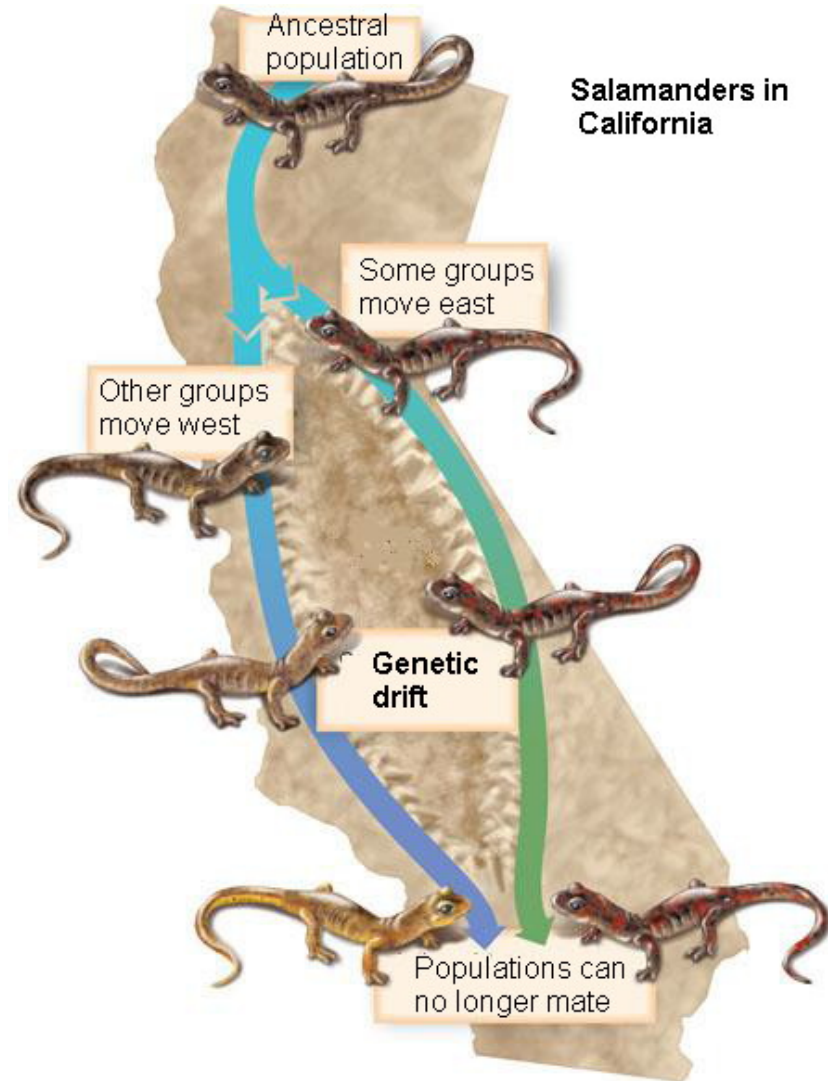
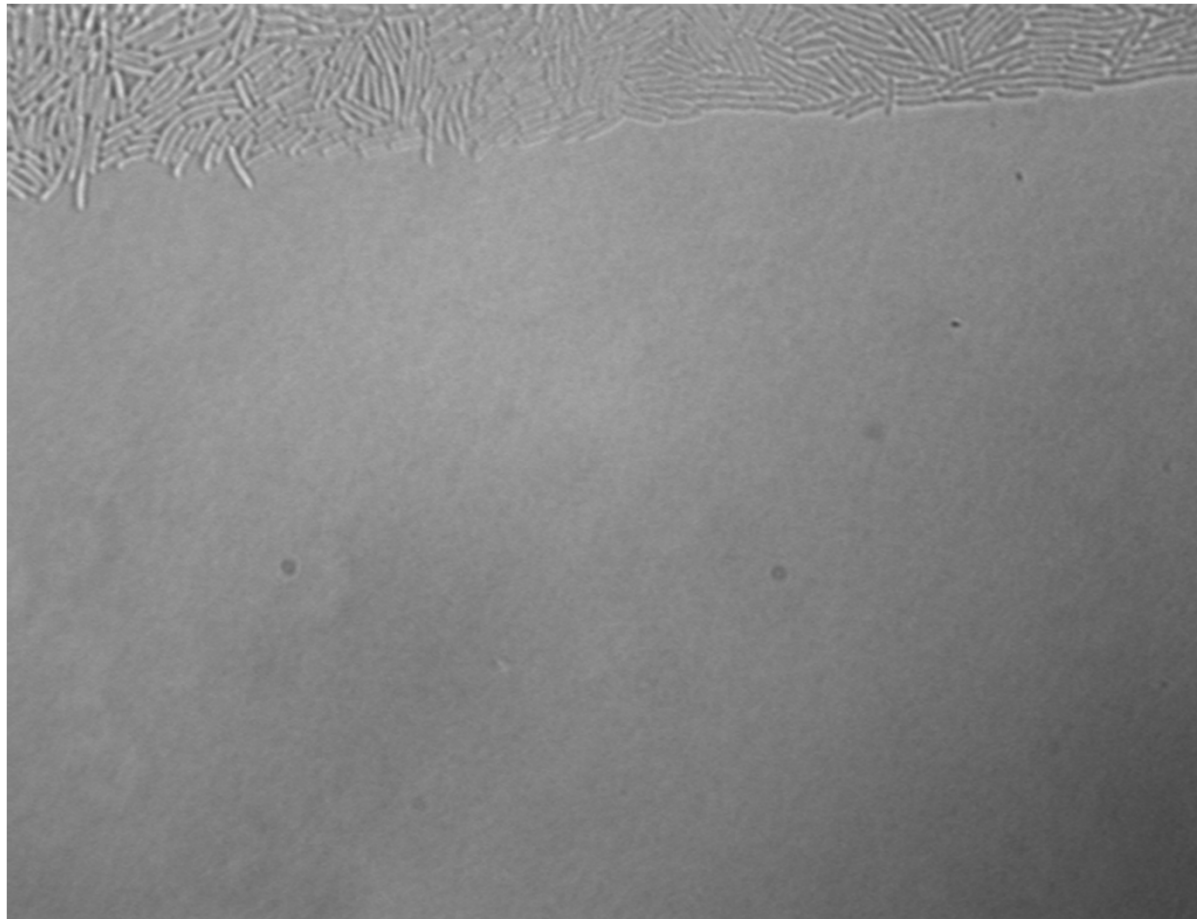


Range expansions can be unstructured or structured

<http://legacy.hopkinsville.kctcs.edu>



unstructured range expansion

(*E. coli* on a Petri dish, O. Hallatschek & drn Ramanathan lab)

structured range expansion

(leads to allopatric speciation)

Collective Behavior and Growth: Range Expansions in Structured Environments

Frontier populations with spatial structure

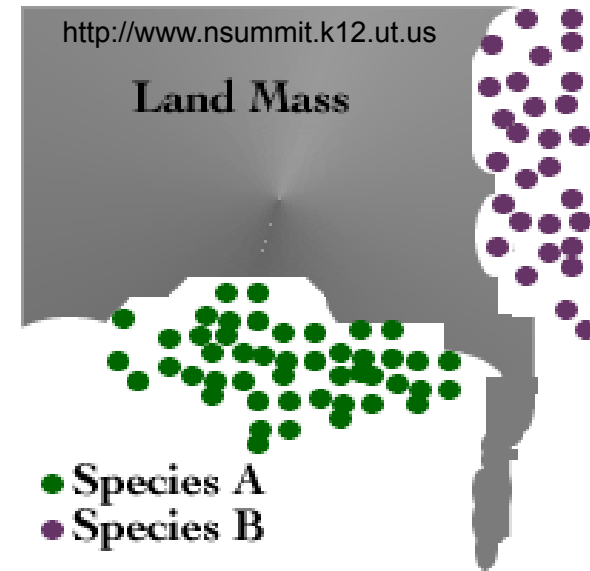
-- *Our world is not featureless landscape → geographical features influence ecosystems and population fronts*

-- *How does a range expansion in a inhomogeneous environment shape genetic diversity at the frontier?*

**Simplified model of spatial structure:
migration around obstacles such as “lakes and deserts” (or a mountain range...)**

-- *Population fronts around obstacles: experiments, “Fermat’s principle” and simulations of the bacterial virus T7 invading inhomogeneous bacterial lawns*

---*Adding population genetics: simulations and an experiment with E. coli*

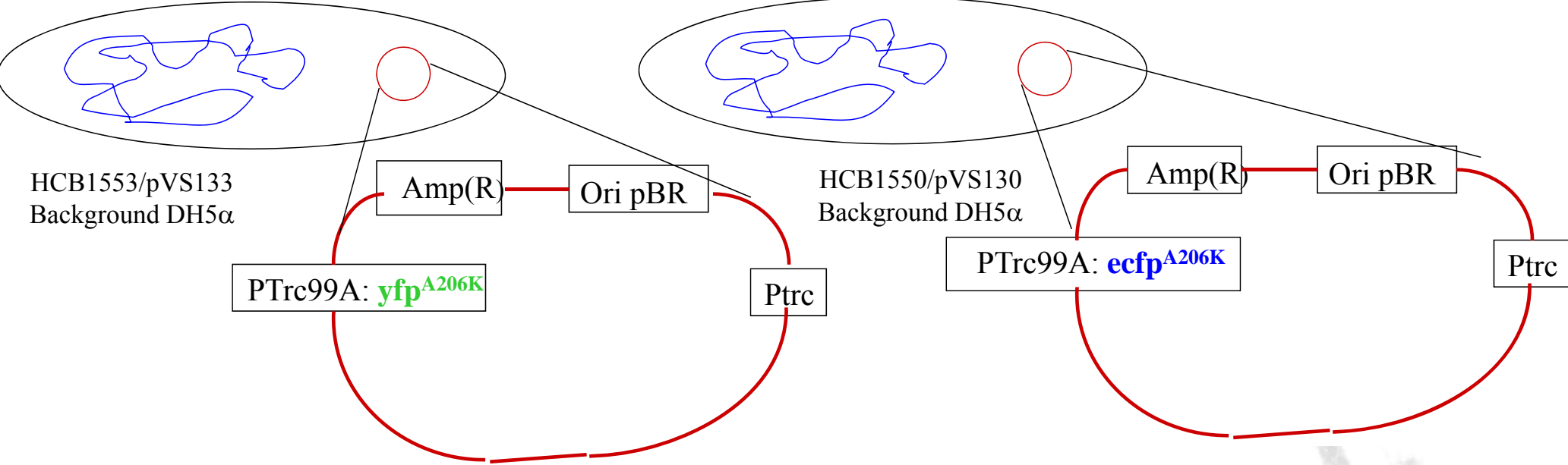


*Wolfram
Moebius*

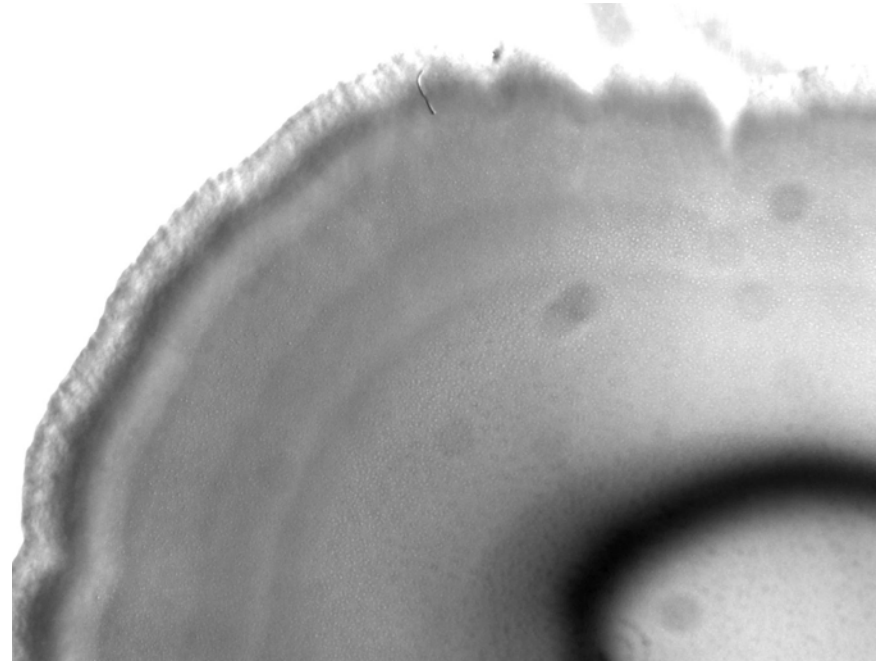
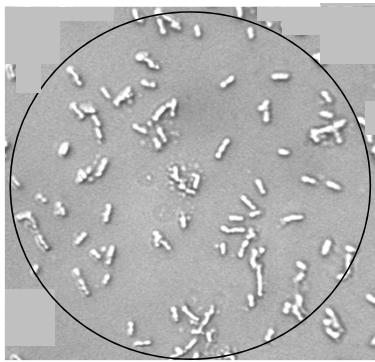


*Andrew
Murray*

Unstructured range expansion in non-motile E. coli (thanks to Tom Shimizu, Berg Lab, for strains)



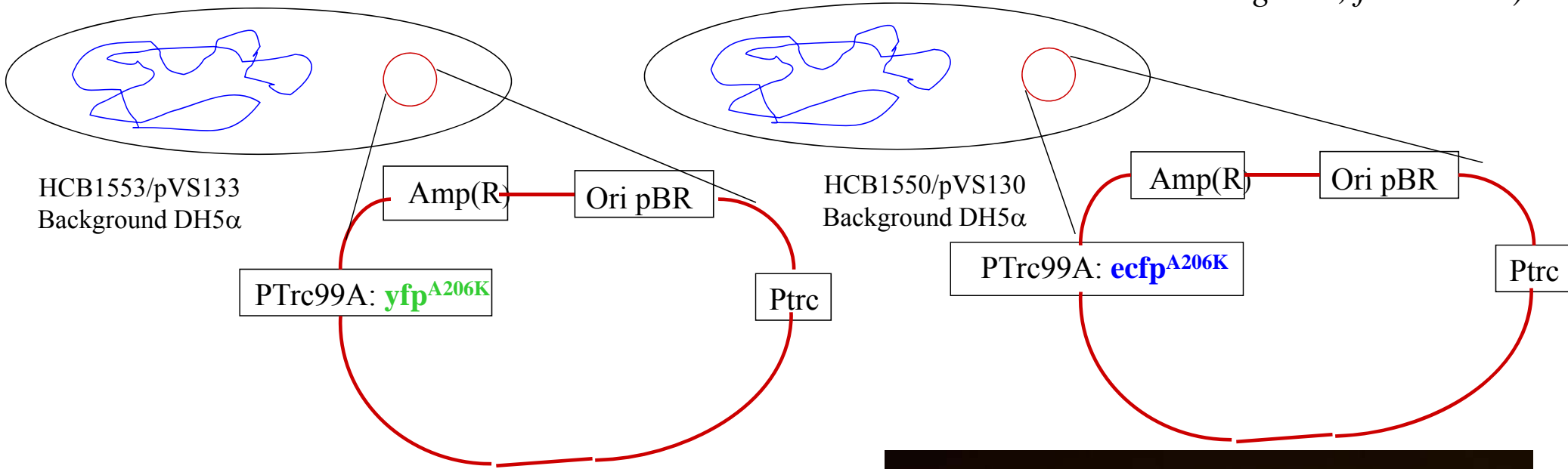
O. Hallatschek, drn et al., PNAS **107**,19926 (2007)



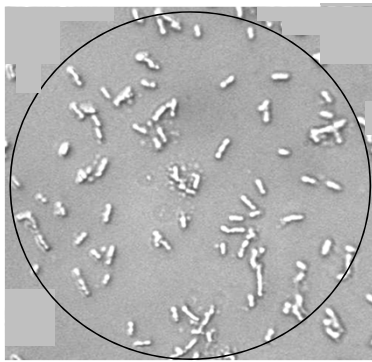
50-50 mixture,
1550/1553

Unstructured range expansion in non-motile *E. coli*

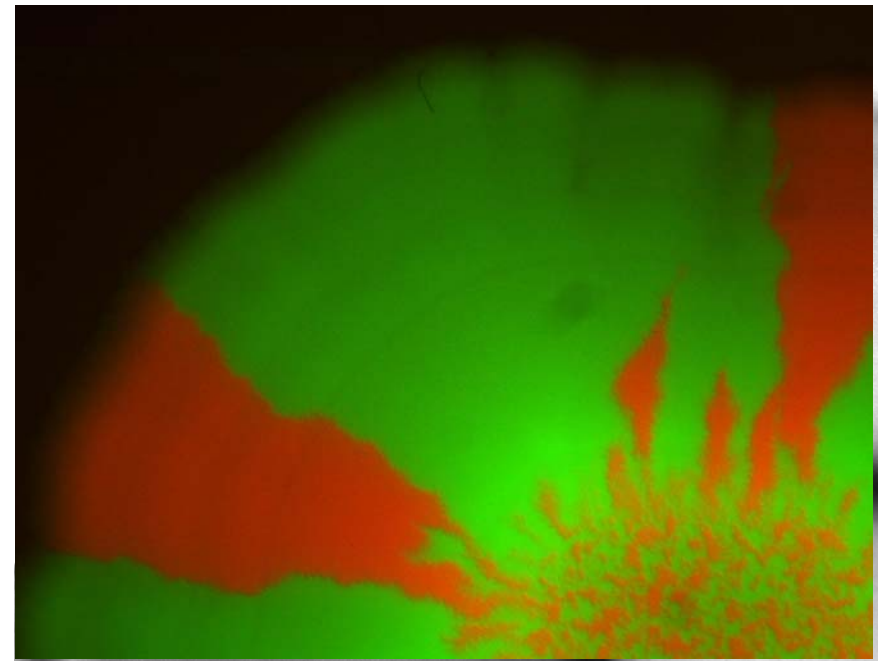
(thanks to Tom Shimizu, Berg Lab, for strains)



O. Hallatschek, drn et al., PNAS **107**,19926 (2007)



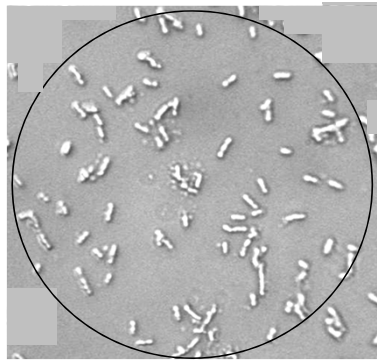
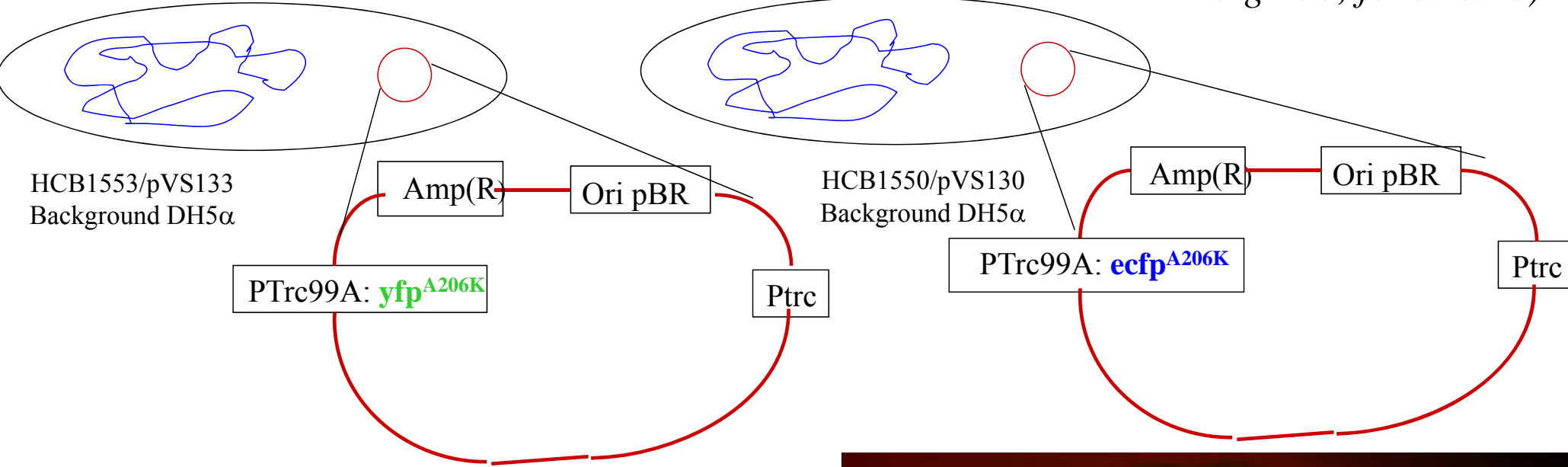
50-50 mixture,
1550/1553



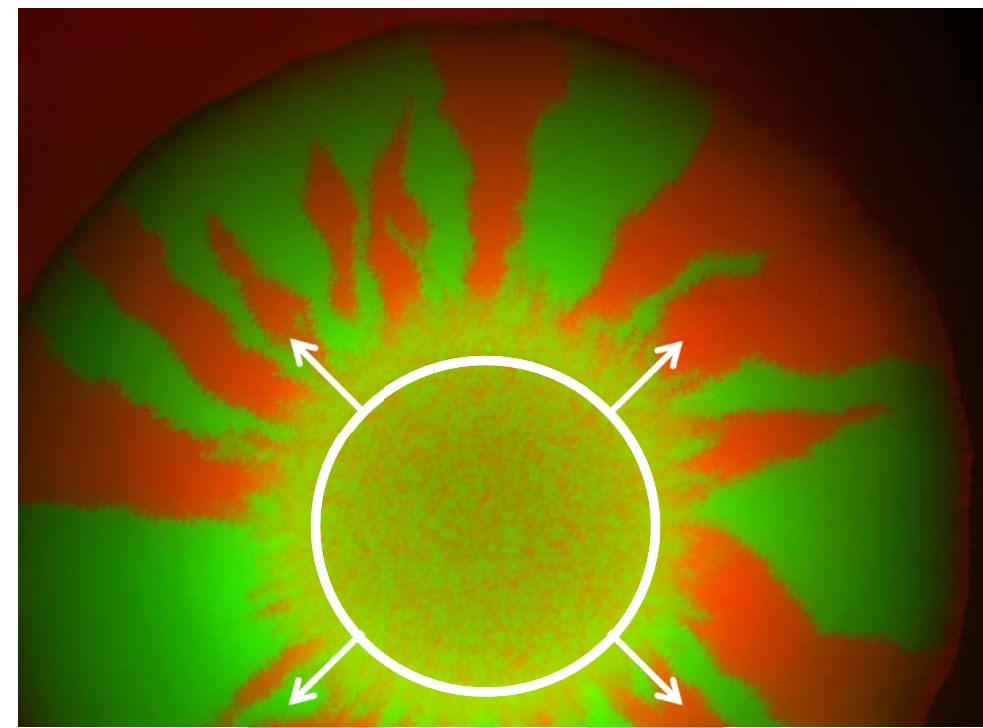
Cyan → Red

Unstructured range expansion in non-motile *E. coli*

(thanks to Tom Shimizu, Berg Lab, for strains)

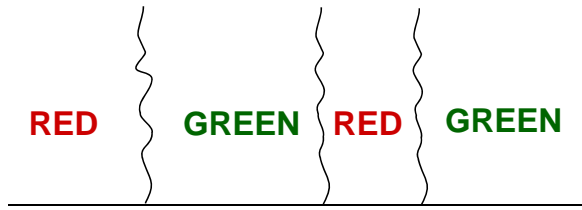


50-50 mixture,
1550/1553

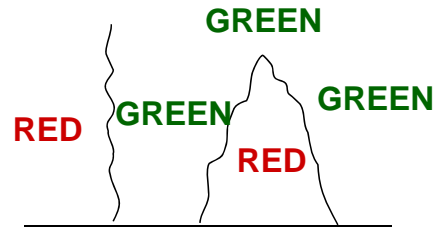
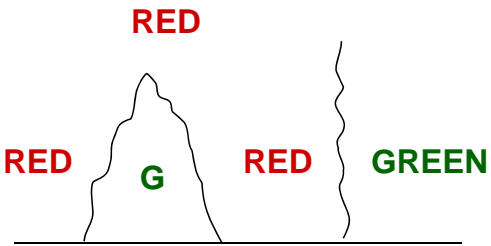


Cyan → Red

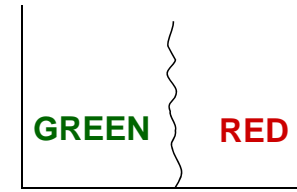
Approximate linear inoculations by annihilating random walks



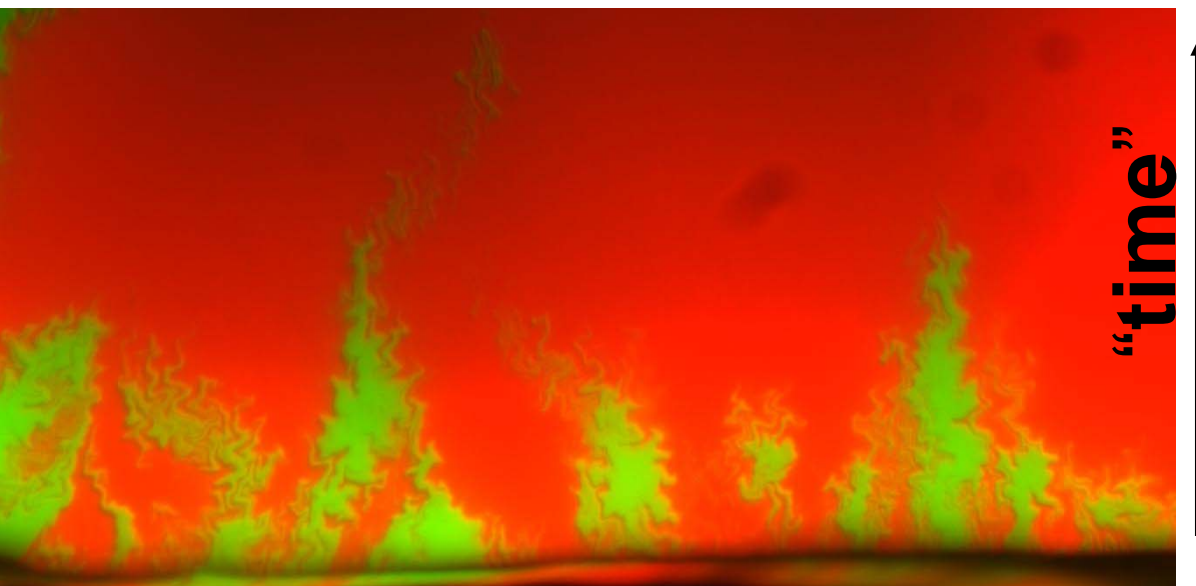
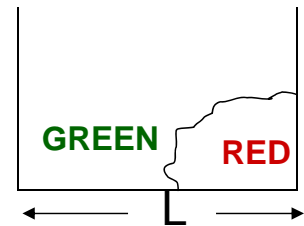
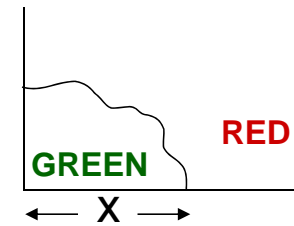
OR



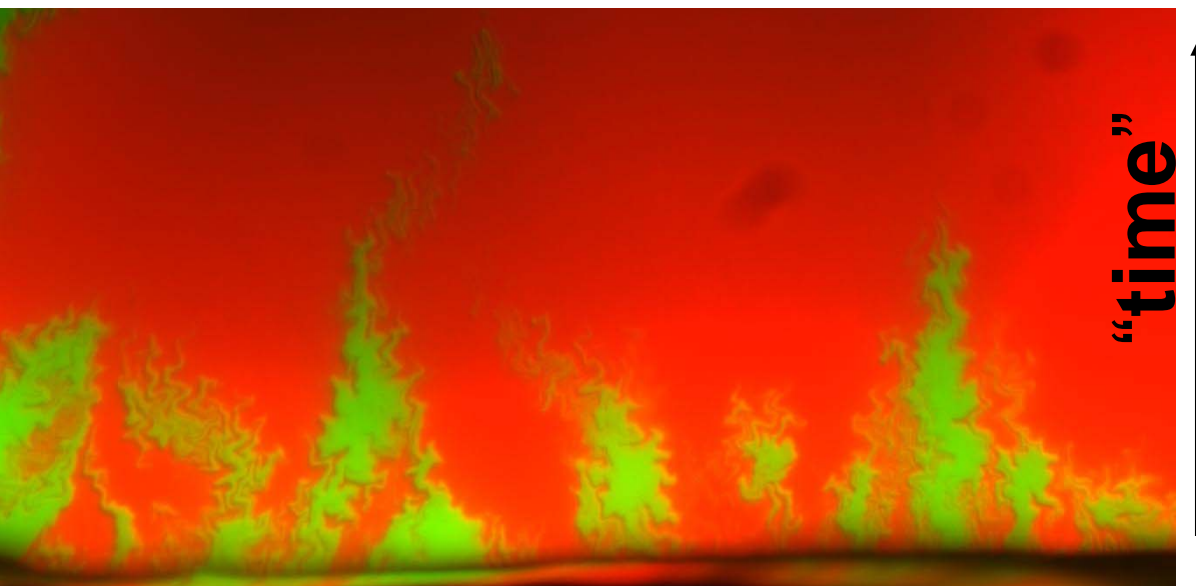
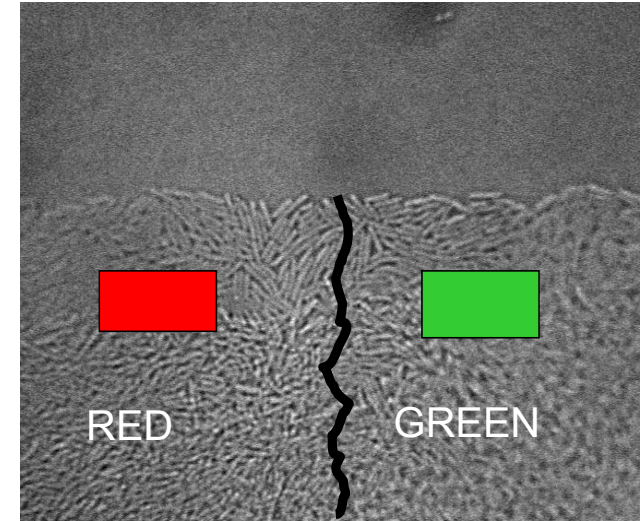
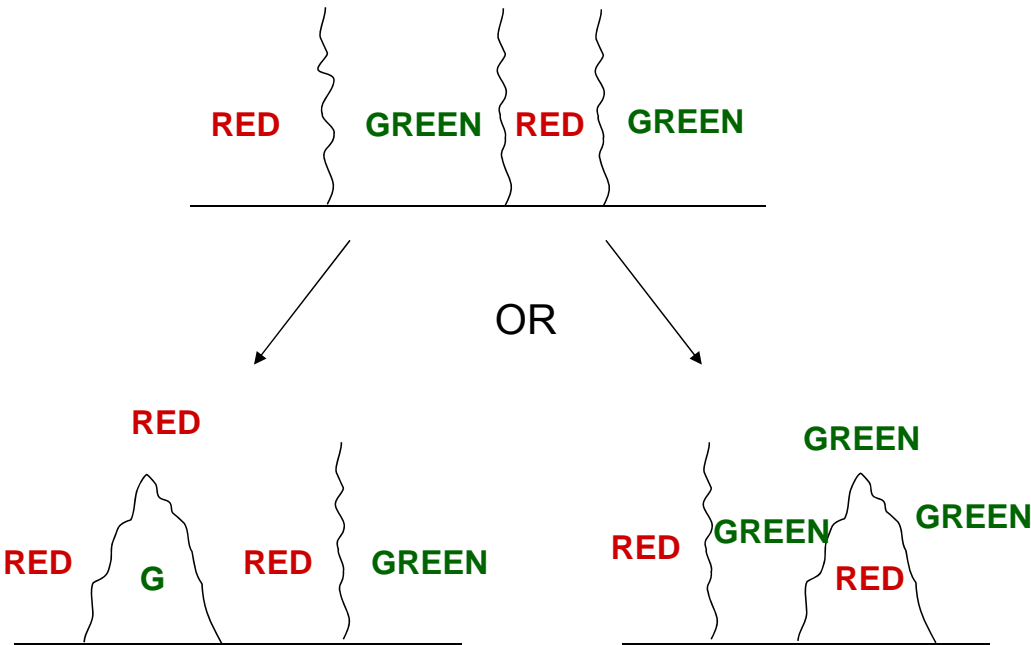
Replace with simpler problem of rigid absorbing walls on either side – focus on the fate of the boundary in the middle....



OR



Approximate linear inoculations by annihilating random walks



If D_w = wall diffusion constant

$n_w(t)$ = density of walls

$$= 1 / \sqrt{2D_w t}$$

$\propto 1/t^\zeta$, in general

But the genetic boundaries may wander more vigorously...

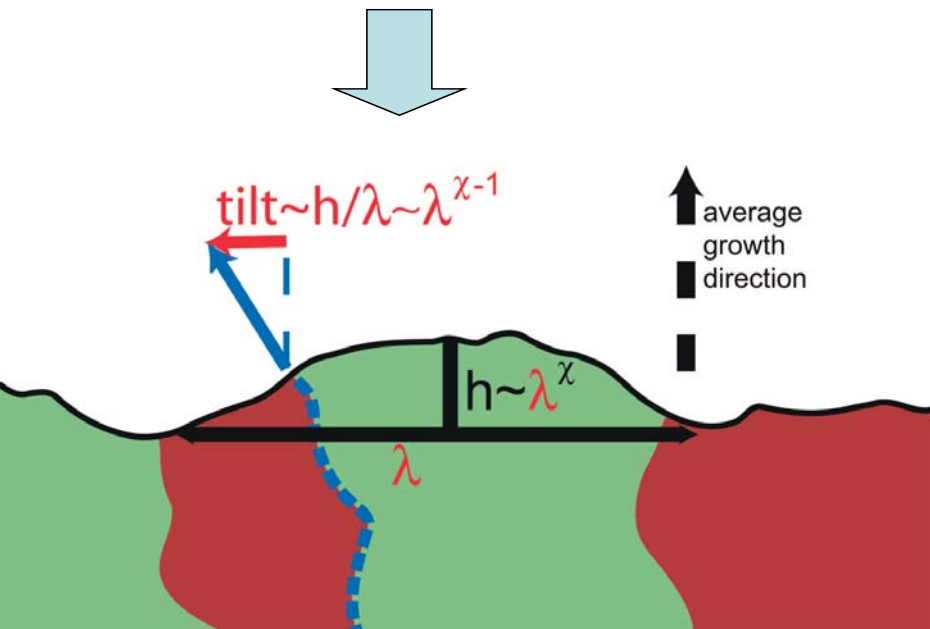
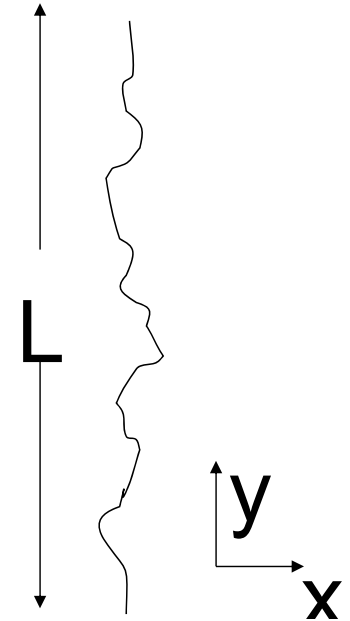


$$\langle [x(L) - x(0)]^2 \rangle \approx \text{const.} \times L^{2\zeta}$$

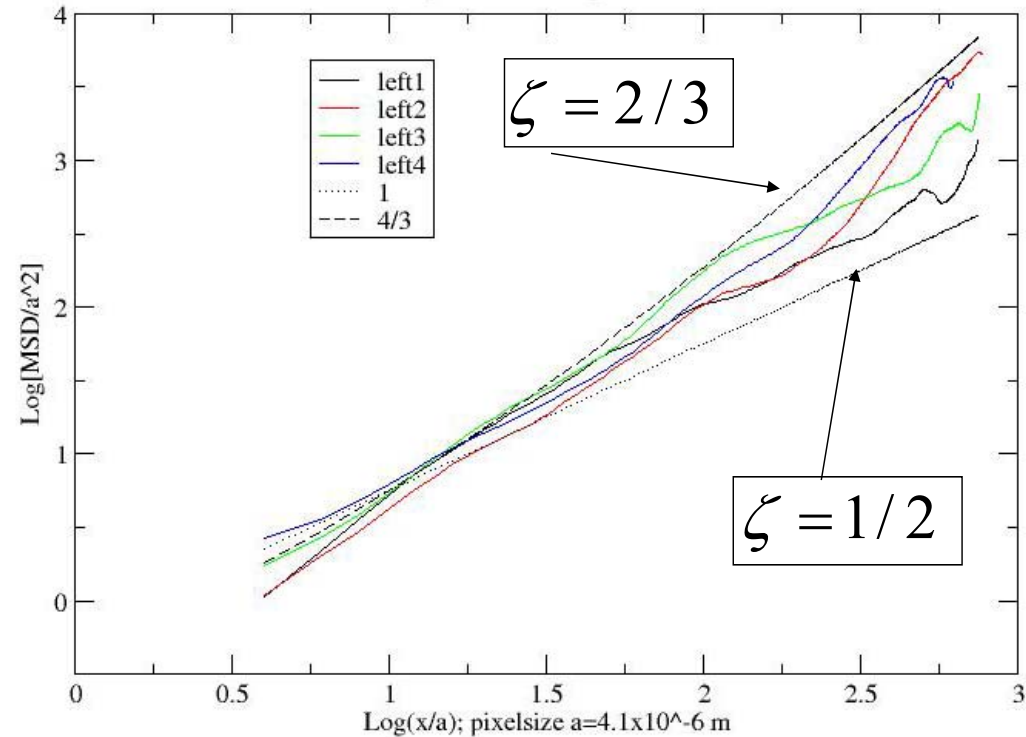
$\zeta = 1/2$, random walk

$\zeta = 1 + (\chi - 1) / z = 2/3$,

(KPZ, $\chi=1/2$, $z=3/2$)



Linear initial conditions
from picture "4-2E7-g8x-series-2"



Hallatschek, Hersen, Ramanathan, drn,
PNAS **104**, 19926 (2007)

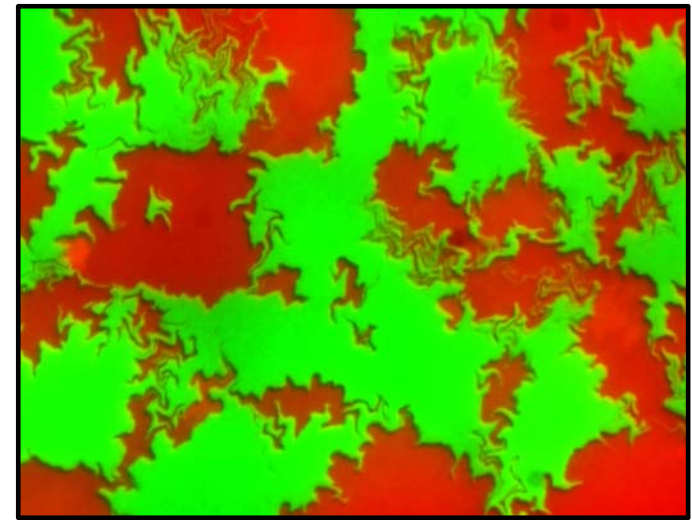
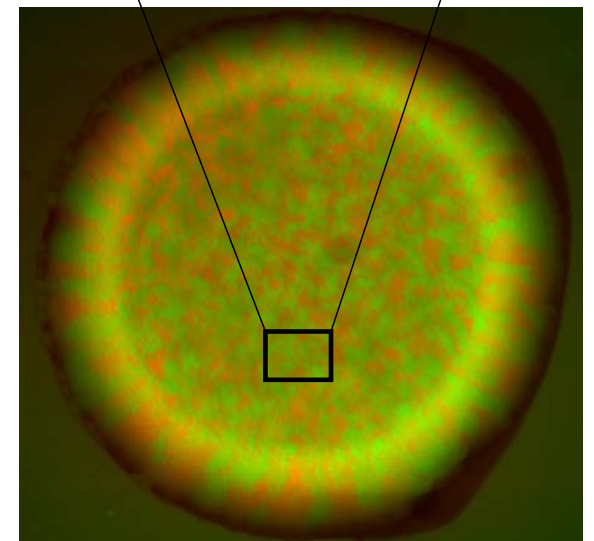
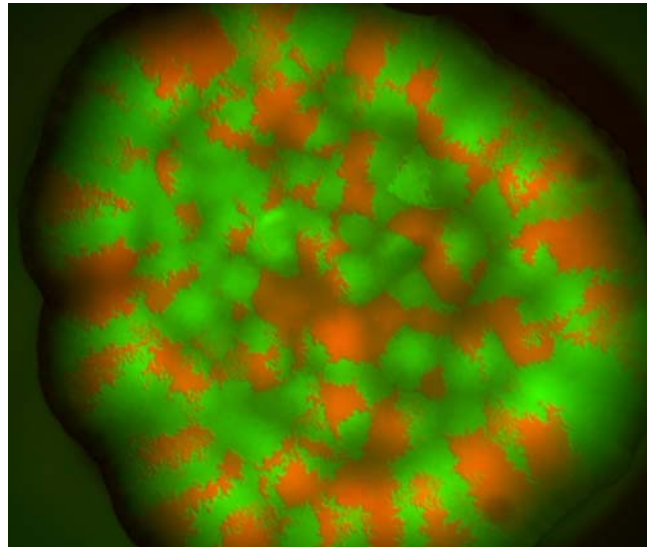
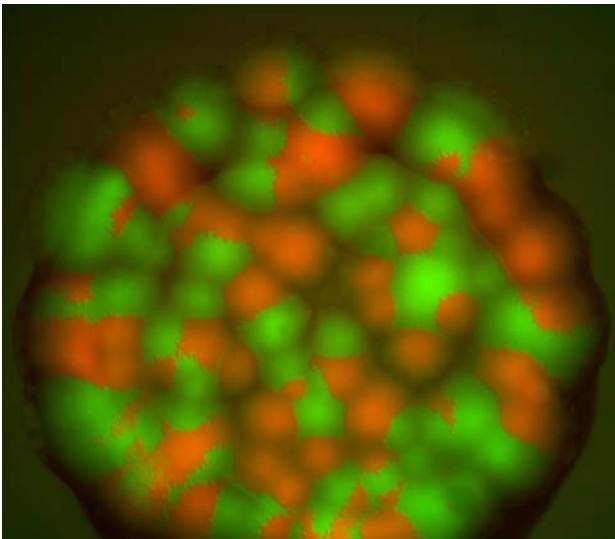
How can we make structured environments? Can the “homeland” be regarded as an “ecological landscape”?

50-50 circular inoculants 24 hours after inoculation; (~ 1mm spot size)

~25 green &
25 “red” viable
founder bacteria

~250 green &
250 “red” viable
founder bacteria

~2500 green &
2500 “red” viable
founder bacteria



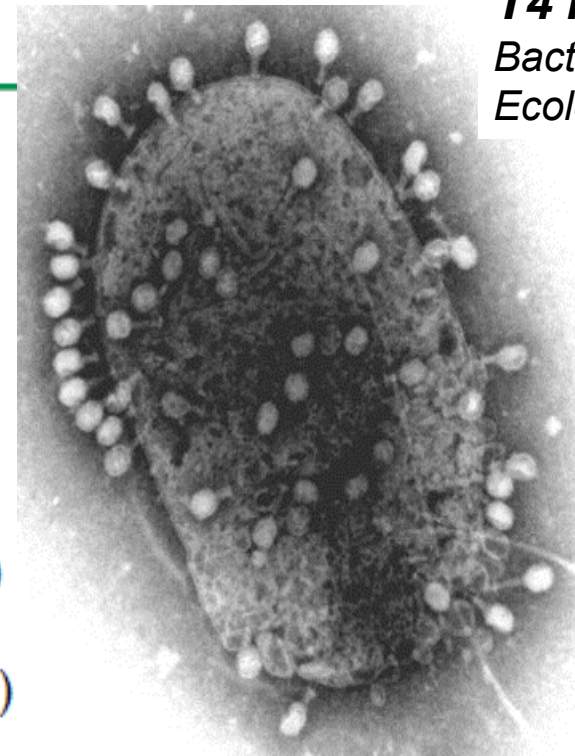
Introduction - bacteriophage T7

T4 infection
Bacteriophage
Ecology.aspx

- phage T7: well-studied
- obligatory lytic
- forms large plaques
- grows on bacteria in stationary phase

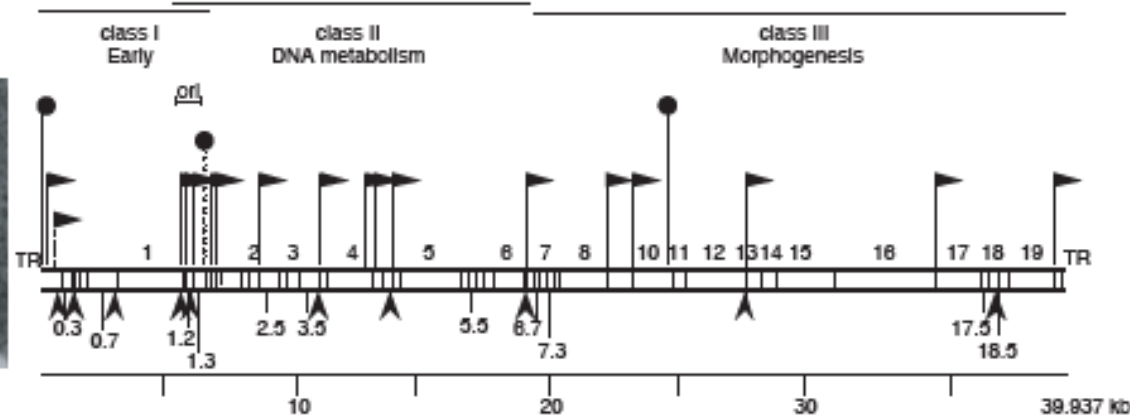
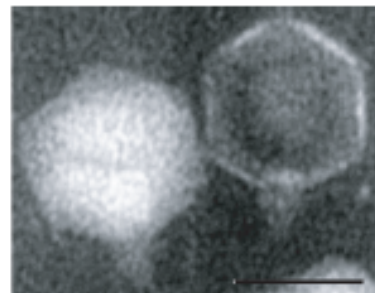
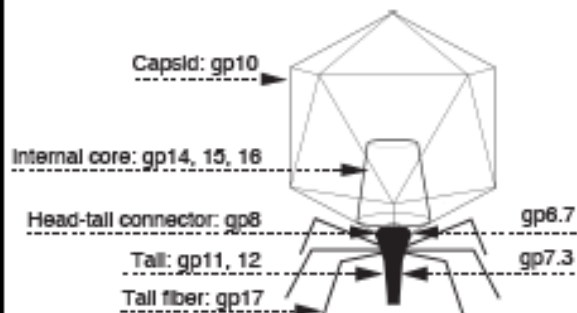
- size: ~ 60 nm (1/20 *E. coli* size)
- 40 kb linear genome (length can be moderately changed)
- 56 known or potential genes, three classes of genes (early, metabolism, morphogenesis)

- early genes transcribed by *E. coli* RNAP, importantly: gene 1, coding for T7 RNAP
- other genes transcribed by T7 RNAP



phage T7 genome

[figures from review by Ian J. Molineux]



Introduction - bacteriophage T7

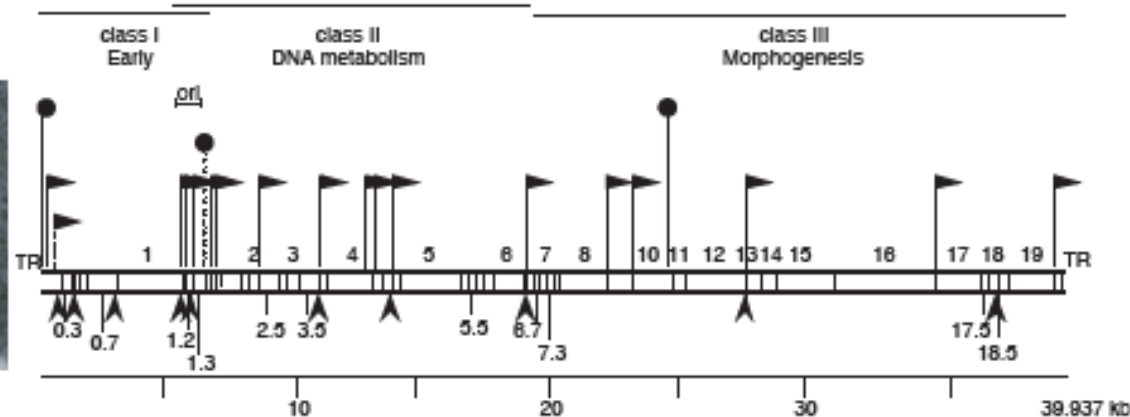
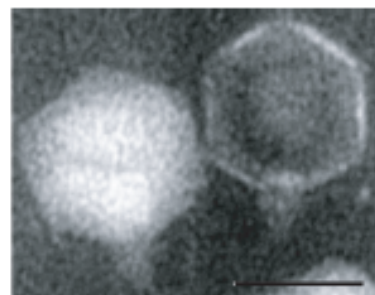
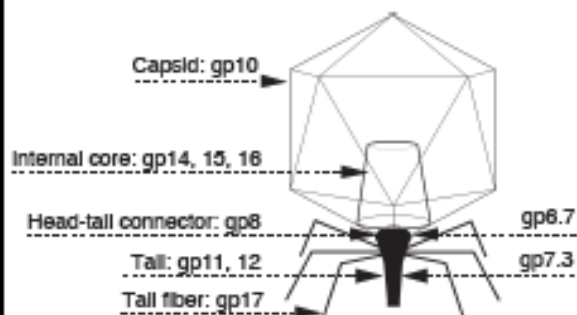
- phage T7: well-studied
- obligatory lytic
- forms large plaques
- grows on bacteria in stationary phase
- size: ~ 60 nm (1/20 *E. coli* size)
- 40 kb linear genome (length can be moderately variable)
- 56 known or potential genes, three classes of genes (early, metabolism, morphogenesis)
- early genes transcribed by *E. coli* RNAP, important for infection
- other genes transcribed by T7 RNAP



left microscope, Nov 20–21 2010

phage T7 genome

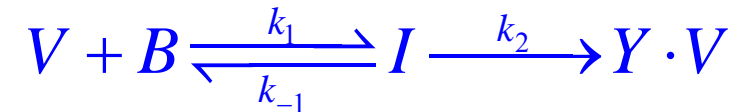
[figures from review by Ian J. Molineux]



Growth of viral plaques

*J. Yin and J. S. McCaskill
Biophys. J. 61, 1540 (1992)*

- *A virus V encounters a bacterium B and (reversibly) produces an infected organism I*



- *The infected bacterium lyses in a latency time $1/k_2$ to produce new viral particles with an integer yield Y ($Y \sim 30$ for T7)*

- *Reaction-Diffusion equations for $[V]$, $[B]$ and $[I]$ lead to a Fisher equation for the spatial virus concentration $[V] = u(r,t)$*

$$\frac{\partial}{\partial t} u(\vec{r}, t) = D \nabla^2 u(\vec{r}, t) + a u(\vec{r}, t) [1 - u(\vec{r}, t) / K]$$

K = phage density in the plaque = "carrying capacity"

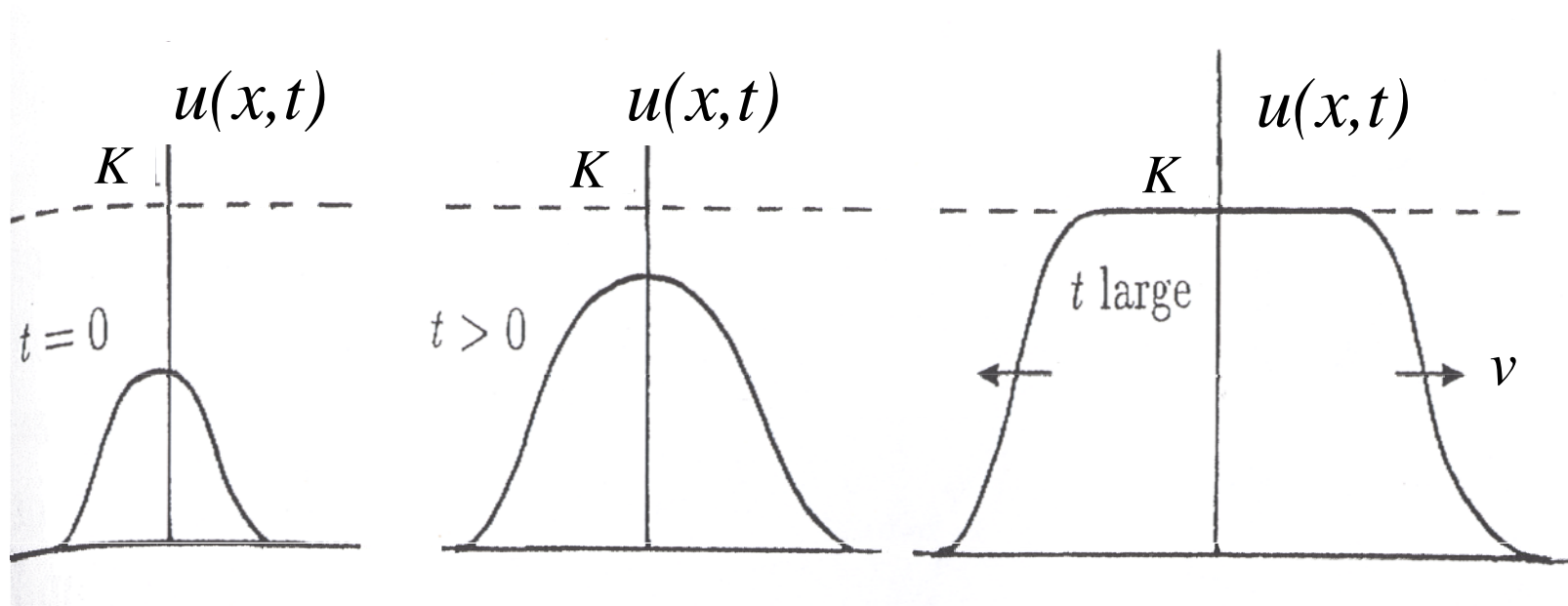
D = effective viral diffusion constant in bacterial lawn

$a = a(k_1, k_{-1}, k_2, Y)$ = effective phage multiplication rate

What happens with this autocatlytic reaction-diffusion equation???

Fisher Wave of Plaque Growth In One Dimension

$$\frac{\partial}{\partial t} u(x,t) = D \frac{\partial^2}{\partial x^2} u(x,t) + au(x,t)[1 - u(x,t)/K]; \quad \text{let } u(x,t) = f(x - vt)$$



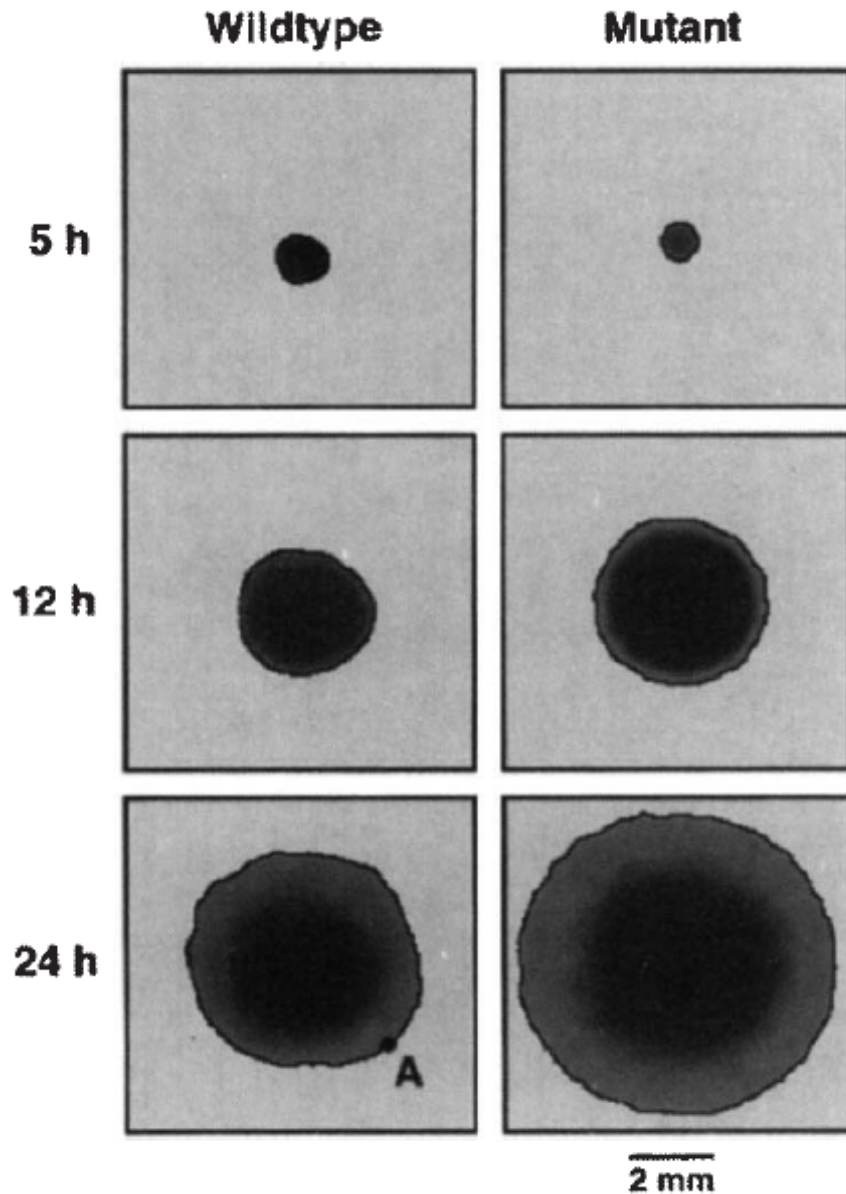
Schematic time development of a wavefront solution of Fisher's equation on the infinite line. (J.D. Murray, Mathematical Biology)

Interface velocity $v = 2\sqrt{Da}$

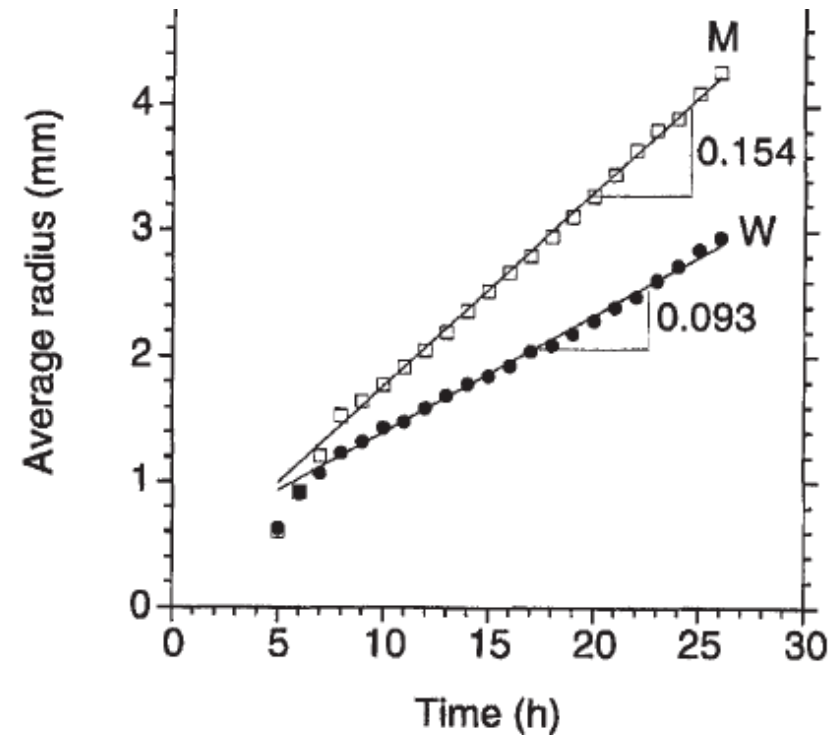
Interface width = $\sqrt{D/a}$

Front velocity of an T7 plaque invading a bacterial lawn

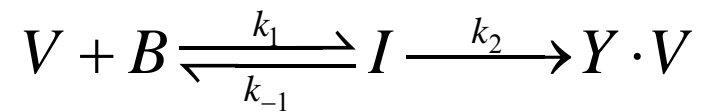
Y. Lee and J. Yin, Nat. Biotech. 14, 491 (1996).



Mutant isolated from stab taken at point A of the wild type descendants

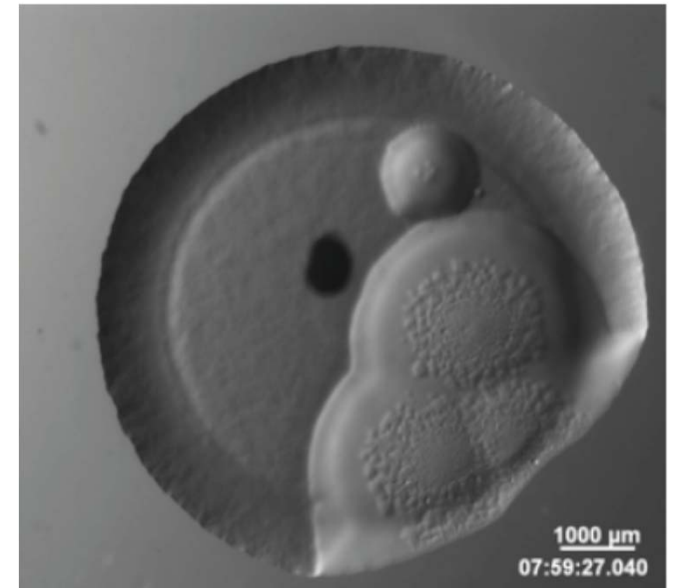


J. Yin and J. S. McCaskill, Biophys. J. 61, 1540 (1992).



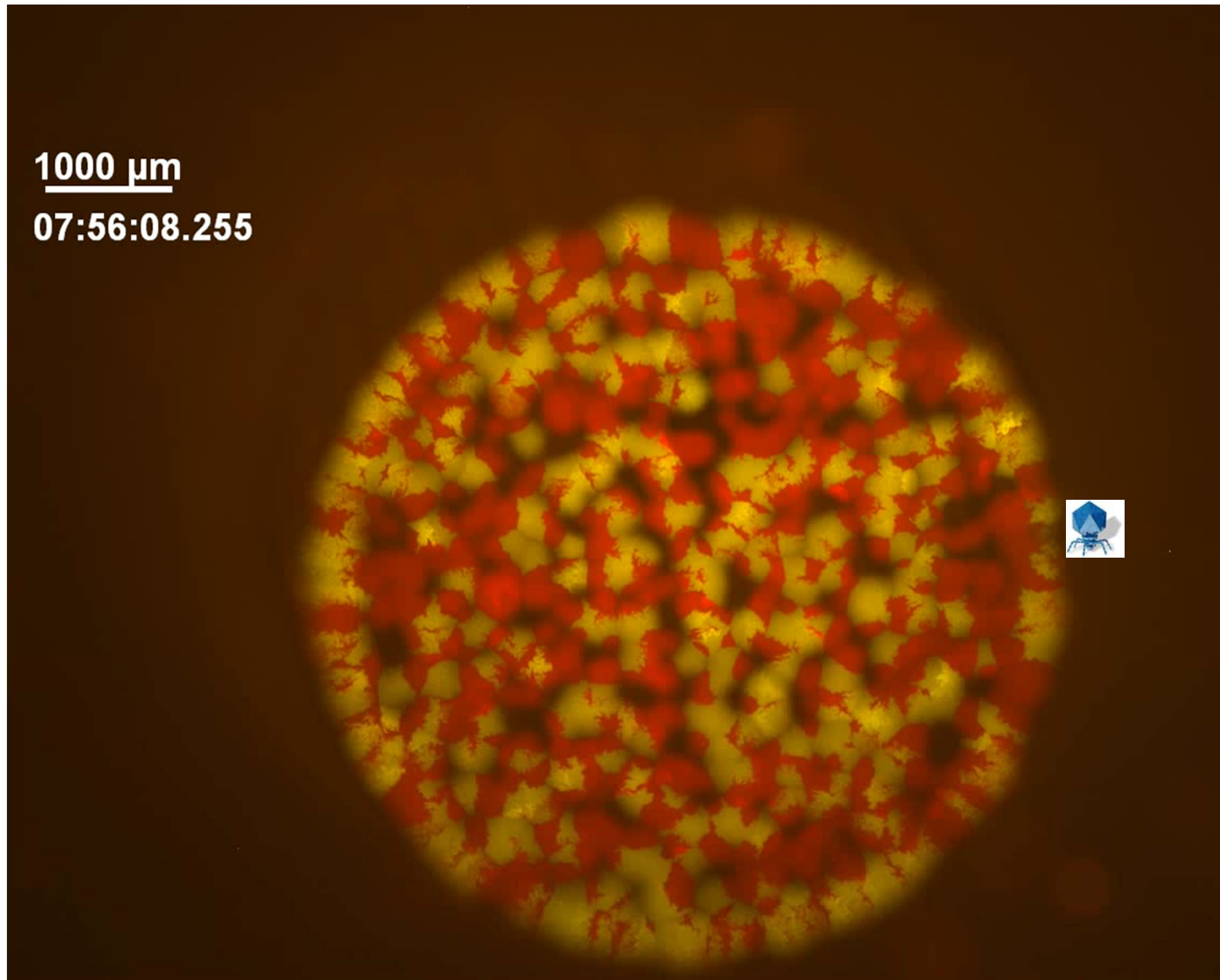
Infection resembles a Fisher population wave...

“Refraction” of a T7 population wave....

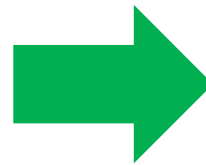
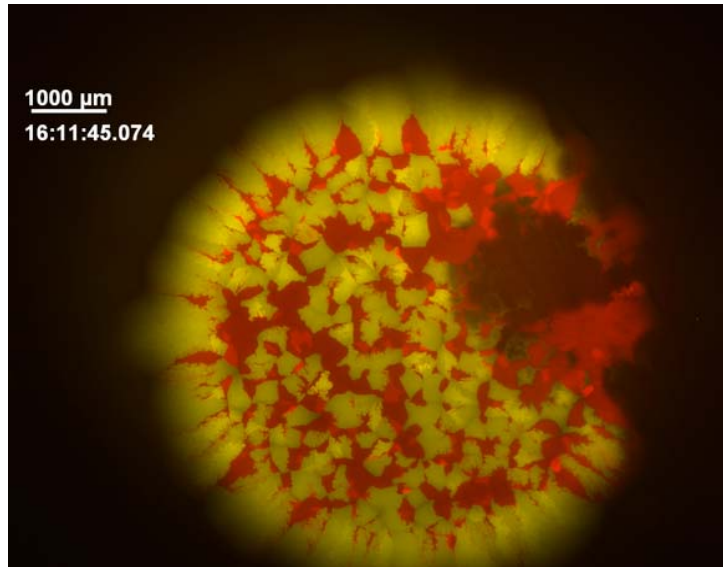


Spread of a T7 epidemic through the homeland

 = T7-susceptible E. coli  = T7-resistant E. coli



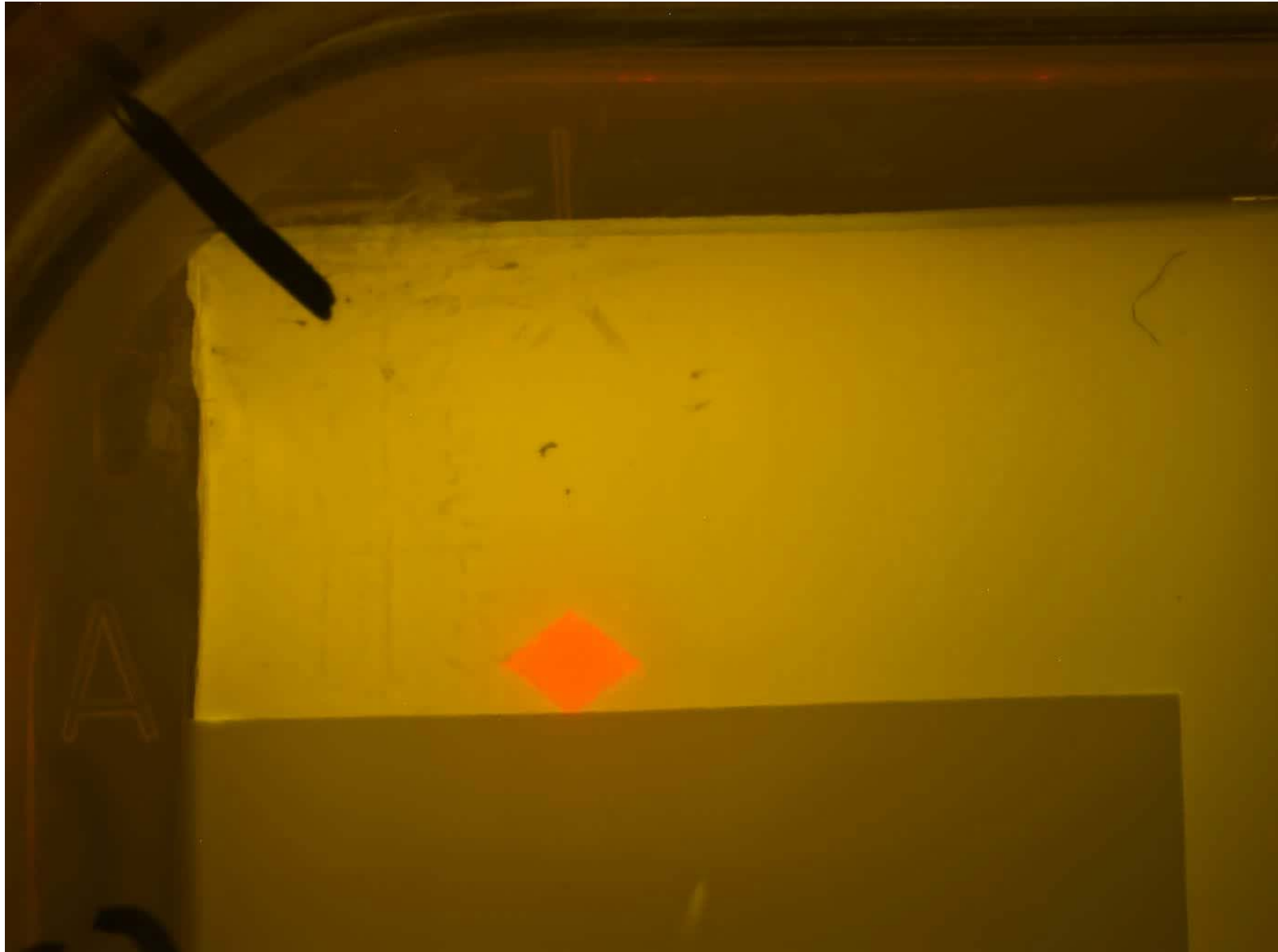
Simplify by focusing on a few well defined obstacles...



Wolfram's ink jet printer: (see also:
Leibler Lab, PLoS 1, (2007))

*Simplified problem: population dynamics around
well-defined obstacles = “lakes”*

plaque growth experiment



Christiaan Huygens (1629-1695)



Dutch mathematician, physicist and astronomer who formulated the wave theory of light. (also, pendulum clock, centrifugal force, the rings of Saturn .



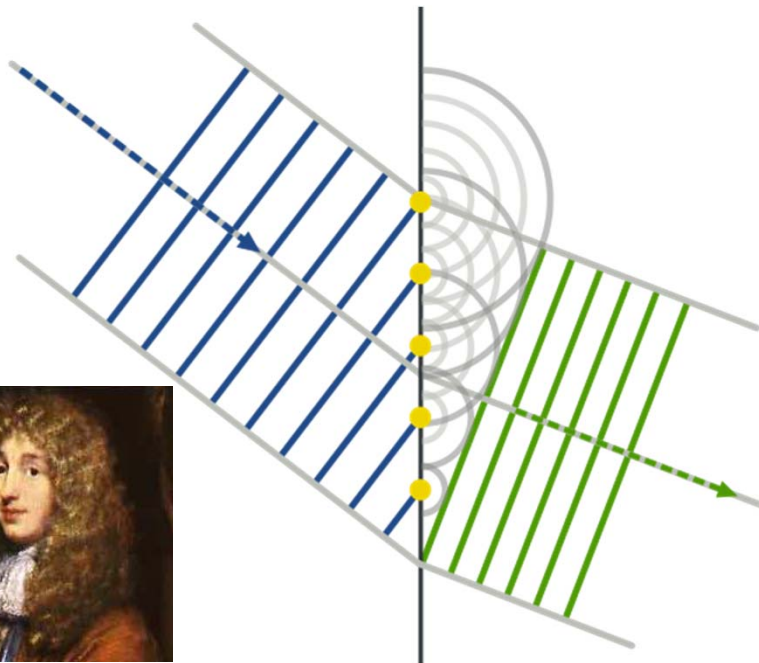
Pierre de Fermat (1601-1665)



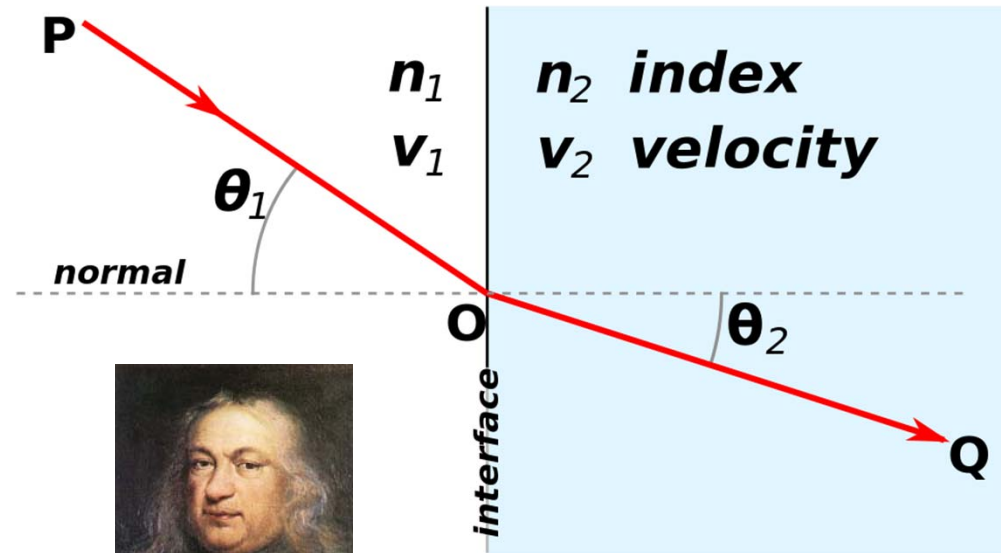
French lawyer at the Parlement of Toulouse, and amateur mathematician contributing to early developments leading to infinitesimal calculus.



Huygens' Principle



Fermat's Principle of Least Time



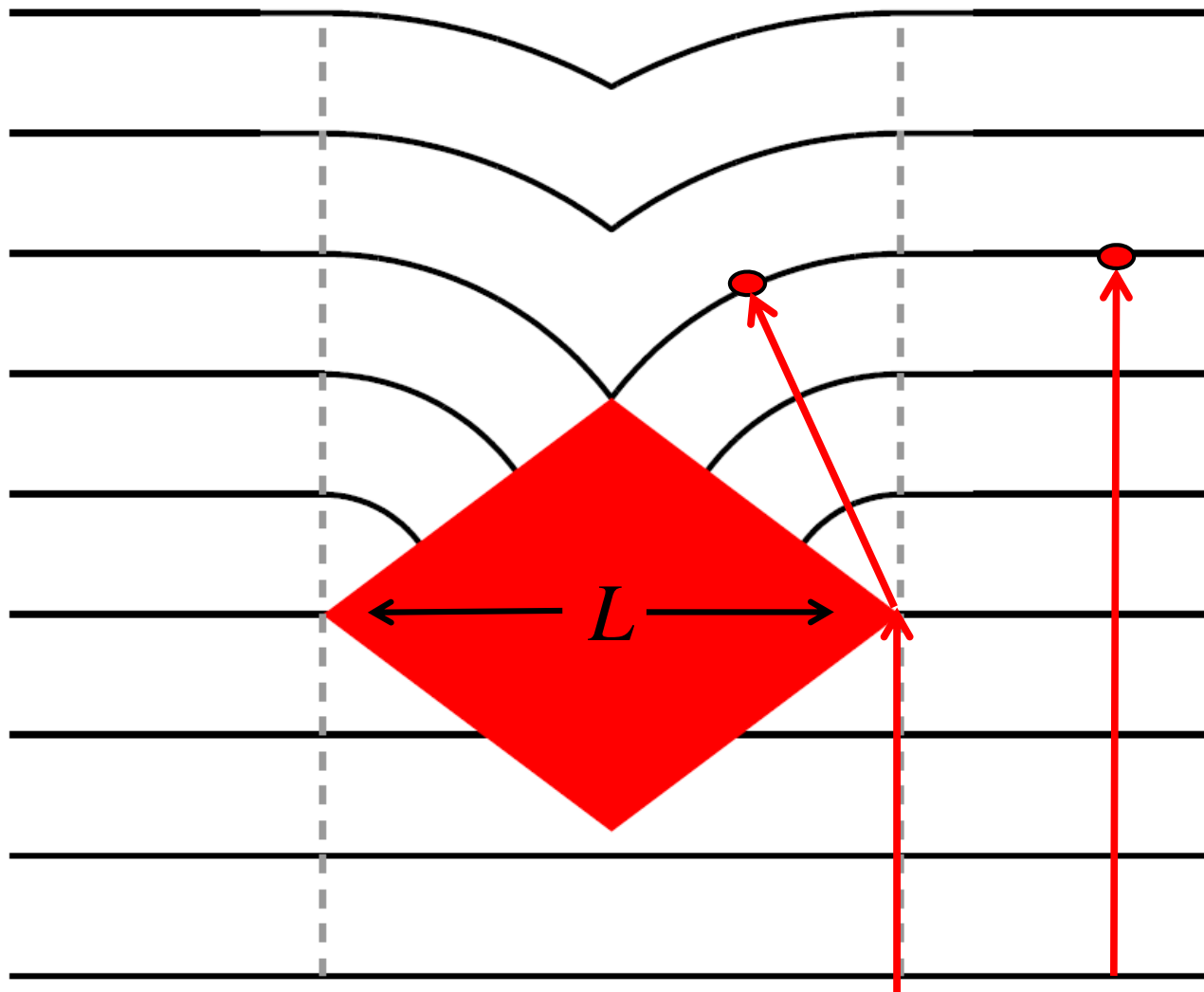
minimize over paths $\vec{r}(s)$, $s =$ arclength

$$T[\{\vec{r}(s)\}] = \int_A^B dt = \int_A^B \frac{dr(s)}{v[\vec{r}(s)]} = \int_A^B \frac{\vec{t}(s)}{v[\vec{r}(s)]} \cdot \frac{d\vec{r}(s)}{ds} ds,$$

$$\vec{t}(s) = \frac{d\vec{r}(s)}{ds} \rightarrow \frac{d}{ds} \left[\frac{1}{v[\vec{r}(s)]} \frac{d\vec{r}}{ds} \right] = 0$$

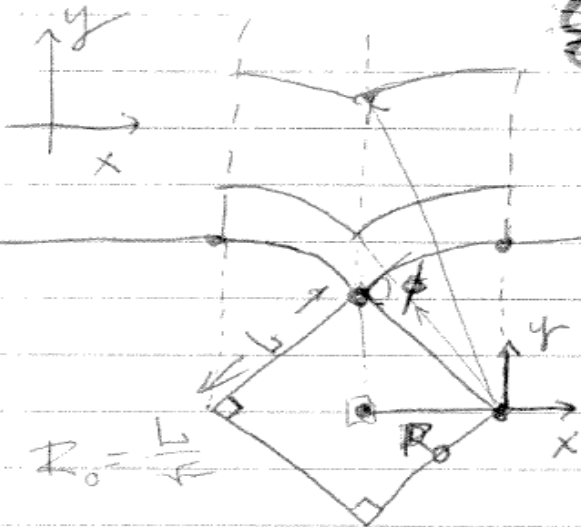
Fermat's principle for viral plaques [require $L \gg \text{sqrt}(D_{\text{eff}}/a_{\text{eff}})$]

- *At a given point on the frontier, ask “where did you ancestors come from?”*
- *Resulting principle of least time equivalent to “survival of the fastest”*



ENVELOPEMENT OF OBSTACLES IN RANGE EXPANSIONS

DIAMOND-SHAPED OBSTACLE



$$(x - R_0)^2 + y^2 = (\sqrt{2}R_0 + vt)^2$$

$$2 dx(x - R_0) + 2 dy y = 0$$

$$\Rightarrow \frac{dy}{dx} = -\frac{(x - R_0)}{y} = \tan \phi$$

$$\tan \phi = \left. \frac{dy}{dx} \right|_{x=0} = \frac{R_0}{y}, \text{ but } y = \sqrt{(\sqrt{2}R_0 + vt)^2 - R_0^2}$$

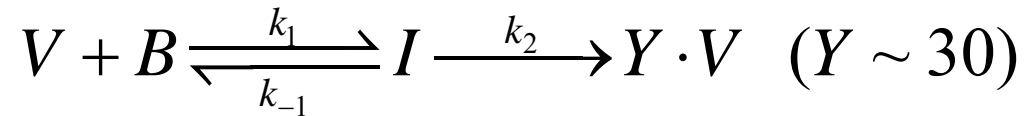
$$\tan \phi = \frac{L/\sqrt{2}}{\sqrt{\frac{R_0^2}{2} + 2Lvt + v^2 t^2}} = \frac{L/\sqrt{2}}{\sqrt{R_0^2 + 2\sqrt{2}R_0vt + v^2 t^2}}$$

OR

$$\tan \phi = \frac{L}{\sqrt{L^2 + 4Lvt + 2v^2 t^2}}$$

Thus as $t \rightarrow \infty$ $\phi(t) \sim \frac{1}{2vt}$

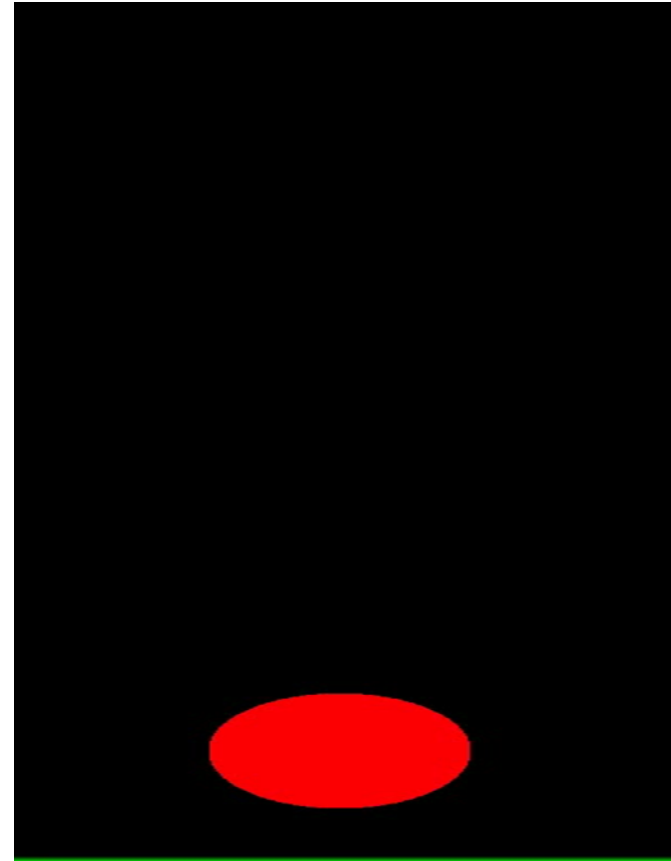
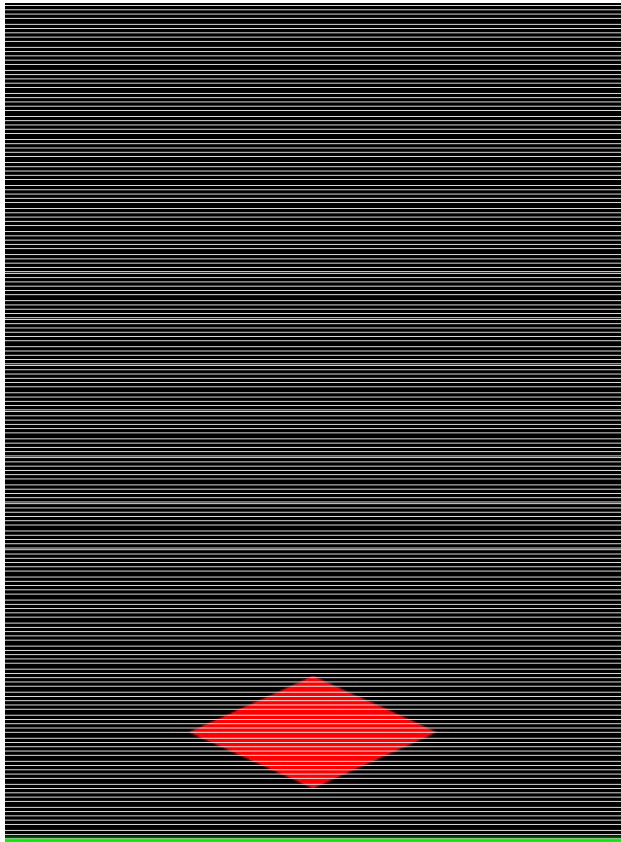
Simulations: T7 population dynamics around obstacles



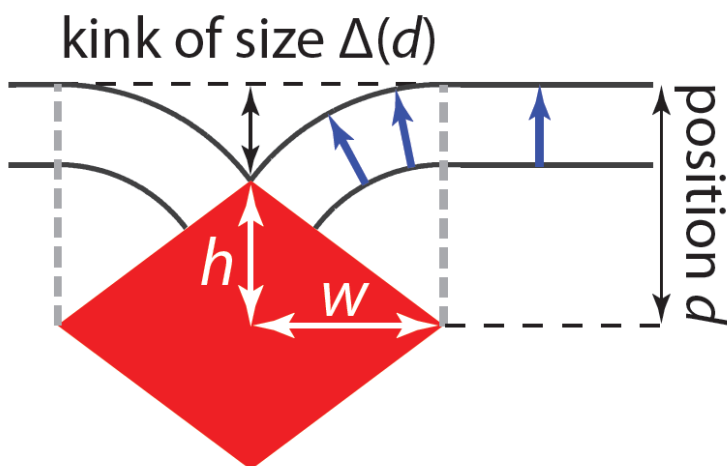
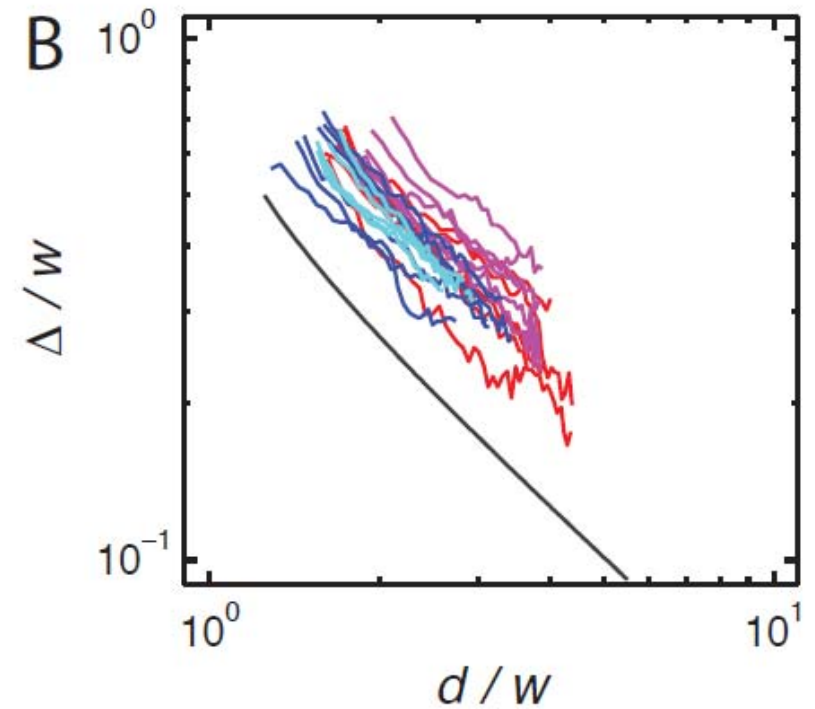
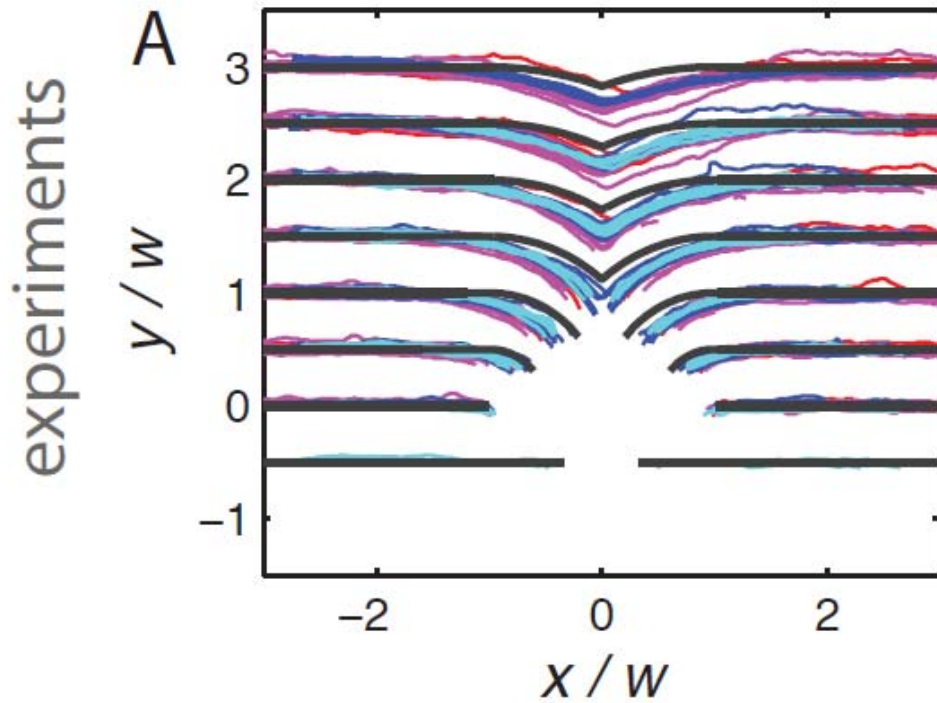
$u(\vec{r}, t)$ = phage density on plate

$$\frac{\partial u(\vec{r}, t)}{\partial t} = D\nabla^2 u(\vec{r}, t) + a(\vec{r})u(\vec{r}, t)[1 - u(\vec{r}, t) / K]$$

$a(\vec{r}) = 0$ inside obstacles

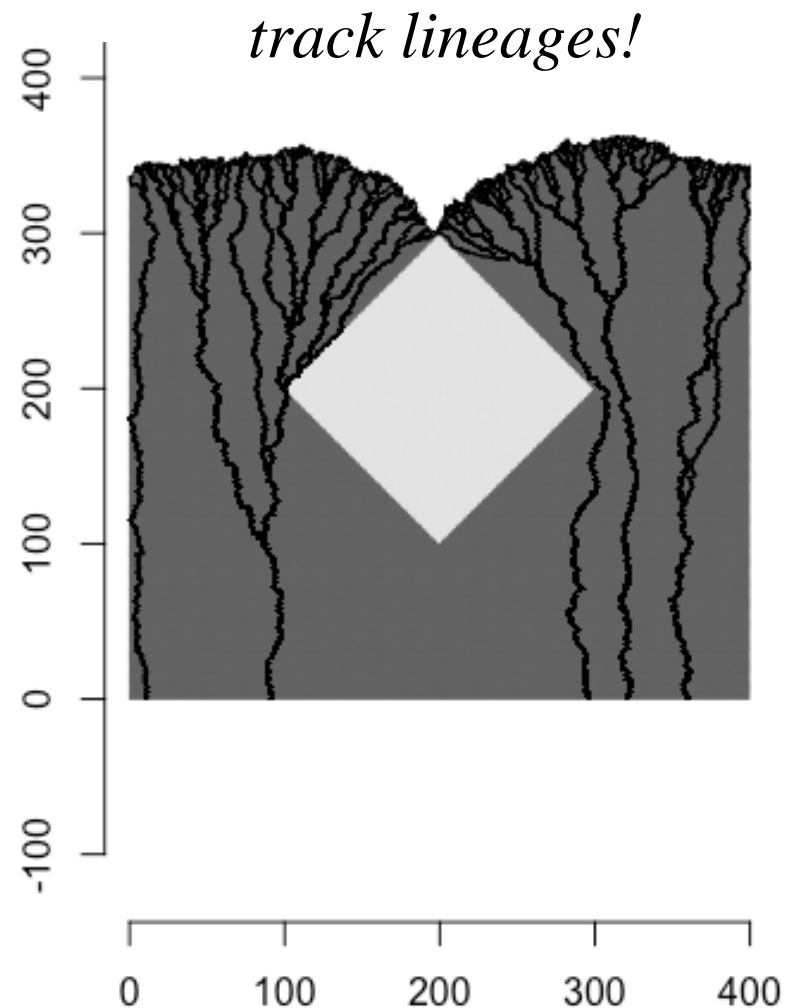
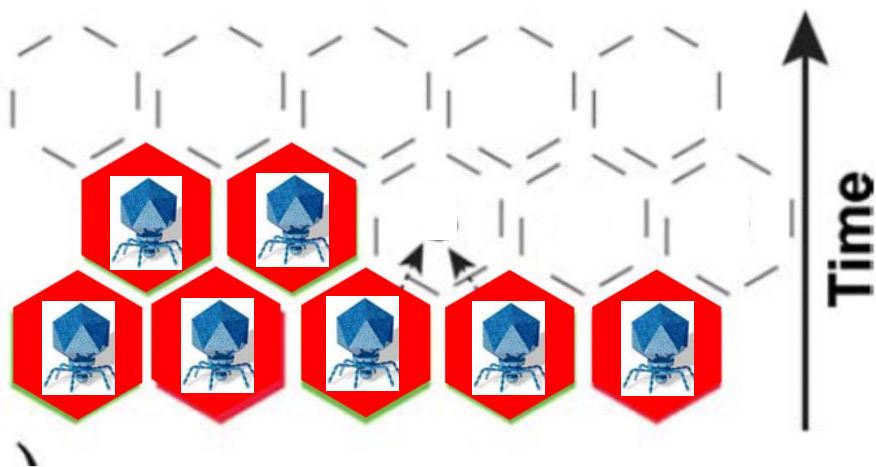


Cusps heal according to $\Delta \sim 1/d$,
independent of the width of the obstacle



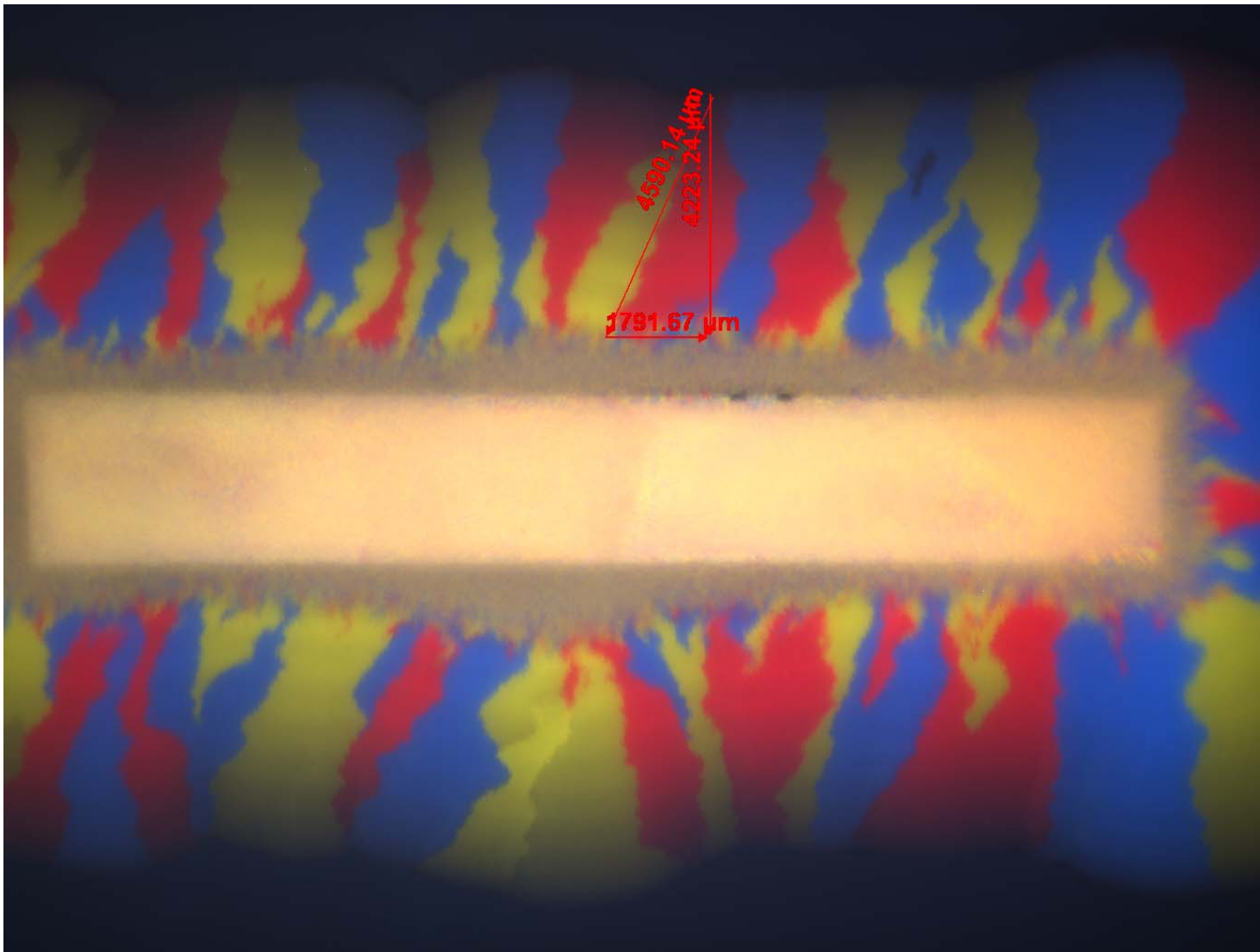
however...

*Huygens-Fermat principle neglects
discreteness of viruses and cells...*



*It's only a good first approximation,
like ray optics, which neglects
photons and the wave nature of light!*

Population genetics and range expansions (note genetic drift!)



Wandering of genetic boundaries during range expansions given by a “wall diffusion constant”.

$$D_w \approx a^2/\tau_g$$

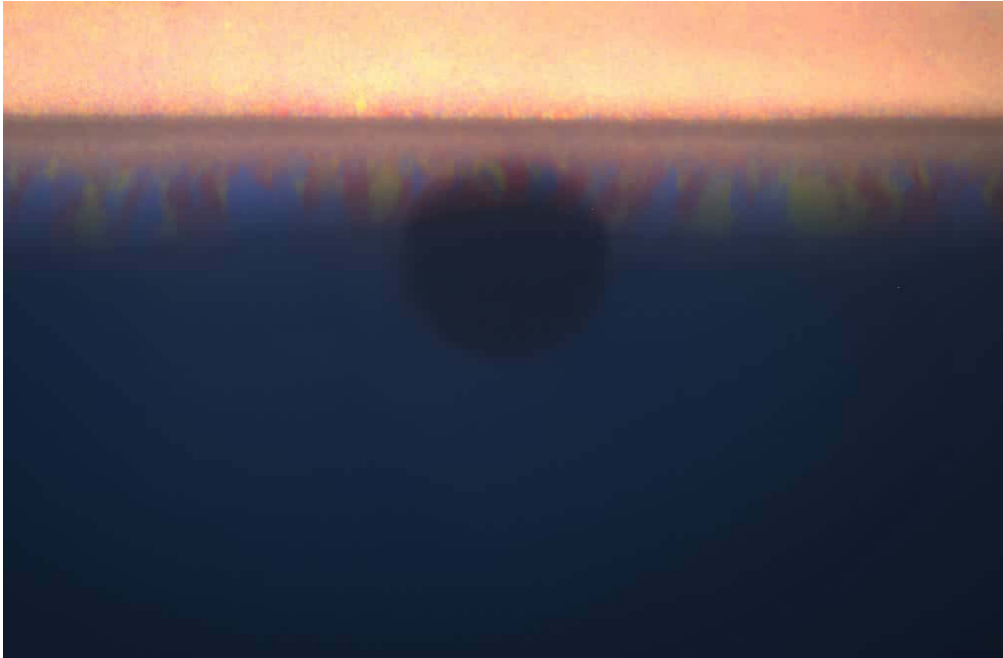
a = cell size

τ_g = division time

What happens if we add an obstacle????

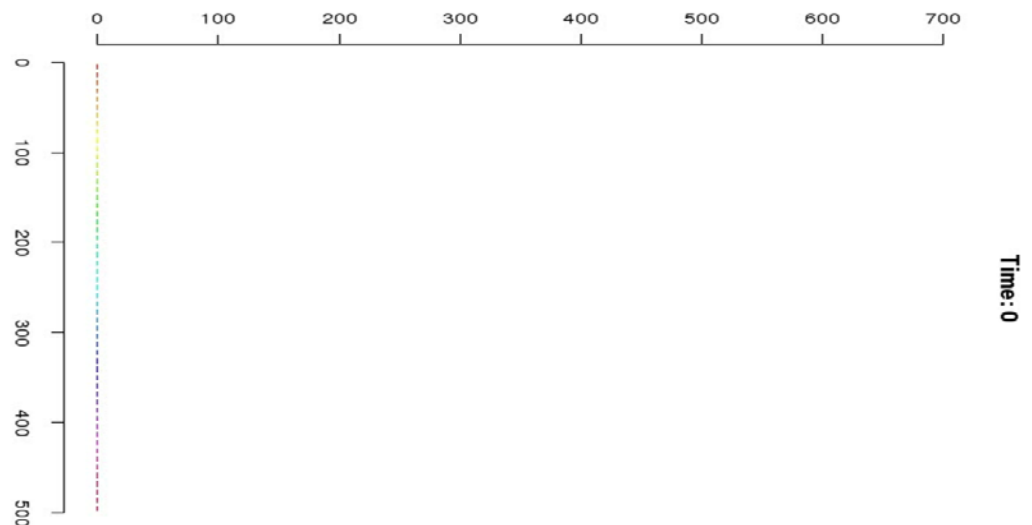
Population genetics near obstacles:

E. coli colonies obstructed by a disk impermeable to nutrients

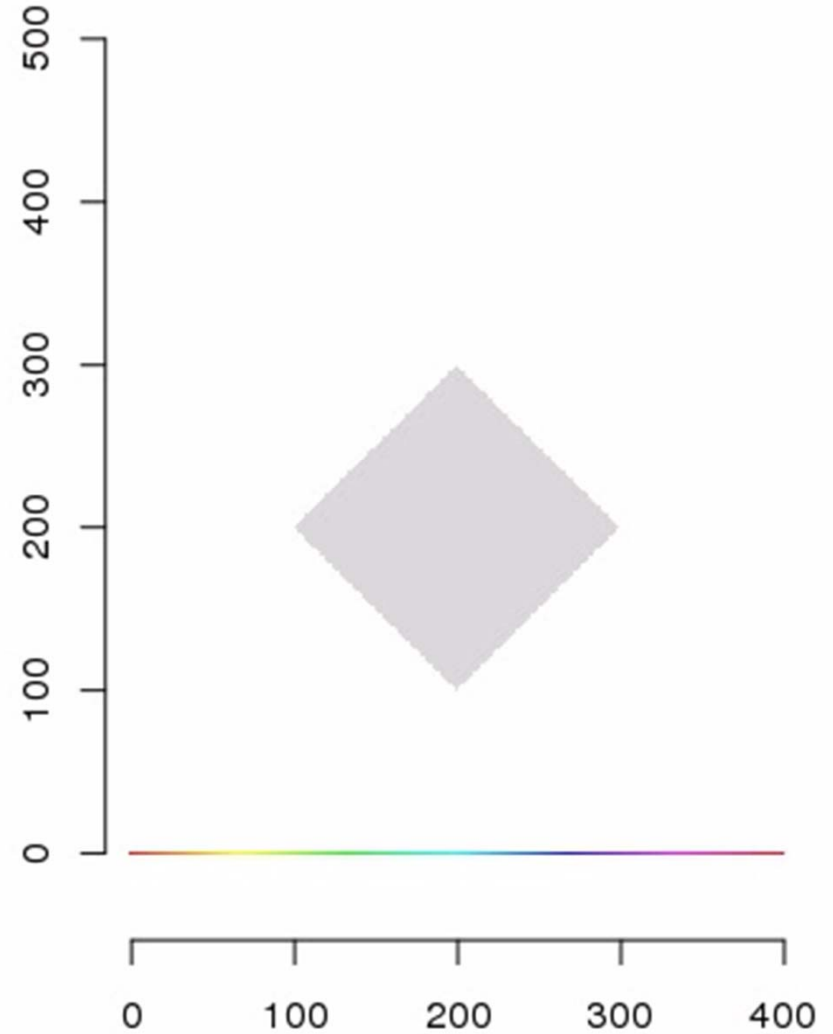
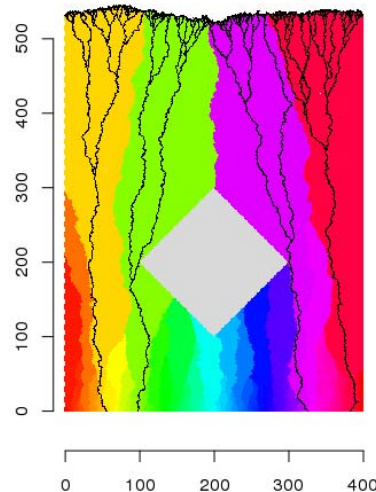
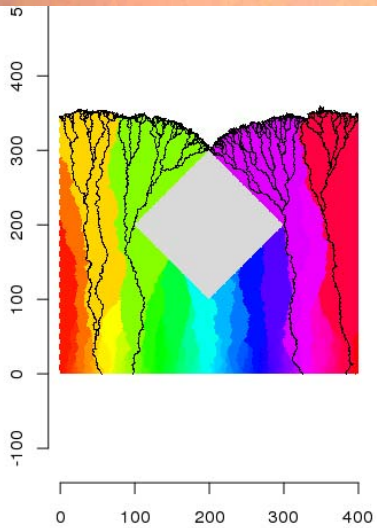
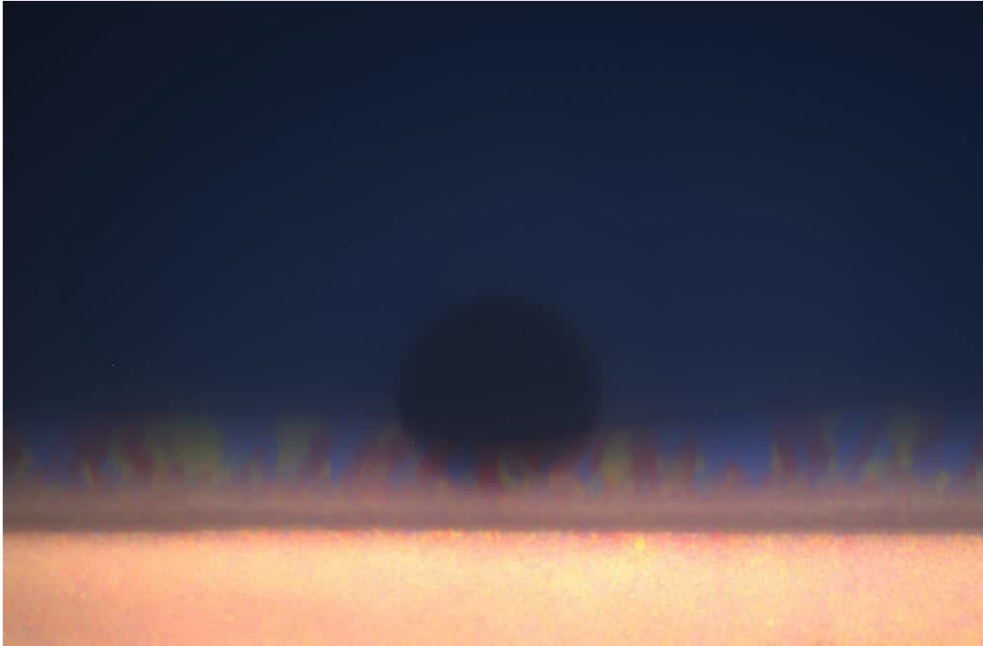


Simulation of an
“infinite color” model

“selection by geometry”



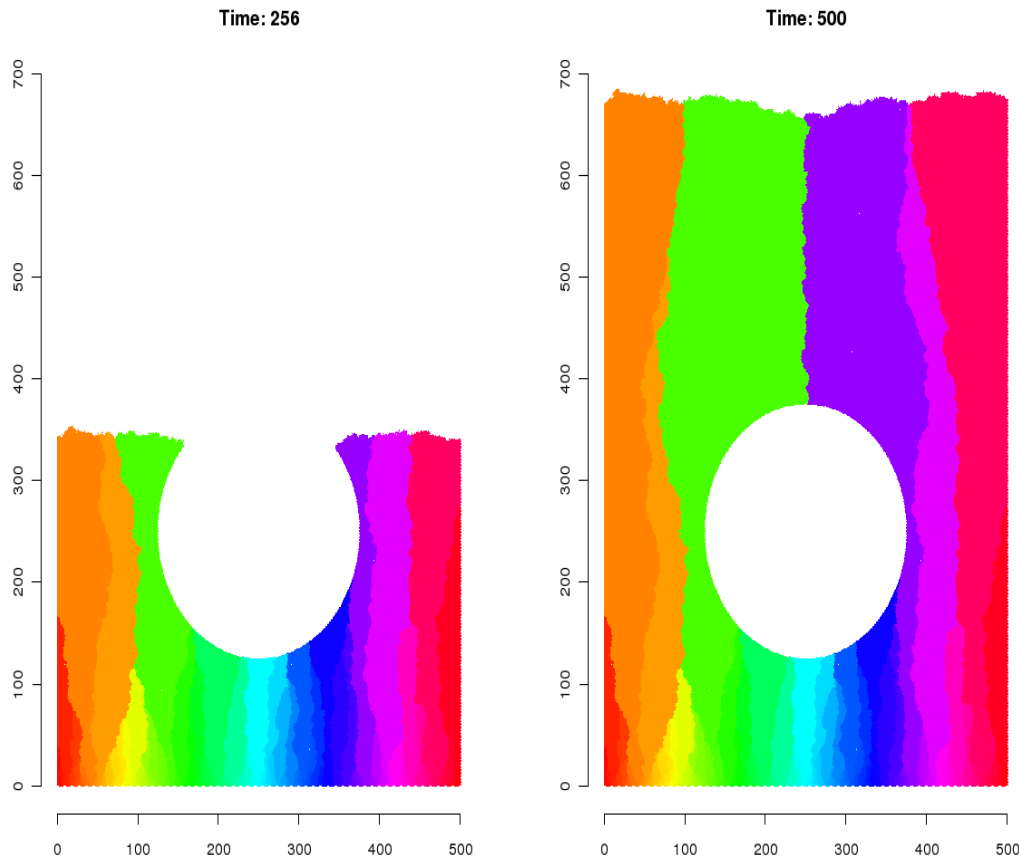
Coalescent lineages for range expansions around a “lake” (Wolfram Moebius ...)



simulation ↔ Huygens principle ↔ bacterial growth experiment

Population genetics of fronts impinging on obstacles

- *Obstacles impress long-lived characteristic footprints on allele frequency patterns at population frontiers.*
- *Populations migrating through inhomogenous media above the percolation threshold will be described by an index of refraction*



- obstacles reduce genetic diversity ('unlucky genotypes')
- obstacles putatively boost genotypes ('lucky genotypes')
- cusps behind obstacles eventually heal, but sector boundaries caused by obstacles can persist indefinitely
- "Selection by Geometry"

Genetically structured vs. spatially structured populations

T7 “out of Africa”: can print bacterial lawns for T7 in arbitrary patterns.... Wolfram Moebius, unpublished



■ = T7-susceptible E. coli ■ = T7-resistant E. coli



*Wolfram
Moebius*

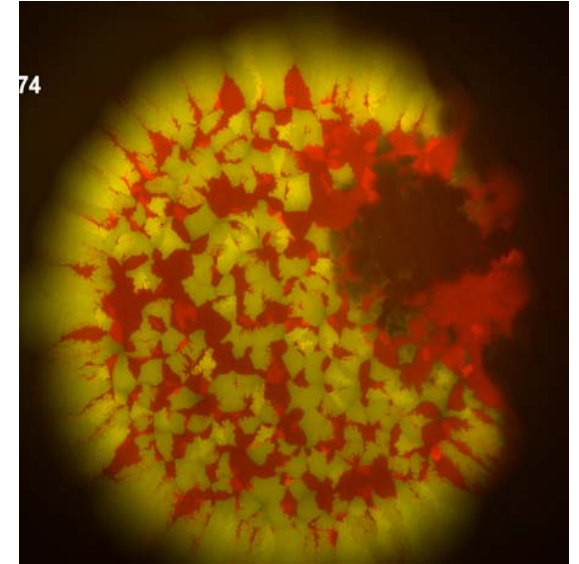
Range Expansions in Structured Environments

Frontier population genetics with spatial structure

--Range expansions are very common in biology...
Number fluctuations very large at the edge of a population wave

-- our world is not a sphere of agar → geographical features influence ecosystems and range expansions

→ How does a range expansion in a non-homogeneous environment shape genetic diversity?



Wolfram Moebius
Andrew Murray

Simplified model of spatial structure: migration around a “lake”

-- population fronts around obstacles: simulations, experiments, and geometrical arguments

---adding population genetics: simulation and an experiment with *E. coli*



Wolfram



Andrew

Genetically structured vs. spatially structured populations

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