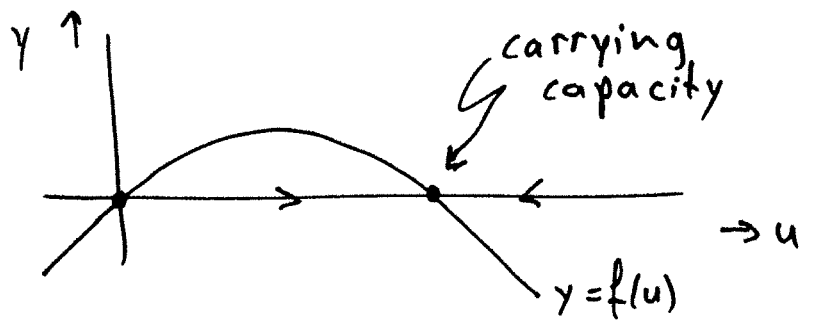


# Spatial Ecology

single species

$$\dot{u} = f(u)$$

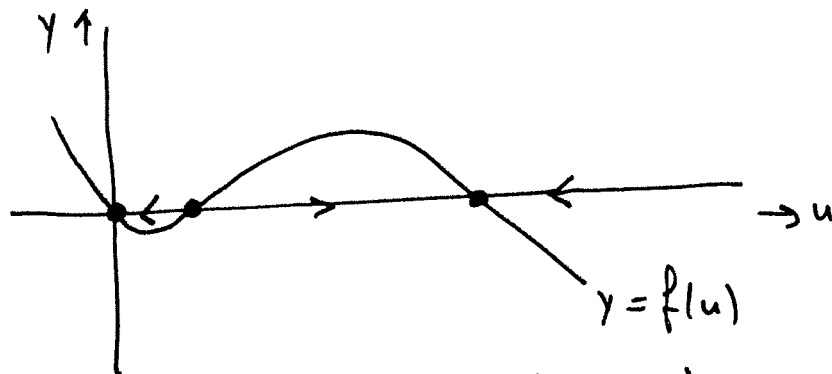


Allee effect

↓  
bistability

↓

introduction must exceed threshold to be successful



Note: ODE model ignores development/maturation of individual

PSPM (physiologically structured population models) do incorporate maturation by first introducing the notion of  $i$ -state; at the  $p$ -level these models lead to delay equations. Also note: ODE ignores demographic stochasticity

Question: how fast does a newly introduced species grow to carrying capacity?

Answer: there exists a well defined asymptotic speed of propagation, aka 'spreading speed'  $c_0$

Moral: caricatures are useful!

Consider  $\frac{\partial u}{\partial t} = D \Delta u + r u$   $D > 0$   
 $r > 0$   
 $x \in \mathbb{R}^2$  / 2

In fact, consider the fundamental solution

$$u(t, x) = \frac{1}{4\pi D t} e^{rt - \frac{|x|^2}{4Dt}}$$

note  $\lim_{t \rightarrow \infty} u = \infty$   
 $\lim_{|x| \rightarrow \infty} u = 0$

Claim For any  $\varepsilon > 0$

$$\lim_{t \rightarrow \infty} \sup \{ u(t, x) : |x| \geq (\sqrt{4Dr} + \varepsilon)t \} = 0$$

$$\lim_{t \rightarrow \infty} \min \{ u(t, x) : |x| \leq (\sqrt{4Dr} - \varepsilon)t \} = \infty$$

Conclusion The region in which the species has achieved a substantial density expands with rate  $c_0 = 2\sqrt{Dr}$  (known as the Fisher speed or KPP speed)

Is this conclusion robust? Yes!

- nonlinear  $\frac{\partial u}{\partial t} = D \Delta u + f(u)$

with  $f(u) = u g(u)$  and  $g(0) = r$  and

replace  $\infty$  by the carrying capacity

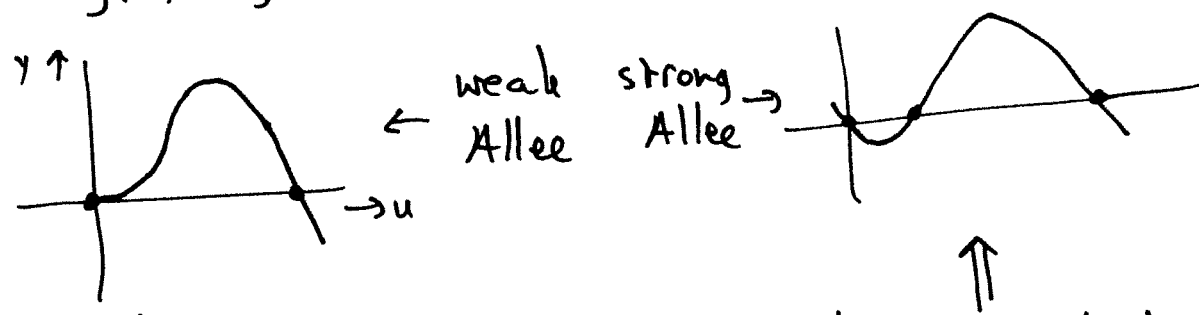
$g(u) < g(0)$   
for  $u > 0$

use the maximum principle  
super- and subsolutions

— finite domain  $\Rightarrow$  intermediate asymptotics  
 conclusion holds after peculiarities of initial condition are no longer important and boundary has no impact yet, so for times such that  $c_0 t \ll$  domain size

Mathematical curiosity: what if

$g(u) < g(0)$  for  $u > 0$  does not hold?



$\Uparrow$   
 we have to adapt the definition of  $c_0$

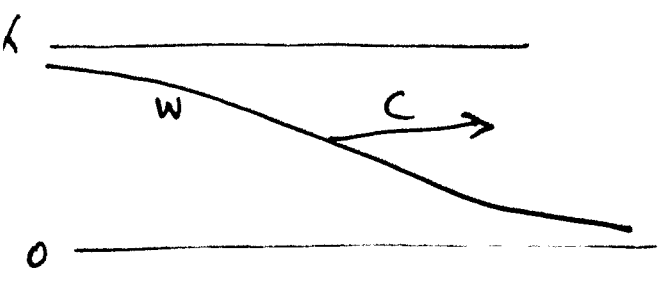
$\Uparrow$   
 here too adopt def.  $c_0$  but in addition there are conditions on the initial condition

$\Downarrow$   
 minimal speed for which travelling wave exists

$\Downarrow$   
 $\exists$  wave speed  $c_0$

$u(t, x) = w(x - ct)$

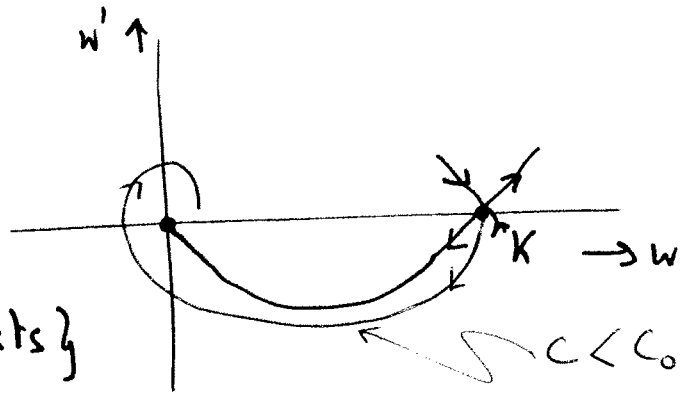
$\swarrow$  direction (does not matter, since we have isotropy)  
 $\uparrow$  profile  
 $\nearrow$  speed



$$\xi := x - ct \quad D w'' + c w' + f(w) = 0$$

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phase plane analysis



$$c_0 = \min \{ c : \text{tr.w. sol.}^n \text{ with speed } c \text{ exists} \}$$

when  $c_0 = 2 \sqrt{Dg(0)}$  we say waves are pulled  
 when  $c_0 > 2 \sqrt{Dg(0)}$  we say waves are pushed

minimal wave speed is true speed of expansion:

Aronson & Weinberger 1975 :  $u(0, \cdot)$  with compact support

$$\liminf_{t \rightarrow \infty} \min \{ u(t, x) : |x| \leq ct \} \geq K \quad \text{if } c < c_0$$

$$\limsup_{t \rightarrow \infty} \sup \{ u(t, x) : |x| \geq ct \} = 0 \quad \text{if } c > c_0$$

So waves with speed  $c > c_0$  do not have much physical relevance (but characterizing initial data that do converge to these is quite a mathematical challenge, see Bramson, Uchiyama as well as modern work on branching Brownian motion)

## Extensions

rivers : the drift paradox  
moving climate

spatial heterogeneity

time periodicity

human digestive track ?

← robustness

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## Alternative equations

e.g. for plant disease transmitted  
by dispersing fungal spores

$$b(t, x) = \int_0^{\infty} \int_{\mathcal{R}^2} b(t-a, \xi) A(a, x, \xi) d\xi da$$

↑  
p-birth rate

↑  
age

$\frac{1}{|x-\xi|}$  if homogeneous  
and isotropic

## Hybrid models

reproduction as a yearly event

(while consumption, predation, transmission of infection,  
dispersion, i.e., movement in space, occur in continuous time)

Nonlinear epidemic outbreak equation :

$$\gamma(t, x) = \int_0^{\infty} \int_{\mathcal{R}^2} \left[ 1 - e^{-\gamma(t-\tau, \xi)} \right] A(\tau, x-\xi) d\xi d\tau$$

## Bounded Domains

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We need to impose boundary conditions

$$\text{no-flux} : -\nu \cdot \nabla u|_{\partial\Omega} = 0$$

allows for "flat" (= spatially homogeneous) solutions

big monster at the boundary : zero Dirichlet  
 $u|_{\partial\Omega} = 0$

in that case  $g(0) > 0$  does not by itself guarantee  
persistence : for  $|\Omega|$  too small extinction

may occur

$\Rightarrow$  minimal critical patch size

## Heterogeneity

$$\frac{\partial u}{\partial t} = D \Delta u + \beta(x)u - \mu(x)u \quad u|_{\partial\Omega} = 0$$

Thm Let  $\Omega$  be a bounded domain of class  $C^{2,\alpha}$  and  $L$  an elliptic operator with coefficients of class  $C^{0,\alpha}(\bar{\Omega})$ , where  $0 < \alpha < 1$ . There exists a unique eigenvalue  $\lambda_1$  of  $-L$  characterized by the existence of a corresponding eigenfunction  $\phi_1$  (so  $L\phi_1 + \lambda_1\phi_1 = 0$ ,  $\phi_1 \neq 0$ ,  $\phi_1|_{\partial\Omega} = 0$ ) such that  $\phi_1 \geq 0$  in  $\Omega$  and  $\frac{\partial \phi_1}{\partial \nu} < 0$  on  $\partial\Omega$ . Furthermore,  $\lambda_1$  is simple and any

other eigenvalue  $\lambda$  of  $-L$  satisfies

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$$\lambda_1 \leq \operatorname{Re} \lambda$$

with equality iff  $\lambda_1 = \lambda$ .

We call  $\lambda_1$  the principal eigenvalue and a corresponding positive eigenfunction is called principal eigenfunction

Proof Krein-Rutman (=  $\infty$ -dim Perron-Frobenius)

In order to apply this theorem, we need to know the

sign of  $\lambda_1$  ← Cartell & Cosner

Digression on Perron-Frobenius in population context:

$$\dot{x} = \left( \begin{array}{c} T \\ \uparrow \\ \text{reproduction/} \\ \text{transmission} \end{array} + \Sigma \right) x$$

change-of-state

$T \geq 0$   $\Sigma$  is POD (positive - off-diagonal)

Note  $-\Sigma^{-1} = \int_0^{\infty} e^{a\Sigma} da$ , so  $(-\Sigma^{-1})_{ij}$  is expected time an individual now in state  $j$  will spend in state  $i$  during the rest of its life (note that  $\Sigma^{-1} \geq 0$ )

$(-T\Sigma^{-1})_{ij} =$  ↑  
with state-at-birth  $i$  expected # offspring produced by newborn individual with state  $j$

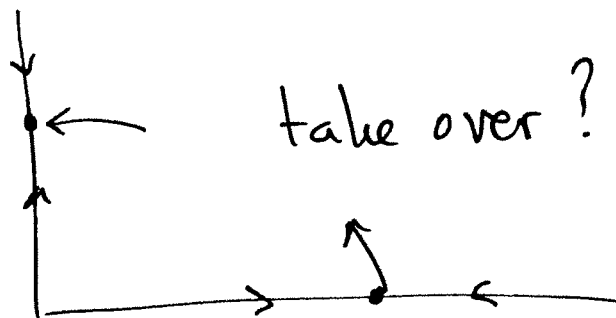
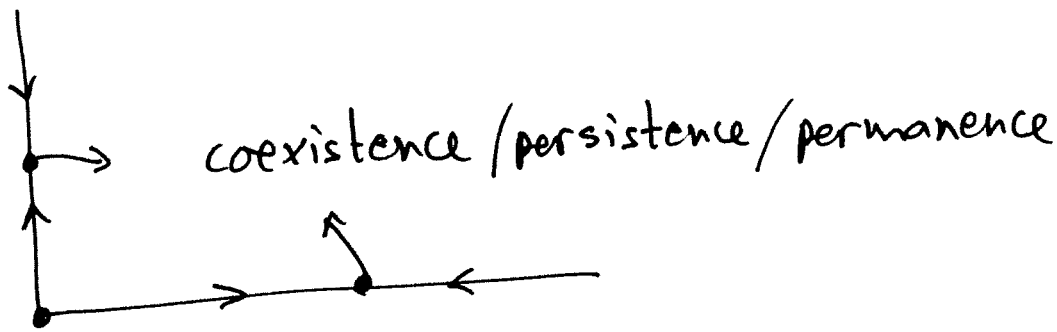
$S_0 - T Z^{-1}$  is the next-generation matrix  
 Its dominant eigenvalue is called  
 the basic reproduction number  $R_0$

$$\boxed{\text{sign}(R_0 - 1) = -\text{sign } \lambda_1} \quad \leftarrow \text{Thieme}$$

In spatial models, state-at-birth is position where individual is born.

Critical question: do movement and reproduction indeed take place at the same time scale?

### Multi-species



Adaptive Dynamics!  
 e.g. evolution of  
 dispersal strategy  
 Yuan Lou (among others)



# Patterns

(9)

for scalar equations and convex domains  
and zero-flux b.c. NO stable patterns!  
(diffusion equilibrates)

Turing: for systems of equations "flat"  
steady states may destabilize when diffusion  
coefficients are sufficiently unequal

(short range activation & long range inhibition)

## Miscellaneous

Max Rietherk: arid ecosystem  
do patterns provide early  
warning for catastrophic  
collaps?

i.) local correlation of  
genetic relatedness  
infection status

has strong impact on, respectively, evolution  
and disease dynamics

Solutions of diffusion equations are ~~≠~~ everywhere  
positive, which may lead to artefacts

Alternative representations of space:

lattices  
networks

A bit related: do prey-predator cycles  
synchronize or are local cycles out of phase?  
(same question for infectious disease oscillations)

ii) communication by way of chemical signals

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e.g. quorum sensing of bacteria

plants attract natural enemies of herbivores  
by way of pheromones

iii) animal grouping : schools, herds, flocks, swarms

## Projects

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1. Maximum Principle, principal eigenvalue  
super- & sub-solutions  
Chapter 2 of "Reaction-diffusion equations and  
propagation phenomena" by H. Berestycki & F. Hamel
2. Fisher/KPP travelling waves via ODE (or PDE?)
3. Aronson & Weinberger: the asymptotic speed of propagation
4. integro-difference equations
5. Volterra integral equations with "non-local in space"  
effects: the spread of infectious disease
6. flowing rivers / moving climate
7.  $\text{sign}(R_0 - 1) = -\text{sign } \lambda_1$
8. Turing instability