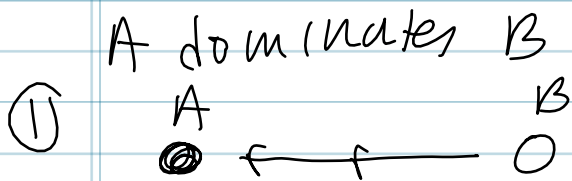
$$f_B(x) = cx + d(1-x)$$

$$f_A(x) - f_B(x) = (a - b - c + d)x + b - d$$

$$x = x(1-x) [(a - b - c + d)x + b - d]$$

There are five possibilities for the two strategies

$a > c$ $b > d$ (strategy A pays better no matter what)



$a > c$ $d > b$ ③



B dominates A

$a < c$ $b > d$

② $c > a$, $d > b$



④
coexist



⑤ $a = c$ $b = d$

⑤
neutral



① No matter what, it is best to play A
payoff for playing A is always better

② payoff for B always better

③ Always best to play same strategy as other player
("Nash equilibrium" more later)

Note $x^* = \frac{d-b}{a-c+d-b} \in (0,1)$

④ $x^* = \frac{b-d}{b-d+c-a} \in (0,1)$

Homework due Friday Nov 5

① - #31 page 265

② - Find equilibria and stability for
Consider epidemic model with vital dynamics:

$$\dot{S} = \delta(N-S) - \beta IS + \gamma R$$

$$\dot{I} = -\delta I + \beta IS - \gamma I$$

$$\dot{R} = \gamma I - \gamma R - \delta R$$

δ = death rate.

(a) Show $\frac{d}{dt}(S+I+R) = \delta(N - (S+I+R))$

and conclude that $S+I+R \rightarrow N$ as $t \rightarrow \infty$

(b) Since $S+I+R \rightarrow N$ set $R = N - (S+I)$
use this to reduce the model to
2 variables S, I

(c) Find equilibria & stability
What is the reproductive rate σ ?

③ - $\dot{x} = (ax^{r-1})x$ Here ϕ Fitness is ax^{r-1} , by^{r-1}
 $\dot{y} = (by^{r-1})y$ Let $\phi = ax^{r-1} + by^{r-1}$

consider $\dot{x} = x[ax^{r-1} - \phi]$, $\dot{y} = y[by^{r-1} - \phi]$
Study equilibria & stability for $0 \leq r < \infty$

HAWK/DOVE

Dove is bad name since two doves will fight to the death!

But in many scenarios, animals are more likely to display & threaten than to actually fight

In H/D Hawks fight while doves posture & one will retreat

The gain is G & the cost of battle is C
 If it meets hawk If it meets dove

a hawk receives	$\frac{G-C}{2}$ "a"	G "b"
a dove receives	0 "c"	$\frac{G}{2}$ "d"

Let's look - if $C > G$ then it hurts a lot when hawk meets hawk, but still could be good in low densities of hawks since gain is quite high when meeting dove

if $C < G$ then it is always better to be a hawk
 Let $x = \text{prob Hawk}$ & $1-x = \text{dove}$

so ~~F~~

$$\dot{x} = x(1-x) \left[\left(\frac{G-C}{2} - G - 0 + \frac{G}{2} \right) x + G - \frac{G}{2} \right]$$

\downarrow $G < C$

$$= x(1-x) \left[-\frac{C}{2}x + \frac{G}{2} \right]$$

$x^* = \frac{G}{C} \in (0,1)$

Multi player Games

"Battle of the sexes"

Parental responsibility.

Game is rigged against Females since they produce few large gametes + males many small.

Females are more committed so for males a better strategy could be to desert.

Female counter strategy w "coyness" to insist on long engagement. So rather than going through second long engagement, male

might stay home. Thus w/ lots of coy females, faithful might be best. But as more males become faithful females might want to be "fast" they would lead to more "philandering" males + so on!

Two types of males: E_1 philandering E_2 faithful

Two types of females: F_1 coy F_2 fast

C = parental investment G = successful offspring
E = engagement, costs both

Faithful male + coy female $G - \frac{C}{2} - E$ for both since share duty

Faithful male + fast female $G - \frac{C}{2}$ (SRIP engagement)

Philander male + fast female G for min $G - C$ for her!

Philander male + coy female 0

Let $x =$ faithful males $1 - x =$ philan
 $y =$ coy female $1 - y =$ fast

Average fitness for ~~fast~~ male

$$\left[\left(G - \frac{C}{2} - E \right) y + \left(G - \frac{C}{2} \right) (1 - y) \right] x + \left[0 \cdot y + \left(G - C \right) (1 - y) \right] (1 - x) = \phi_m$$

← Fitness for faithful
philan

Average fitness for female y :

$$\left[\left(G - \frac{C}{2} - E \right) x + 0 \cdot (1 - x) \right] y + \left[\left(G - \frac{C}{2} \right) x + \left(G - C \right) (1 - x) \right] (1 - y)$$

$$\dot{x} = x \left[\left(G - \frac{C}{2} - E \right) y + \left(G - E \right) (1 - y) - \phi_m \right]$$

$$\dot{y} = y \left[\left(G - \frac{C}{2} - E \right) x - \phi_f \right]$$

You guys can simulate this for HW!

$$0 < E < G < C < 2(G - E)$$

Enzyme kinetics, mass + pseudosteady state hypothesis

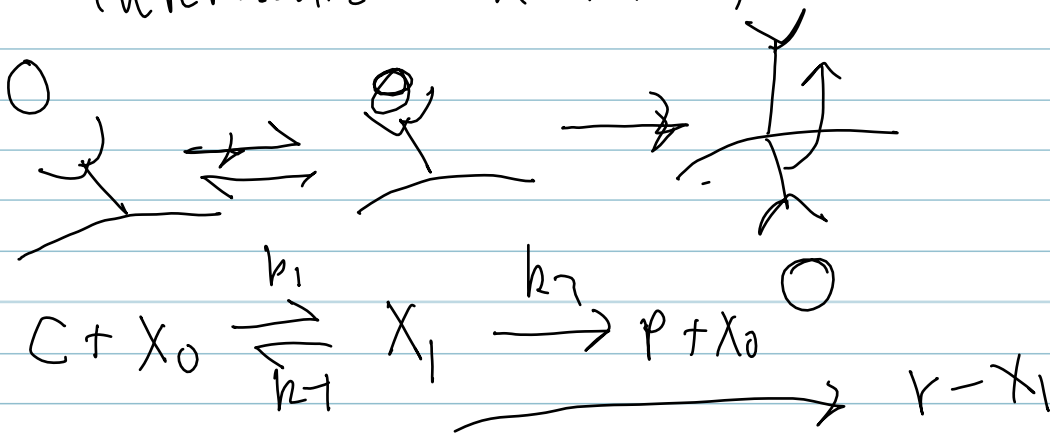
In chemostat model we assumed

$$r(C) = \frac{k_{max} C}{K_m + C}$$

Where does K_m come from?

Nutrients have to bind to external receptors, be brought inside cell + then the receptors are recycled

C = nutrient X_0 = unoccupied receptor
 X_1 = nutrient-Receptor complex, P = internalized nutrient



$$\frac{dC}{dt} = -k_1 C X_0 + k_{-1} X_1$$

$$\frac{dX_0}{dt} = -k_1 C X_0 + k_{-1} X_1 + k_2 X_1$$

$$\frac{dX_1}{dt} = k_1 C X_0 - k_{-1} X_1 - k_2 X_1$$

$$\frac{dP}{dt} = k_2 X_1$$

Note $\frac{d(X_0 + X_1)}{dt} = 0 \Rightarrow X_0 + X_1 = r$ total receptors

$$\frac{dc}{dt} = -k_1 c r + (k_{-1} + k_1 c) X_1$$

$$\frac{dX_1}{dt} = k_1 r c - (k_{-1} + k_2 + k_1 c) X_1$$

one can just try the following but we will not prove it. since there are few receptors compared to C , X_0 is rapidly

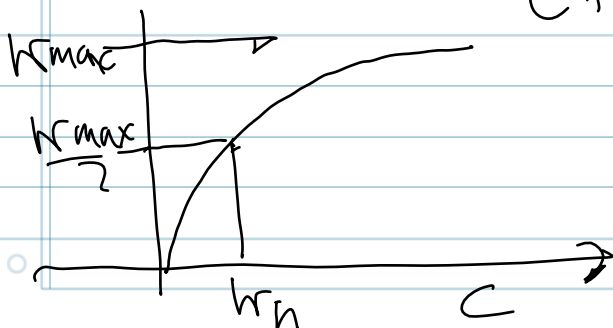
completely bound to C to form X_1 so

$dX_1/dt \approx 0$ after a brief transient.

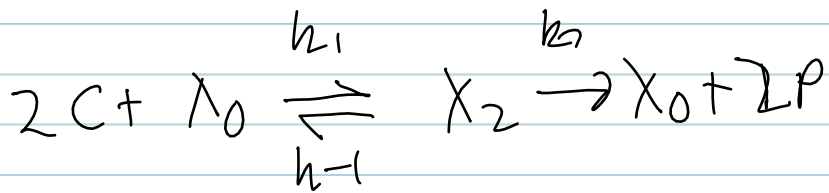
$$\Rightarrow k_1 r c - (k_{-1} + k_2 + k_1 c) X_1 = 0$$

$$\Rightarrow X_1 = \frac{k_1 r c}{k_1 c + k_2 + k_{-1}} = \frac{r c}{c + \frac{k_2 + k_{-1}}{k_1}}$$

$$\begin{aligned} \Rightarrow \frac{dc}{dt} &= -k_1 c r + (k_{-1} + k_2 + k_1 c) \frac{r c}{c + \frac{k_2 + k_{-1}}{k_1}} \\ &= -\frac{k_2 r c}{c + \frac{k_2 + k_{-1}}{k_1}} \equiv -\frac{k_{max} C}{C + K_n} \end{aligned}$$



Sequential kinetics



$$X_2 + X_0 = r$$

$$\frac{dc}{dt} = -k_1 c^2 X_0 + k_{-1} X_2$$

~~$$\frac{dX_0}{dt} = -k_1 c^2 X_0 + k_{-1} X_2 + k_2 X_2$$~~

~~set~~
$$\frac{dX_2}{dt} = k_1 X_0 c^2 - k_{-1} X_2 - k_2 X_2$$

~~set~~
$$\frac{dX_2}{dt} = 0 + X_2 + X_0 = r$$

$$\Rightarrow \frac{dc}{dt} = - \frac{k_{max} c^2}{K_m + c^2}$$

$$k_{max} = k_2 r \quad K_m = \sqrt{\frac{k_{-1} + k_2}{k_1}}$$



Genetic Molecular switch (Collins et al)



Gene 1 makes product P_1 , which suppresses Gene 2 + vice versa

$$\frac{dP_1}{dt} = \frac{A_1}{1 + \alpha_1 P_2^2} - \mu_1 P_1$$

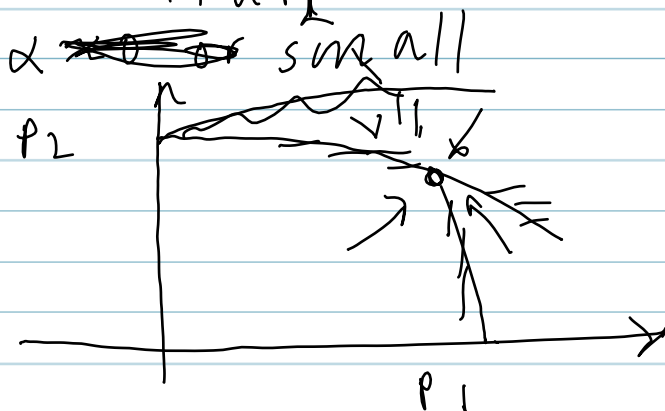
← productum
← Decay

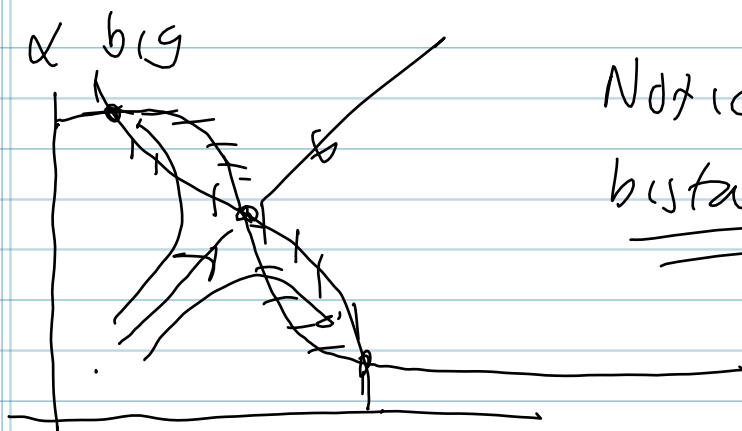
← suppression

$$\frac{dP_2}{dt} = \frac{A_2}{1 + \alpha_2 P_1^2} - \mu_2 P_2$$

Let's make life simple $A = A_1 = A_2$ $\alpha_1 = \alpha_2$
 make it all dimensions 1 $\mu_1 = \mu_2 = \mu$

$$\frac{dP_1}{dt} = \frac{A}{1 + \alpha P_2^2} - P_1 \quad \frac{dP_2}{dt} = \frac{A}{1 + \alpha P_1^2} - P_2$$





Notice we have
bistability now

If you change A_1 or A_2 you shift to make one or two more likely.

one more example that is pretty hard

Let X_1, X_2, X_3 produce products

Y_1, Y_2, Y_3 & Y_1 suppresses

X_3 , Y_2 suppresses X_3 Y_3 suppresses X_1

no way built into a bacteria & generated oscillations.

$$\dot{X}_1 = \frac{A}{1+Y_3} - X_1 \quad \dot{Y}_1 = \beta [X_1 - Y_1]$$

$$\dot{X}_2 = \frac{A}{1+Y_1} - X_2 \quad \dot{Y}_2 = \beta [X_2 - Y_2]$$

$$\dot{X}_3 = \frac{A}{1+Y_2} - X_3 \quad \dot{Y}_3 = \beta [X_3 - Y_3]$$

How to analyze this?

Tricky but simple when you know
the trick since we can exploit symmetry
Same for grad course!

Homework

① simulate rock paper scissors w/ M
when playing

	R	P	S
R gets	0	-a	1
P gets	1	0	-a
S gets	-a	1	0

as follows:

Let $x = \text{Rock}$, $y = \text{Paper}$, $z = \text{Scissors}$
Note $z = 1 - x - y$

(a) What is rock's average payoff?
What is scissors, paper's average payoff

call these f_x, f_y, f_z

Let $\phi = x f_x + y f_y + z f_z$ be the
average fitness of all

$$(b) \quad \dot{x} = x (f_x - \phi)$$

$$\dot{y} = y (f_y - \phi)$$

Substitute $z = 1 - x - y$

This is a two-dimensional system

(c) Start with $x = .2, y = .3$ } you may
+ solve equations for: } have
 $a = 1, a = .9, a = 1.1$ } to solve for
a while

(d) sketch the solution in the x-y phase plane. I will provide an XPP file if you want to use it.

② Lets consider the Hawk-Dove game again

	Hawk	Dove	Mixed
Hawk	$\frac{b-c}{2}$	b	$p \left(\frac{b-c}{2} \right) + (1-p)b$
Dove	0	$\frac{b}{2}$	\star
Mixed	$p \left(\frac{b-c}{2} \right) + (1-p)0$	\star	\star

The mixed strategy is as follows. with probability p , it takes the Hawk strategy & with prob $1-p$ it takes the dove strategy

so, for example when ~~mixed~~ plays Mixed it receives $p \cdot \frac{b-c}{2} + (1-p)b$.

When mixed plays Hawk, it receives

$$p \left(\frac{b-c}{2} \right) + (1-p)0$$

↑ playing as hawk ↑ playing as dove

Try to fill in the rest of these values.

Note mixed vs mixed is tricky

There are 4 scenarios that you have to keep track of. For example

mixed playing as Hawk vs

mixed playing as Dove occurs at a rate $2p(1-p)$ (or $2(1-p)$)

There because the first can be dove, second hawk or hawk/dove.
