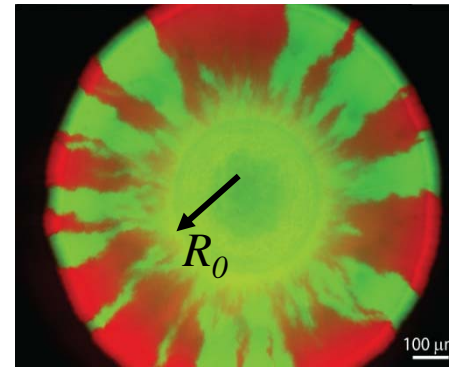


The Physics of Life: Spatial Population Genetics

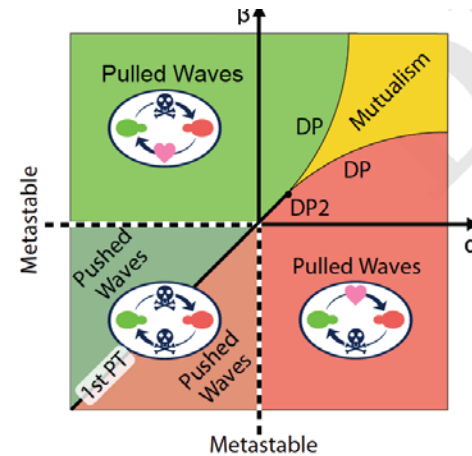
I. Introduction to spatial population genetics

II. Pushed genetic waves and antagonistic interactions

III. Microbial interactions and expansions on liquid substrates



P. Aeruginosa
(*J. Xavier et al.*)



Game theory:
(*E. Frey et al.*)



S. cerevisiae
(*S. Atis et al.*)

I. Introduction to spatial population genetics



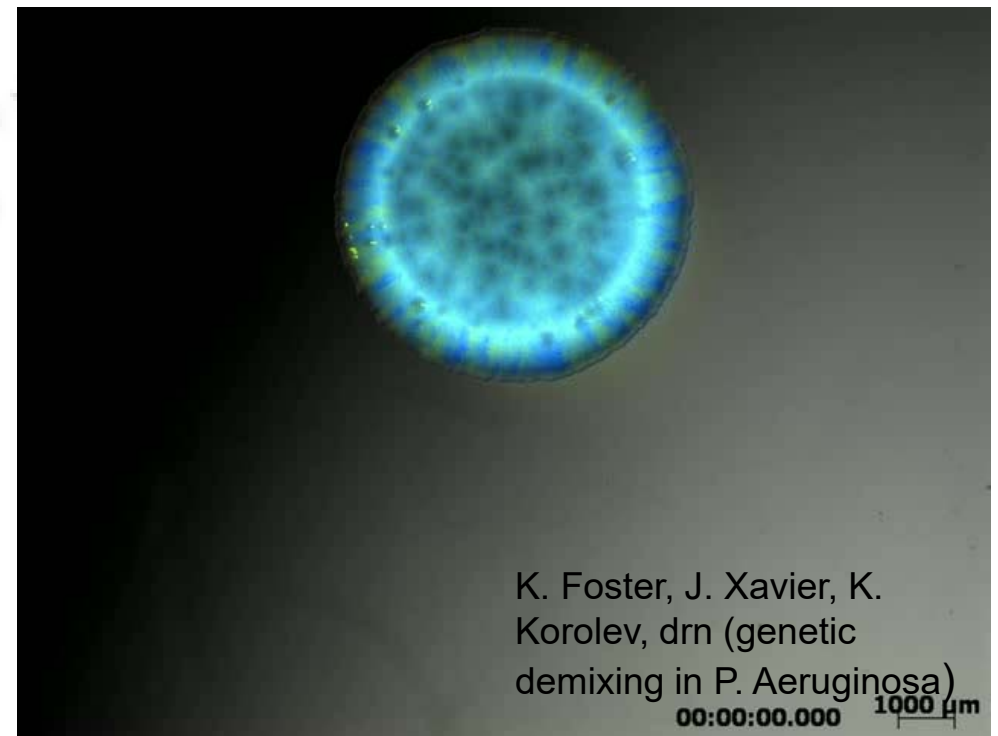
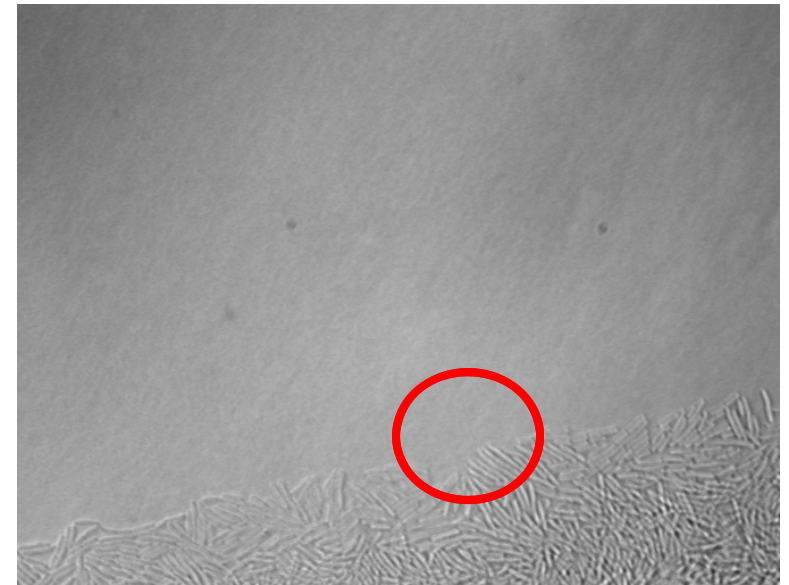
*Humans out of Africa;
in 500 generations...*

Large mammals expand over $\sim 10^4$ km

Bacteria (in a Petri dish) expand ~ 1 cm

K. Korolev et al., Reviews of Modern Physics 82, 1691 (2010)

Oskar Hallatschek & drn, (E. coli)

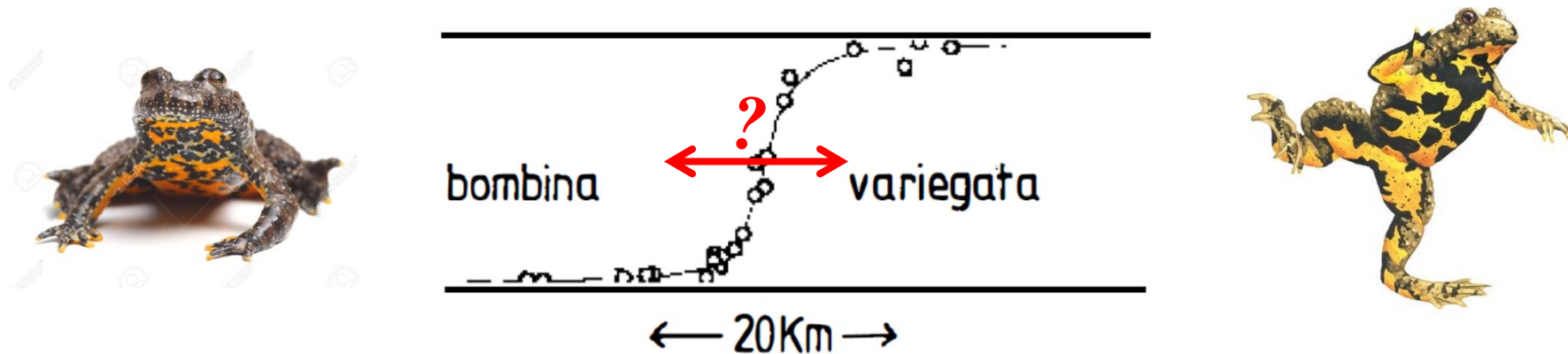


K. Foster, J. Xavier, K. Korolev, drn (genetic demixing in *P. Aeruginosa*)

II. Pushed genetic waves and antagonistic interactions: Hybrid zones

N. H. Barton & G. M. Hewitt Ann. Rev. Ecol. & Sys. **16**, 113 (1985)

- Hybrid zones are narrow regions in which genetically distinct populations meet, mate and produce hybrids. Hundreds of examples known. (e.g., the grasshopper *Podisma pedestris*, the butterfly *Heliconis*.) Hybrid zones can be a few hundred meters thick and hundreds of kilometers long



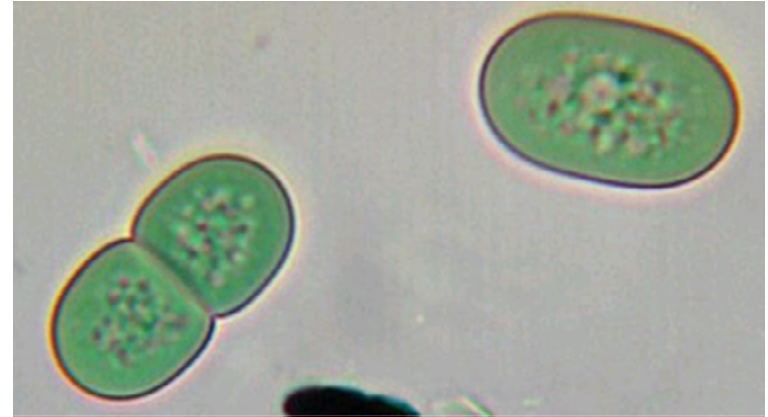
Inferred profile from electrophoretic variations across the hybrid zone of the toads *Bombina bombina* and *Bombina variegata* near Cracow, Poland

- Which way the interface moves depends on more than just the selective advantage – for example, recombination near the interface can break up favorable clusters of genes.
- In some cases, boundaries can exhibit a kind of surface tension, as well as a pressure to advance in a particular direction. This may promote sympatric speciation

III. Microbial interactions and expansions on liquid substrates

... life probably evolved first in a *liquid* environment

- *~2-3 billion years ago, water covered most of the earth*
- *Fossilized, oxygen-producing cyanobacteria have been dated at ~2 billion years ago.*
- *Oxygenic cyanobacteria transformed the atmosphere via photosynthesis*
- *Spatial growth and evolutionary competition took place in liquid environments at both high low Reynolds numbers*
- *These photosynthetic organisms may control their height to resist down welling currents and stay close to the ocean surface.*



Cyanobacterium *Synechococcus*

www.dr-ralf-wagner.de/Blualgen-englisch.htm



*Bloom of cyanobacteria
in Lake Atitlán, Guatemala
NASA Earth observatory*

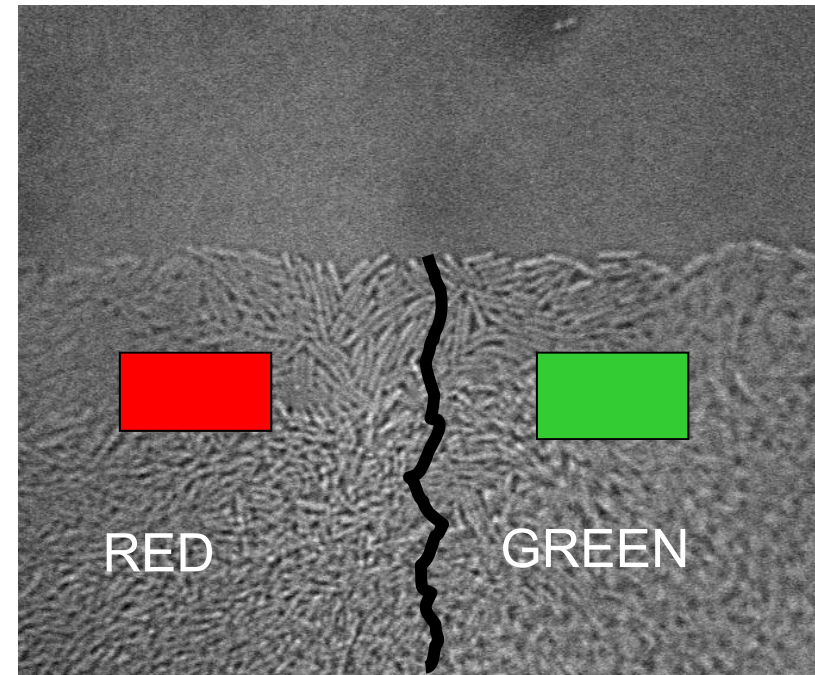
Range Expansions with Competition or Cooperation



In 500 generations....

Large mammals expand over $\sim 10^4$ km

Bacteria (in a Petri dish) expand ~ 1 cm



Red and Green Strains....

- 1. Could be neutral....*
- 2. Could have different doubling times*
- 3. One or both could secrete toxins that impede the other...*
- 4. One or both could secrete amino acids useful to the other:
mutualism*

Gene Surfing and Survival of the Luckiest

Mutations and competition in a spreading population

*FAS Center for Systems
Biology*

*Lots of help in the lab from
Pascal Hersen and
Sharad Ramanathan*



Oskar Hallatschek



Kirill Korolev



vs.



Gene Surfing and Survival of the Luckiest

Mutations and competition in a spreading population



Successful....

*Surfing on the Einsbach,
Englischer Garten, Munich...*



Unsuccessful....

Fisher Waves and Population Dynamics

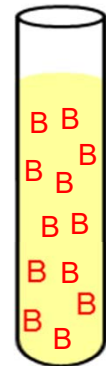
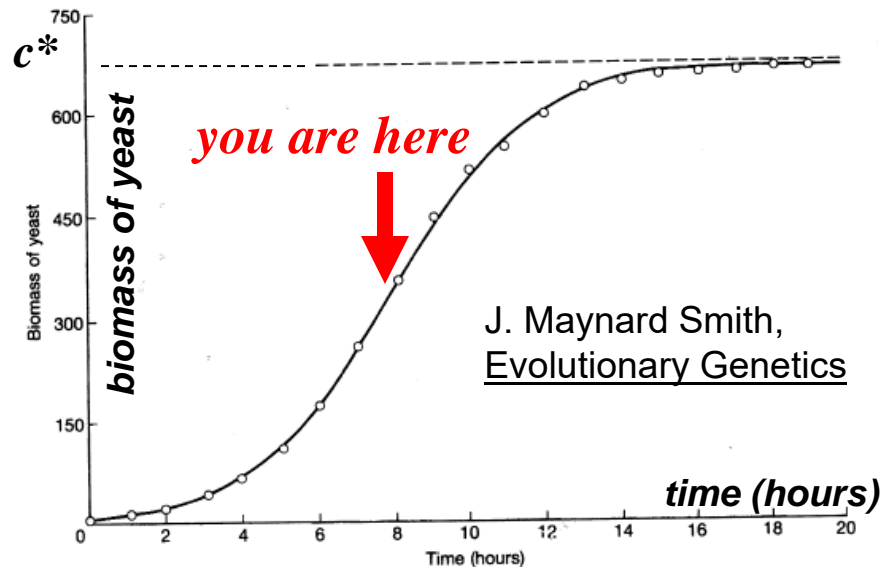
$c(t)$ = population of species at time t in region Ω

$$\frac{dc(t)}{dt} = \text{births} - \text{deaths} + \text{saturation} + \text{migration}$$

1798 T.R. Malthus $\frac{dc(t)}{dt} = ac(t), a > 0$

1836 P.F. Verhulst $\frac{dc(t)}{dt} = ac(t) - bc^2(t)$ $c(t) = \frac{c(0)e^{at}}{1 + (c(0)b/a)(e^{at} - 1)}$

stable
population
size: $c^* = a/b$



1937 R.A. Fisher,
Kolmogorov et al.

$$c = c(\vec{r}, t) \quad \frac{\partial c(\vec{r}, t)}{\partial t} = D\nabla^2 c(\vec{r}, t) + ac(\vec{r}, t) - bc^2(\vec{r}, t)$$

Wave Solutions to the Fisher-Kolmogorov et al. Equation

in one-dimension...

$$\frac{\partial c(x,t)}{\partial t} = D \frac{\partial^2 c(x,t)}{\partial x^2} + a c(x,t) - b c^2(x,t)$$

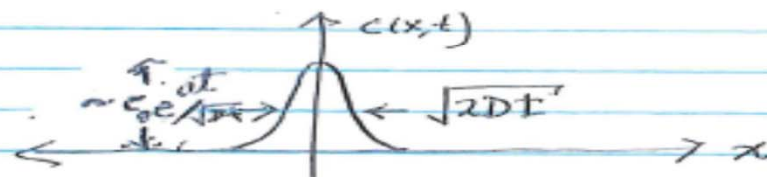
* If $c(x,0)$ is small ($c(x,0) \ll c^* = a/b$), then early time behavior is given by the solution of the linear equation

$$\frac{\partial c}{\partial t} = D \frac{\partial^2 c}{\partial x^2} + a c$$

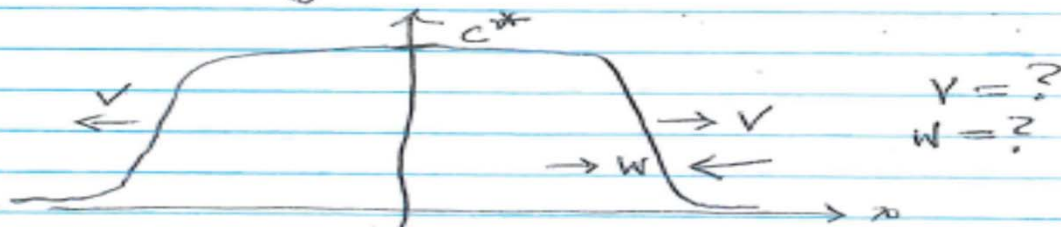
Namely,

$$c(x,t) = c_0 e^{at} \frac{1}{\sqrt{4\pi Dt}} e^{-\frac{x^2}{4Dt}}$$

$\Rightarrow c(x,t)$ spreads out diffusively, but grows up exponentially as well... $\int c(x,t) dx \sim c_0 e^{at}$

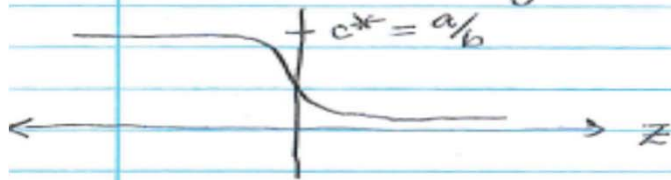


* but eventually $c(x,t) \approx c^*$ & new behavior arises



* Dynamical Systems approach . . .

Look for solutions of \otimes that interpolate from $c = c^* = \frac{a}{b}$ to $c = 0$ in the form of a wave moving from left to right . . .



$$c(x,t) = f(x-vt) = f(z)$$

$$\lim_{z \rightarrow -\infty} f(z) = \frac{a}{b}$$

$$\lim_{z \rightarrow \infty} f(z) = 0$$

$$\Rightarrow -v f'(z) = D f''(z) + a f(z) - b f^2(z) \quad \otimes$$

* Regard z as a time-like variable & define a "momentum" variable $g(z) = \frac{df}{dz}$

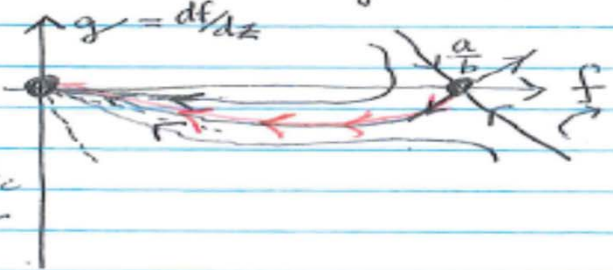
Then \otimes can be written as two ordinary differential equations

$$\frac{dg(z)}{dz} = -v g(z) - \frac{a}{D} f(z) + \frac{b}{D} f^2(z)$$

$$\frac{df(z)}{dz} = g(z)$$

Fixed points are $(f^*, g^*) = (0, 0)$ & $(f^*, g^*) = (\frac{a}{b}, 0)$

Phase Portrait



* The solution we want is clearly the trajectory connecting the hyperbolic fixed point $(0, \frac{a}{b})$ to the origin!

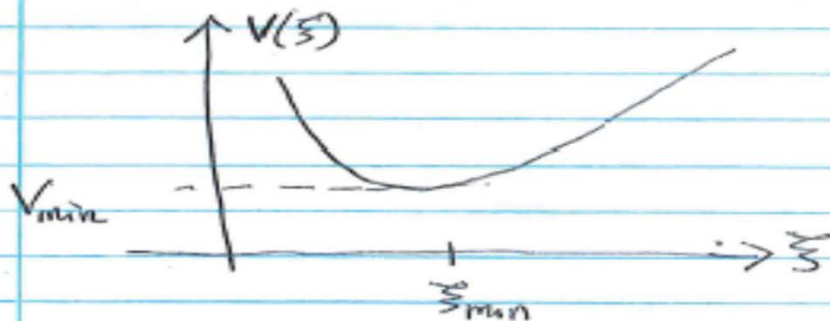
Velocity selection problem

However a solution seems to exist for a range of v 's!

* Can get a bound on v by looking at the (right) foot of the wave & trying to solve the linear equation with

$$c(x,t) \approx c_0 e^{(x-vt)/\xi}$$

$$\Rightarrow \frac{v}{\xi} = \frac{D}{\xi^2} + a \Rightarrow v = \frac{D}{\xi} + a\xi \quad \text{"dispersion relation"}$$



$$\xi_{\min} = \sqrt{\frac{D}{a}}$$
$$v_{\min} = 2\sqrt{Da}$$

* Kolmogorov showed that the asymptotic velocities (moving right & left) for any initial condition with finite support is in fact

$$v = v_{\min} = 2\sqrt{Da}$$

with width $w = \xi_{\min} = \sqrt{\frac{D}{a}}$

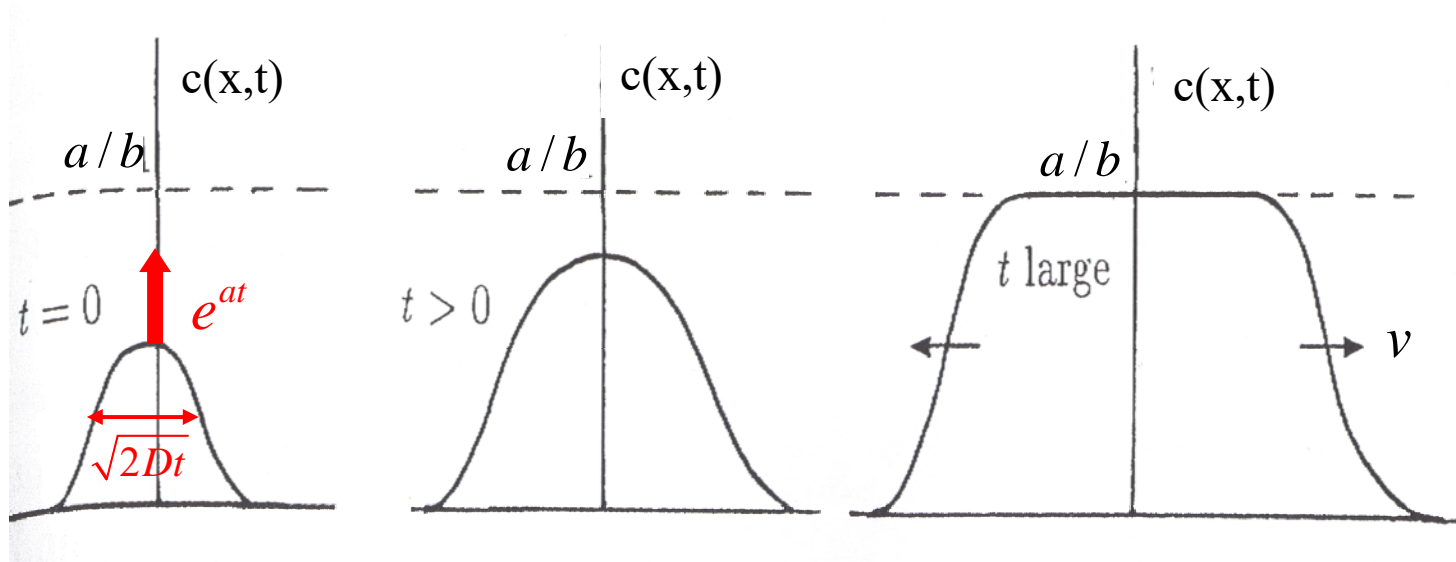
* More generally, velocity depends on the way $f(z)$ behaves as $z \rightarrow \pm\infty$

* Note that two exponential lengths appear for $v > v_{\min}$!

Population & Genetic Waves In One Dimension

(R. A. Fisher, Kolmogorov-Petrovsky-Piscounov, 1937)

$$\frac{\partial}{\partial t} c(x,t) = D \frac{\partial^2}{\partial x^2} c(x,t) + ac(x,t)[1 - bc(x,t)/a]; \quad \text{let } c(x,t) = f(x-vt)$$

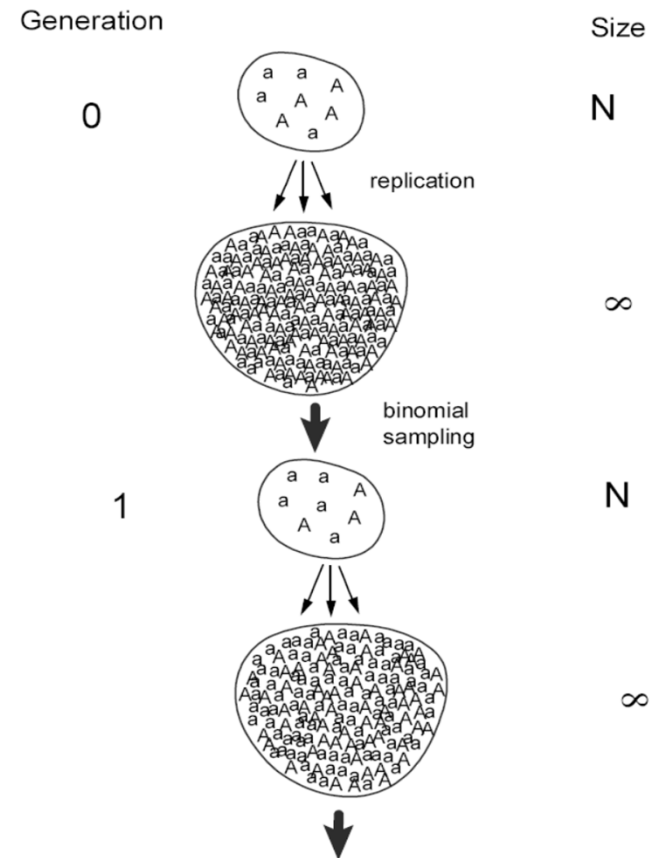
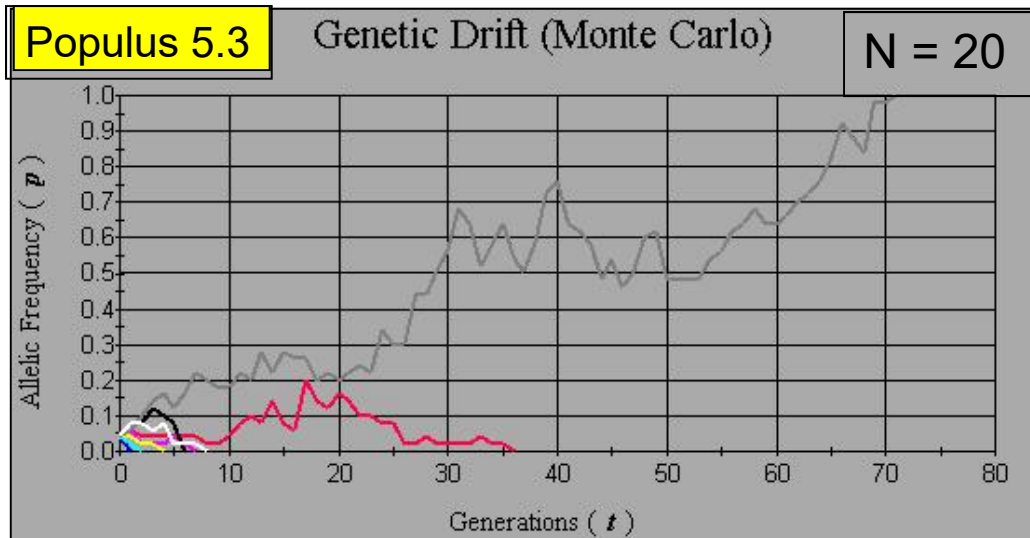


Schematic time development of a wavefront solution of Fisher's equation on the infinite line. (J.D. Murray, Mathematical Biology)

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

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

Genetic drift for a neutral mutation, (M. Kimura)



$u(p,t)$ = probability allele A has frequency p at time t .

Finite populations go to fixation for long times (using, e.g., Fisher-Wright population sampling)

$$\frac{\partial u(p,t)}{\partial t} = \frac{\partial^2 [D_G u(p,t)]}{\partial p^2}$$

$$D_G(p) = p(1-p) / (2N)$$

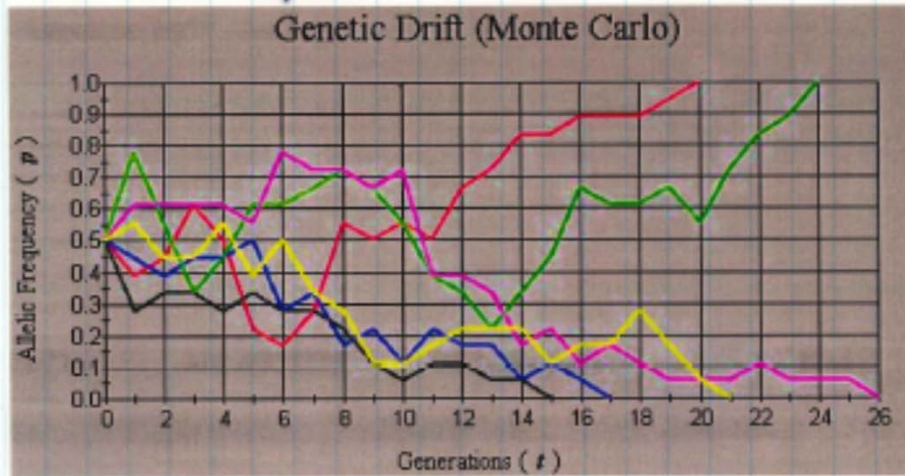


$$\frac{\partial p(t)}{\partial t} = \sqrt{p(t)(1-p(t)) / N} \Gamma(t)$$

$$\langle \Gamma(t)\Gamma(t') \rangle = \delta(t-t') \text{ (Ito calculus)}$$

DIPLOID
Population Size: $N = 10$

INTRO. TO POPULATION GENETICS TH50K!
J. F. Crow & M. Kimura



Allele frequencies diffuse due to genetic drift

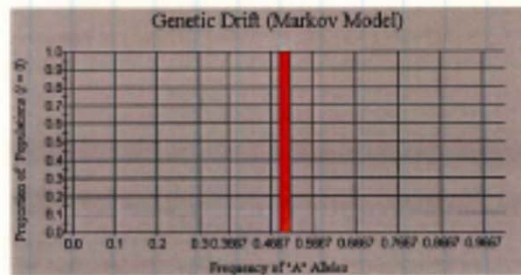
M. Kimura, *Genetics* 47, 713 (1962)

! random walk dynamics of gene frequencies!

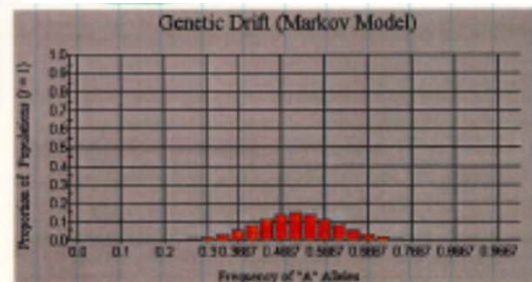
$u(p,t)$ = probability allele A has frequency p at time t .

• Finite populations go to fixation for long times ...

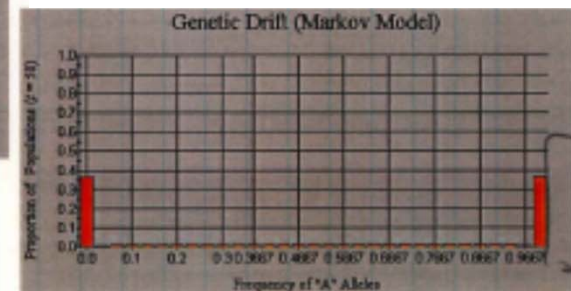
See Populus program...



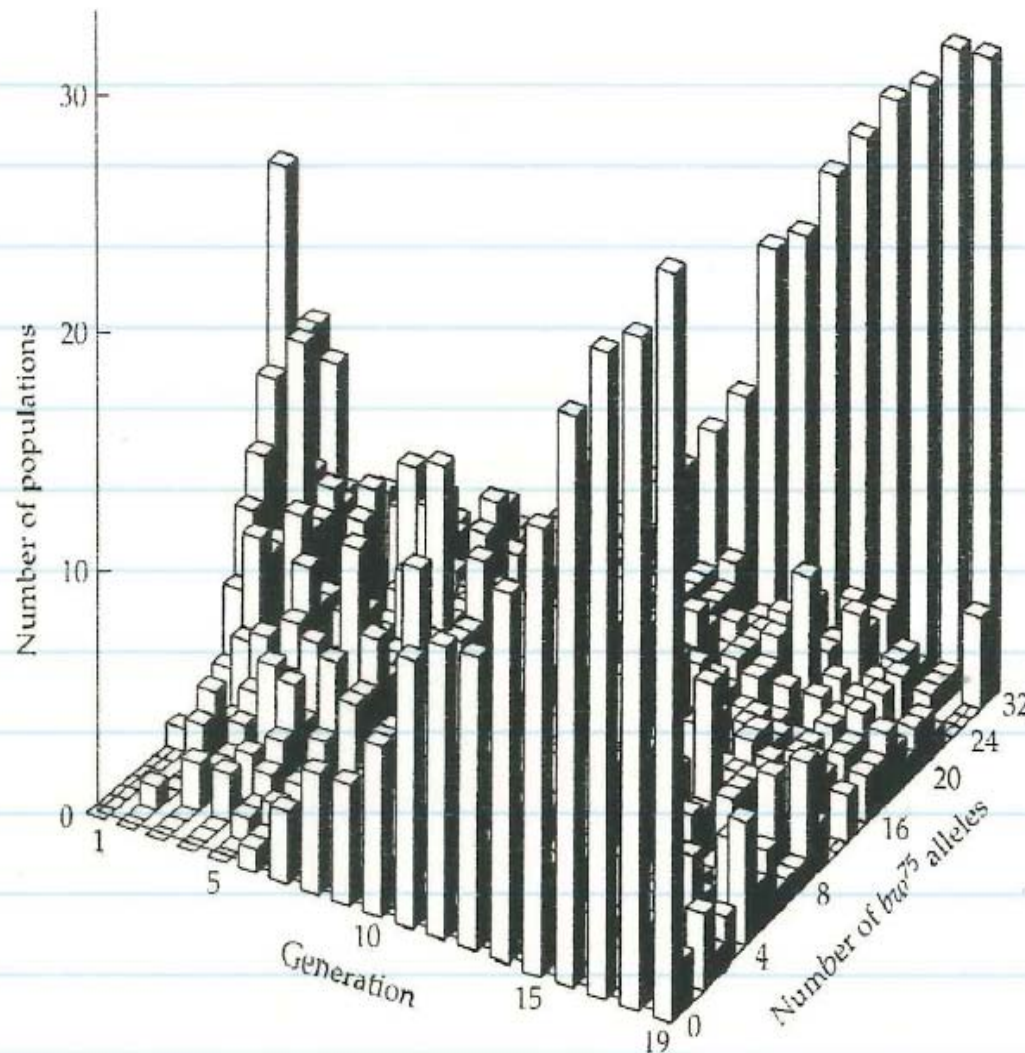
$$\frac{\partial u(p,t)}{\partial t} = \frac{\partial^2}{\partial p^2} \left[\frac{p(1-p)}{4N} u(p,t) \right]$$



* All finite populations eventually fixed with homozygous population of all (a/a) or all (A/A)



17-20/14



Fixation of bw^{75}
 & bw alleles in
 107 fruit fly
 populations with
 $N = 16$

FIGURE 3.4 Random genetic drift in 107 actual populations of *Drosophila melanogaster*. Each of the initial 107 populations consisted of 16 bw^{75}/bw heterozygotes ($N = 16$; bw = brown eyes). From among the progeny in each generation, eight males and eight females were chosen at random to be the parents of the next generation. The horizontal axis of each curve gives the number of bw^{75} alleles in the population, and the vertical axis gives the corresponding number of populations. (Data from Buri 1956.)

**PRINCIPLES OF
 POPULATION
 GENETICS
 FOURTH EDITION
 Daniel L. Hartl
 Andrew G. Clark**

Numerical solution
by Kimura (1955)
of Kolmogorov forward
equation...

$$\frac{\partial u(x, p, t)}{\partial t} = \frac{\partial^2}{\partial x^2} \left[\frac{x(1-x)}{4N} u(x, p, t) \right]$$

$$u(x, p, t=0) = \delta(x-p)$$

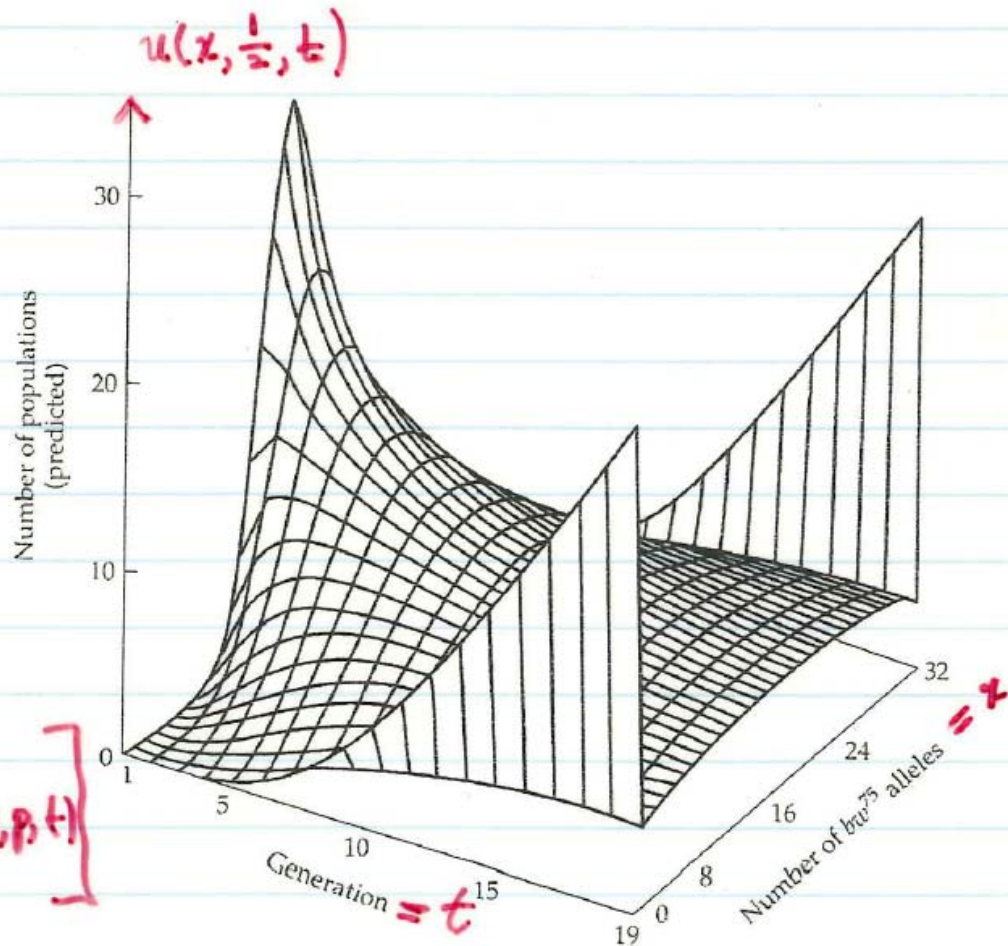
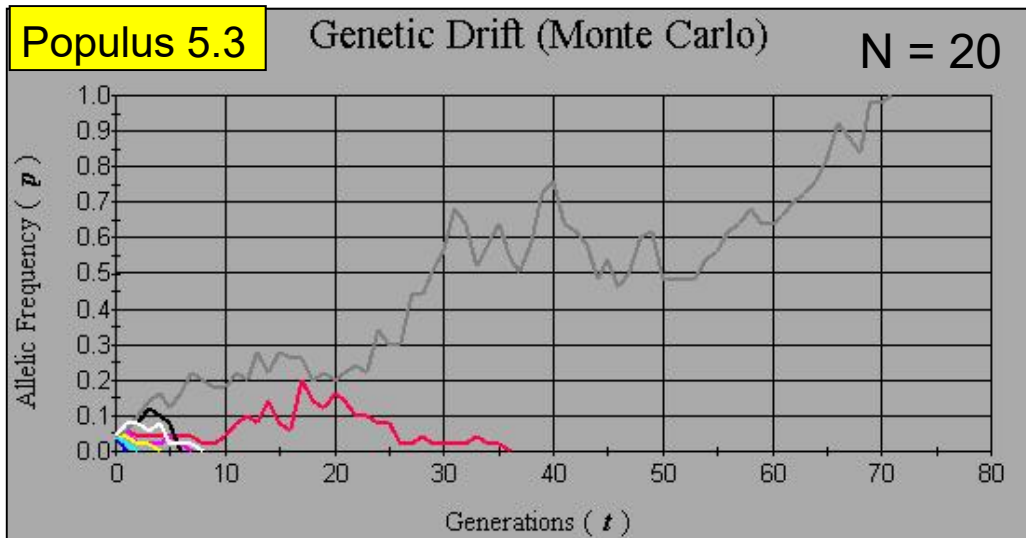


FIGURE 3.7 Kimura's (1955) solution to the diffusion equation for the particular case of $N = 16$. This is the three-dimensional view of Figure 3.6, and represents the diffusion approximation to the exact solution obtained from the Wright-Fisher model in Figure 3.5.

Genetic drift for a neutral mutation, (M. Kimura)

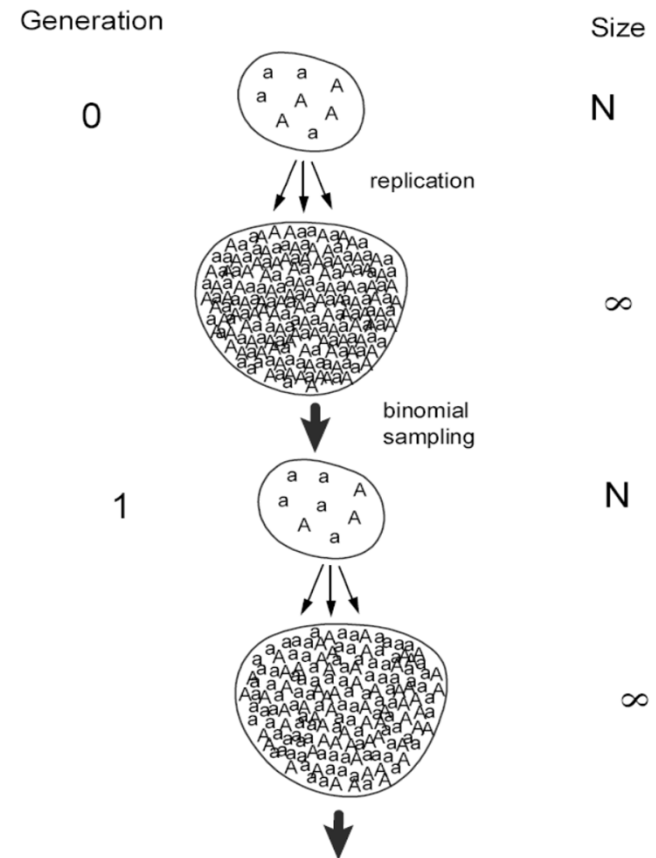


$u(p,t)$ = probability allele A has frequency p at time t .

Finite populations go to fixation for long times (using, e.g., Fisher-Wright population sampling)

$$\frac{\partial u(p,t)}{\partial t} = \frac{\partial^2 [D_G u(p,t)]}{\partial p^2}$$

$$D_G(p) = p(1-p) / (4N)$$



Finite populations go to fixation for long times

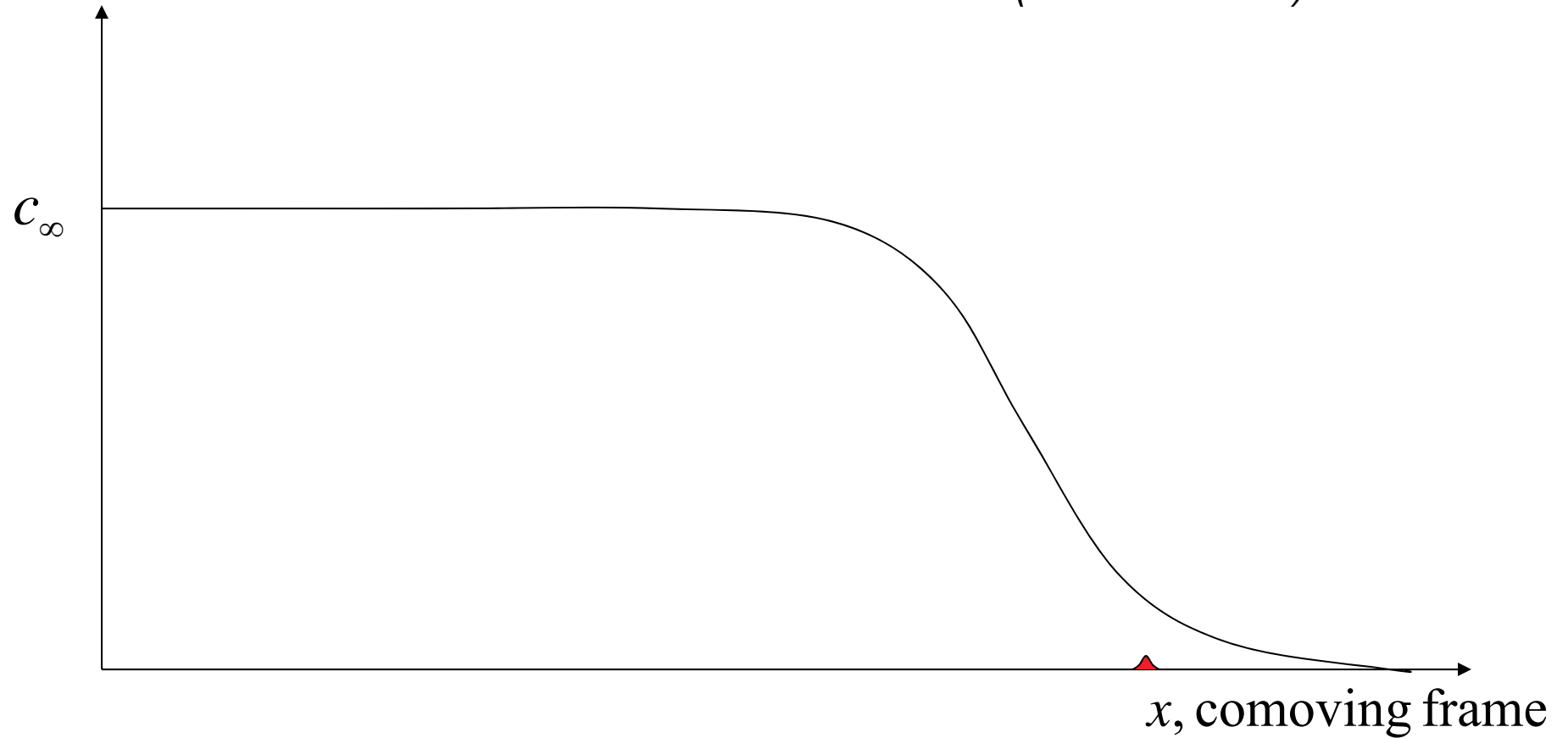
Probability of fixation of a single neutral mutation in a population of size N is just 1/N

But N is small in the vicinity of an expanding population front!

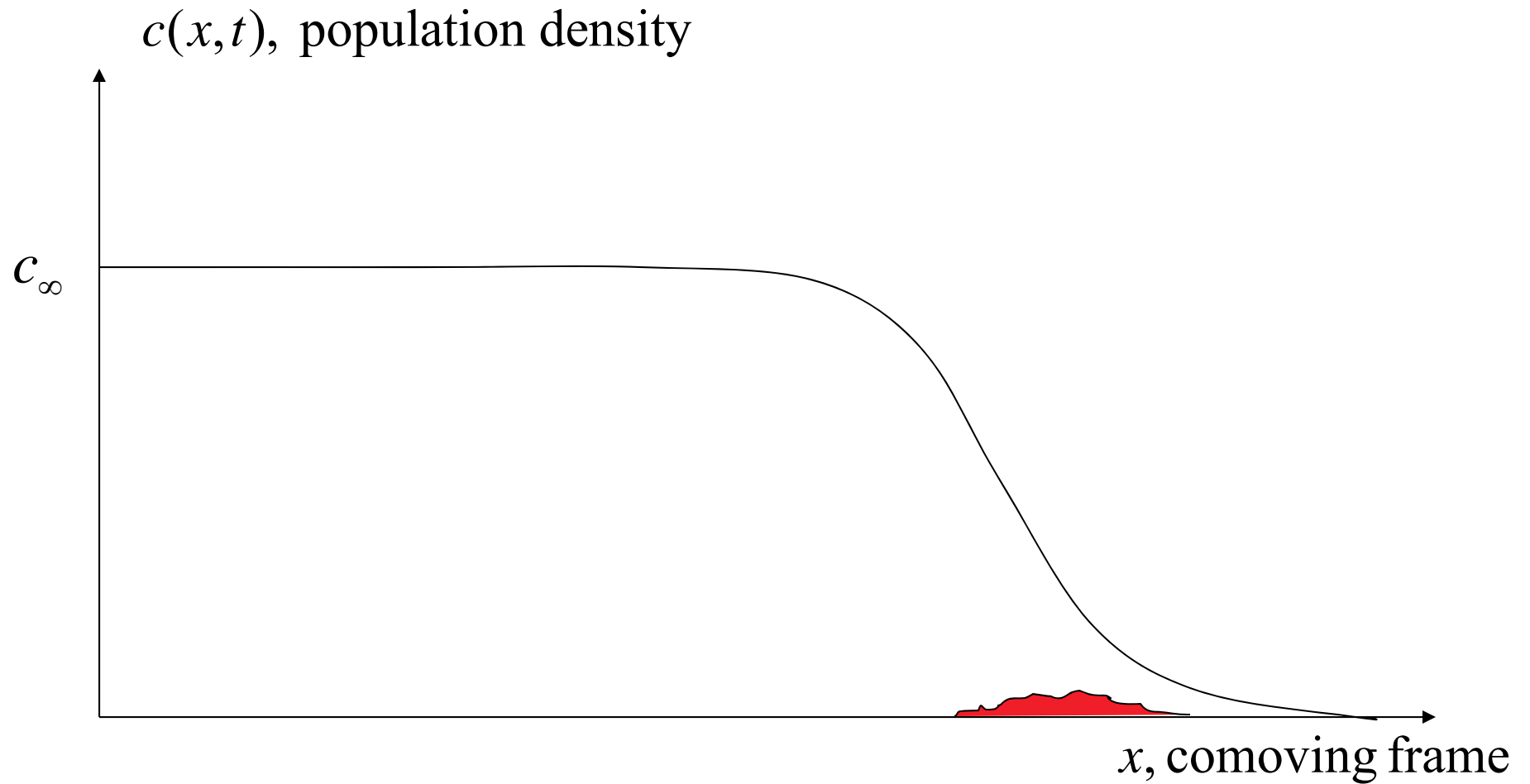
Successful Surfing (1d)

$c(x, t)$, population density

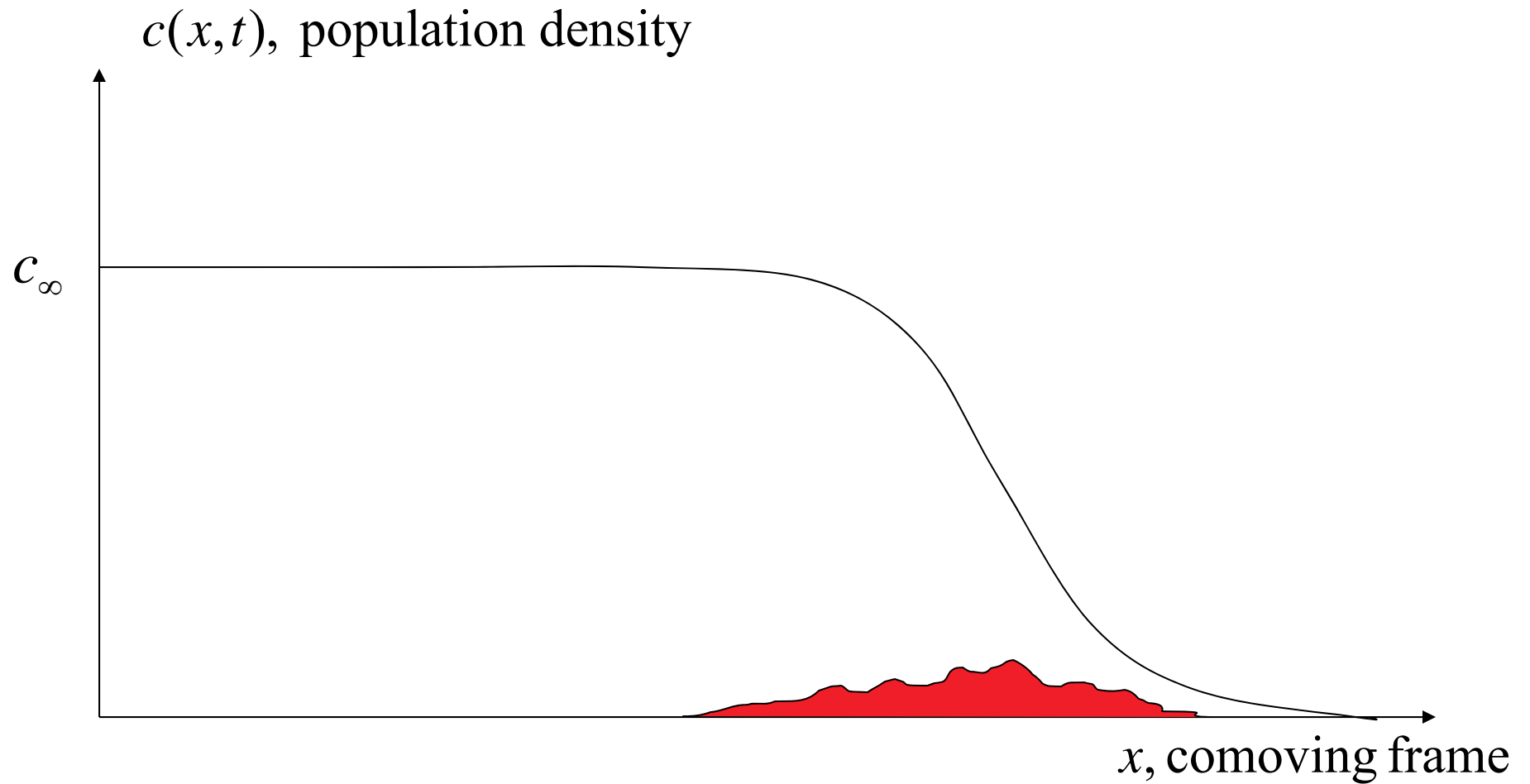
(O. Hallatschek)



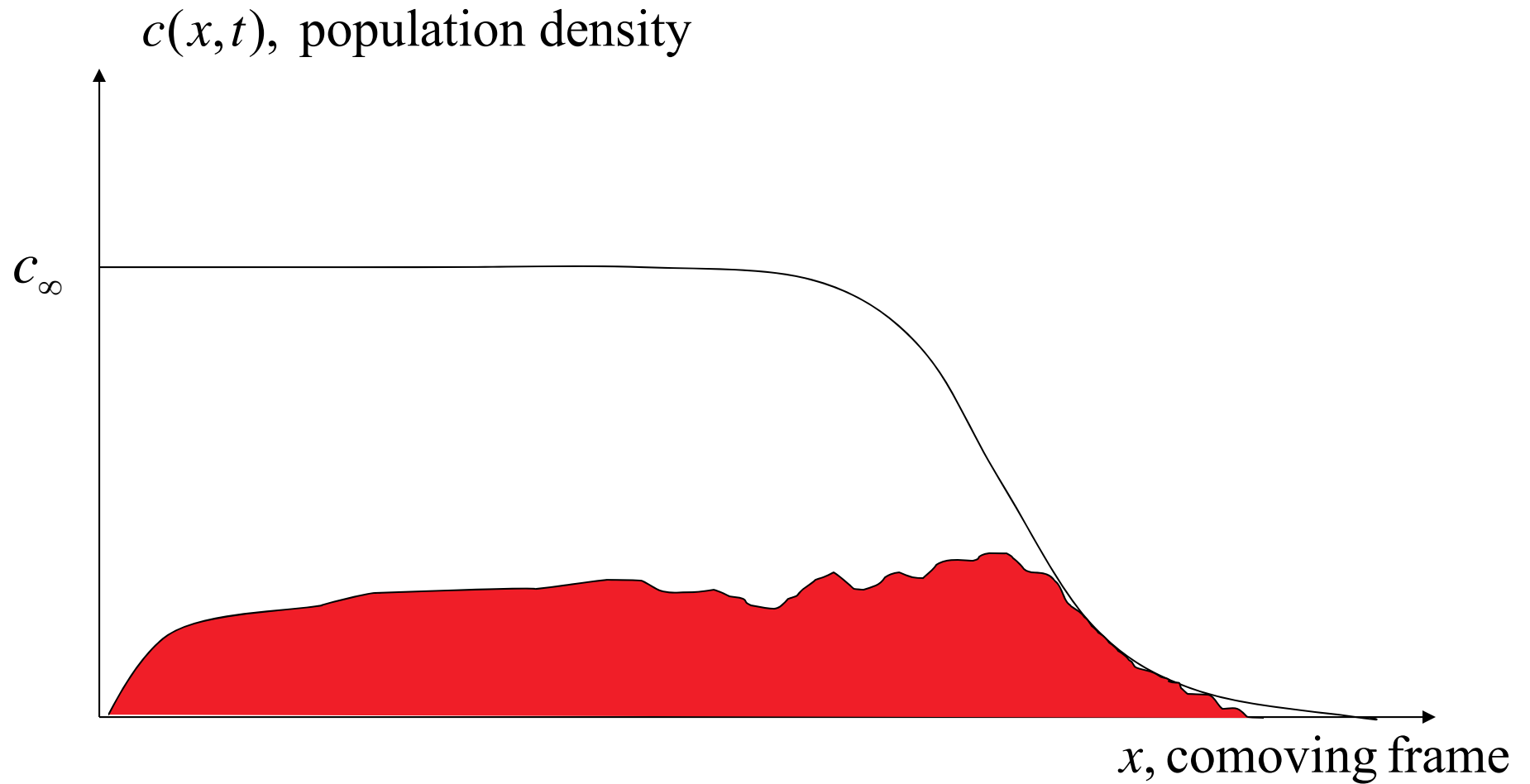
Successful Surfing (1d)



Successful Surfing (1d)

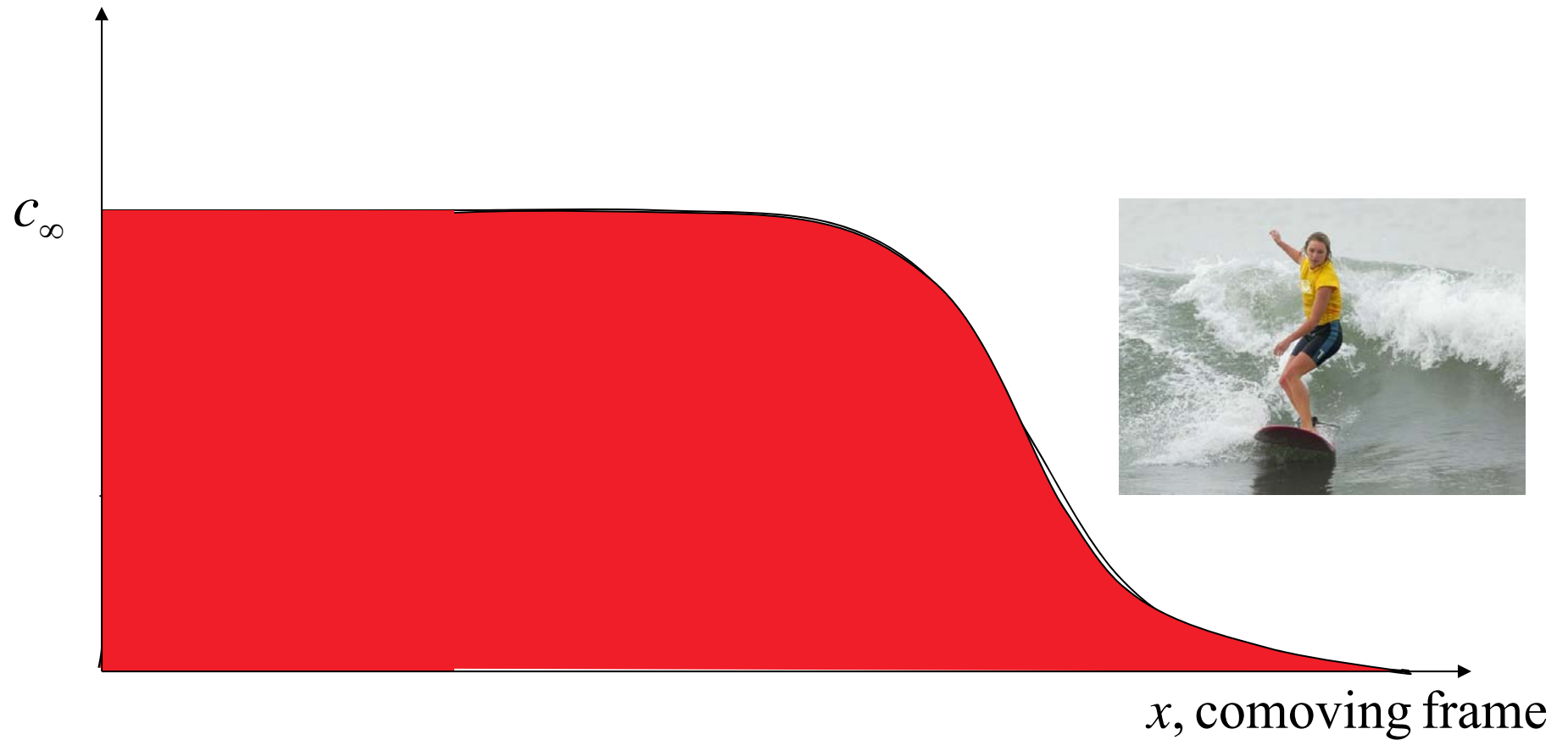


Successful Surfing (1d)



Successful Surfing (1d)

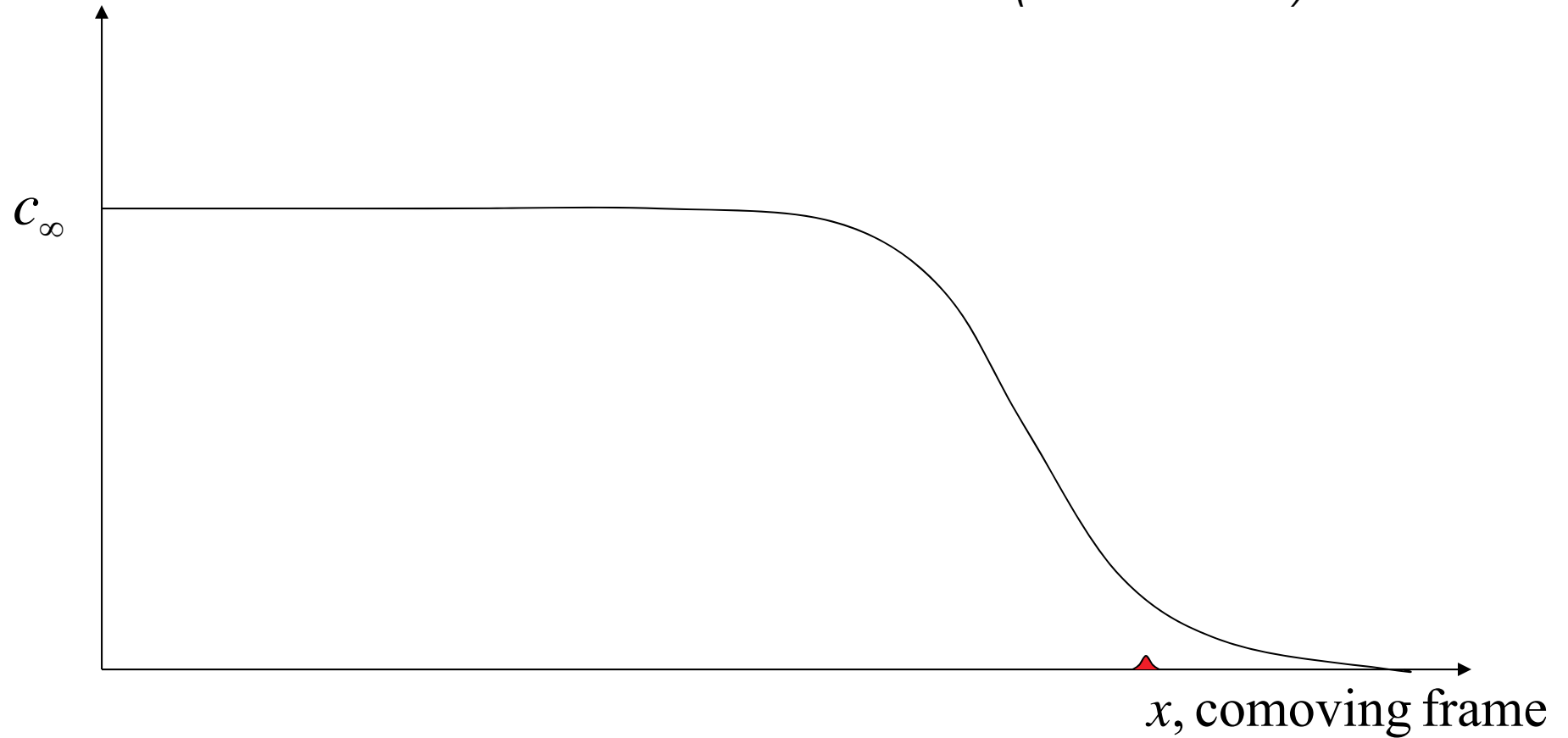
$c(x, t)$, population density



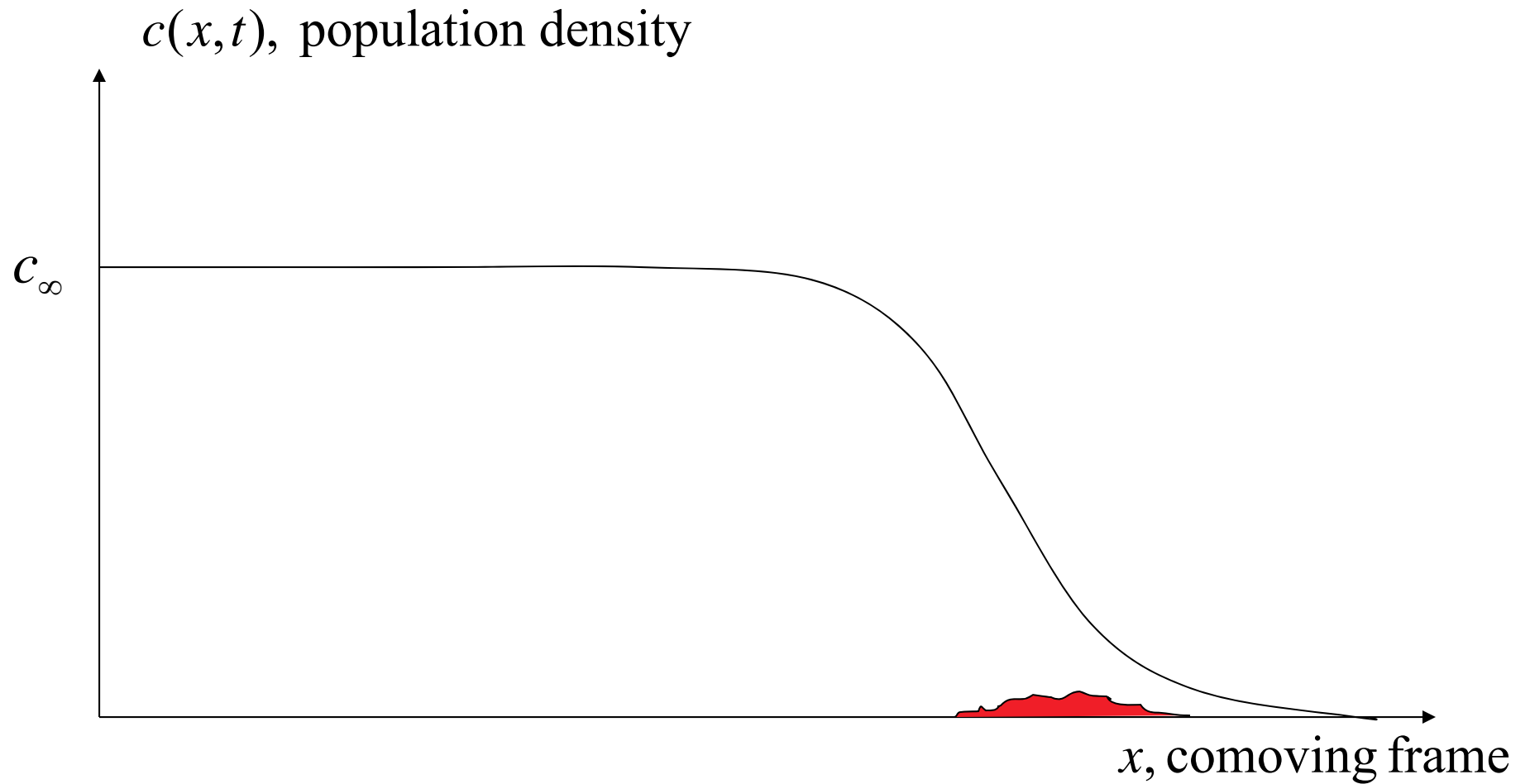
Often however ...

$c(x, t)$, population density

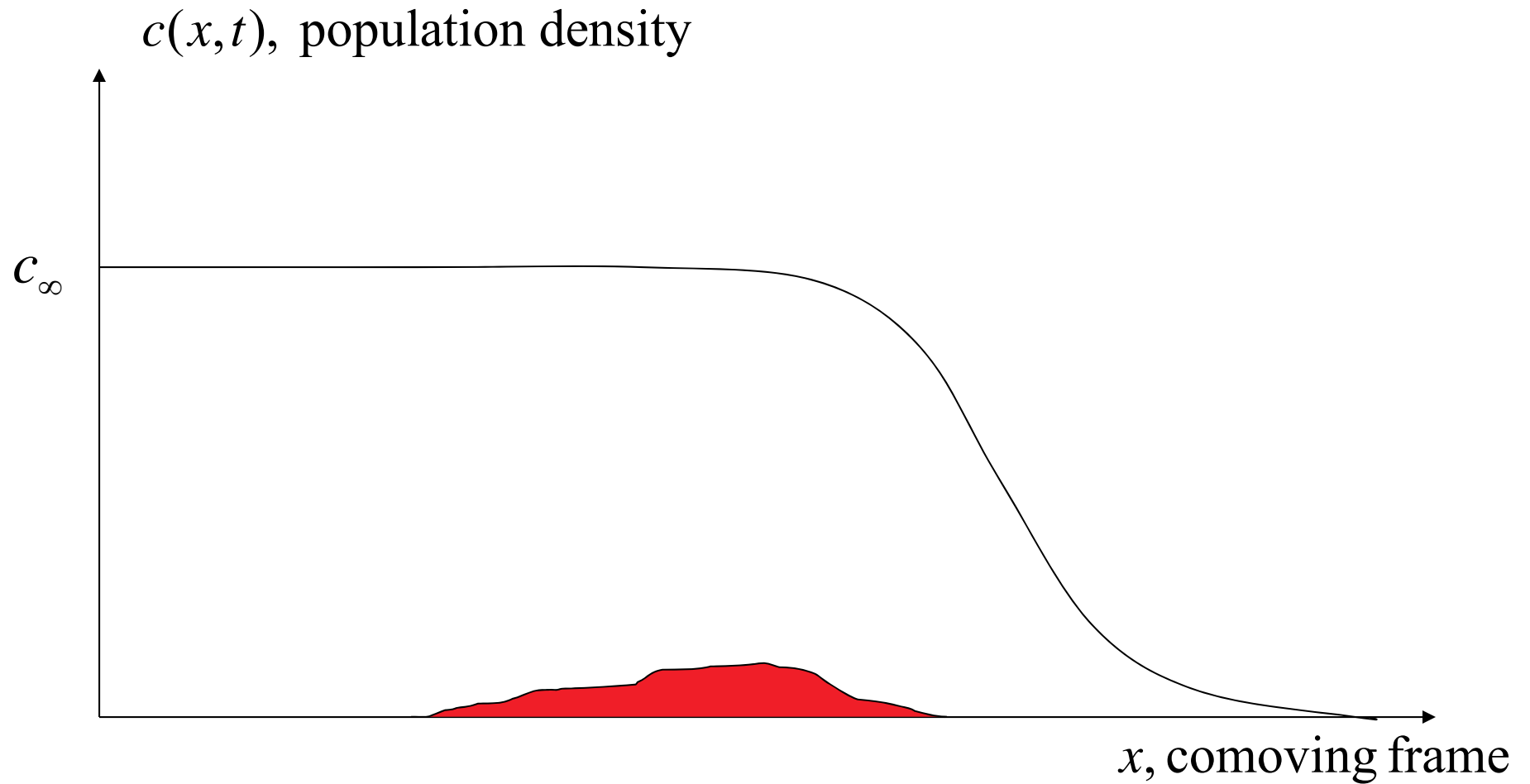
(O. Hallatschek)



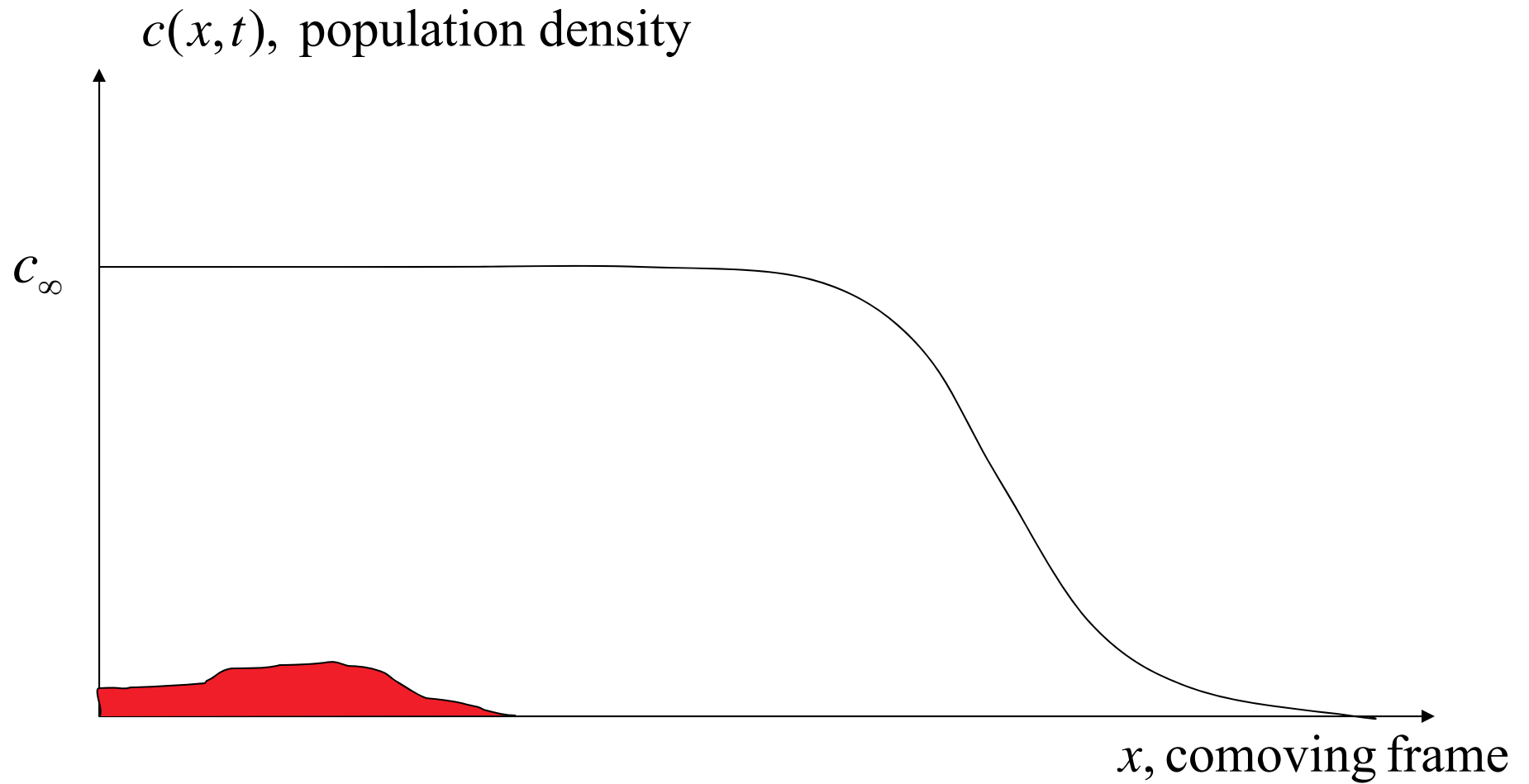
Often however ...



Often however ...



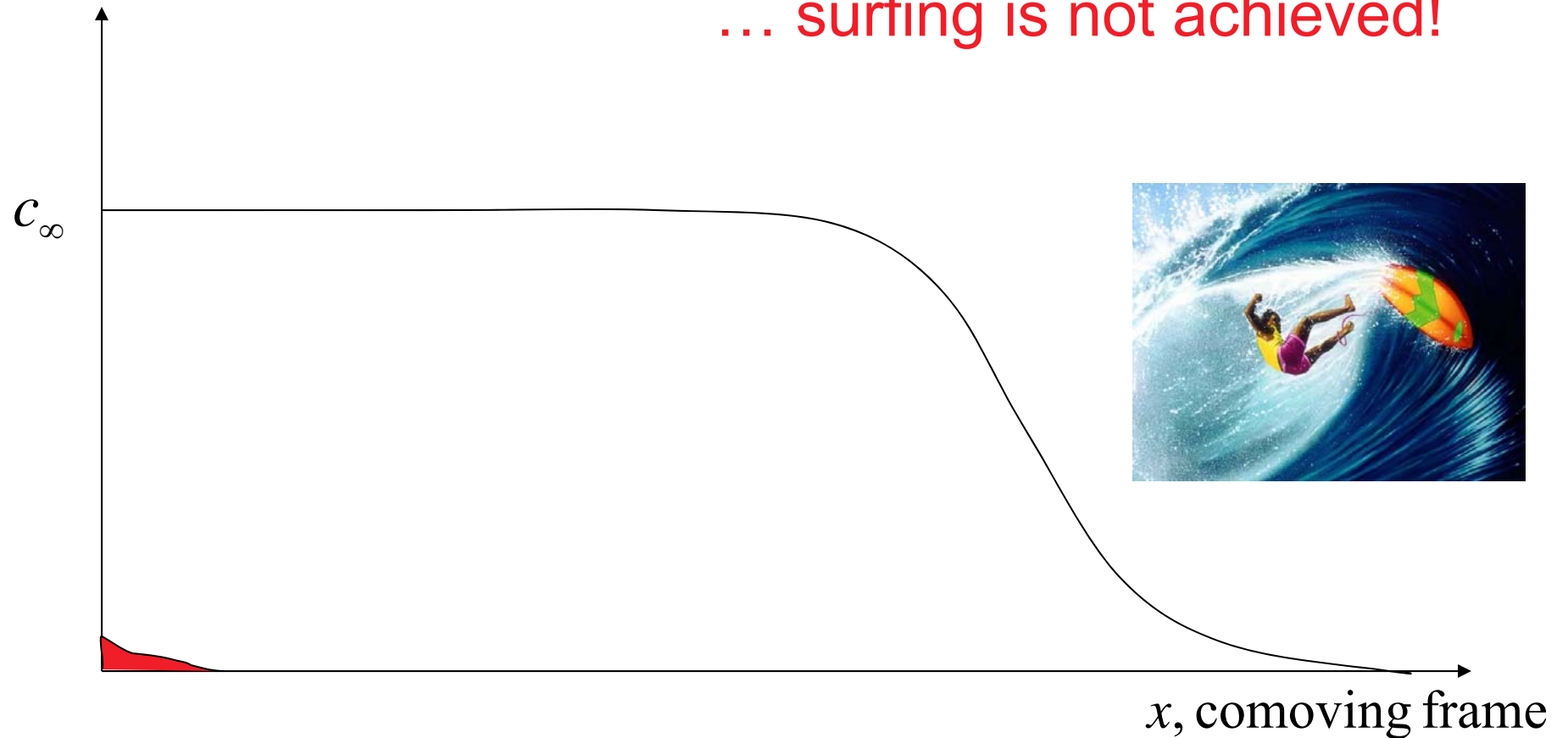
Often however ...



Often however ...

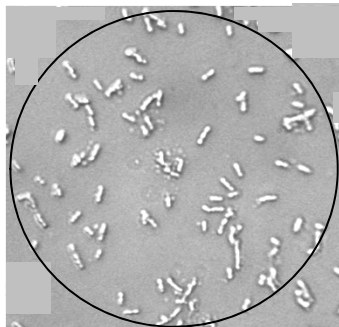
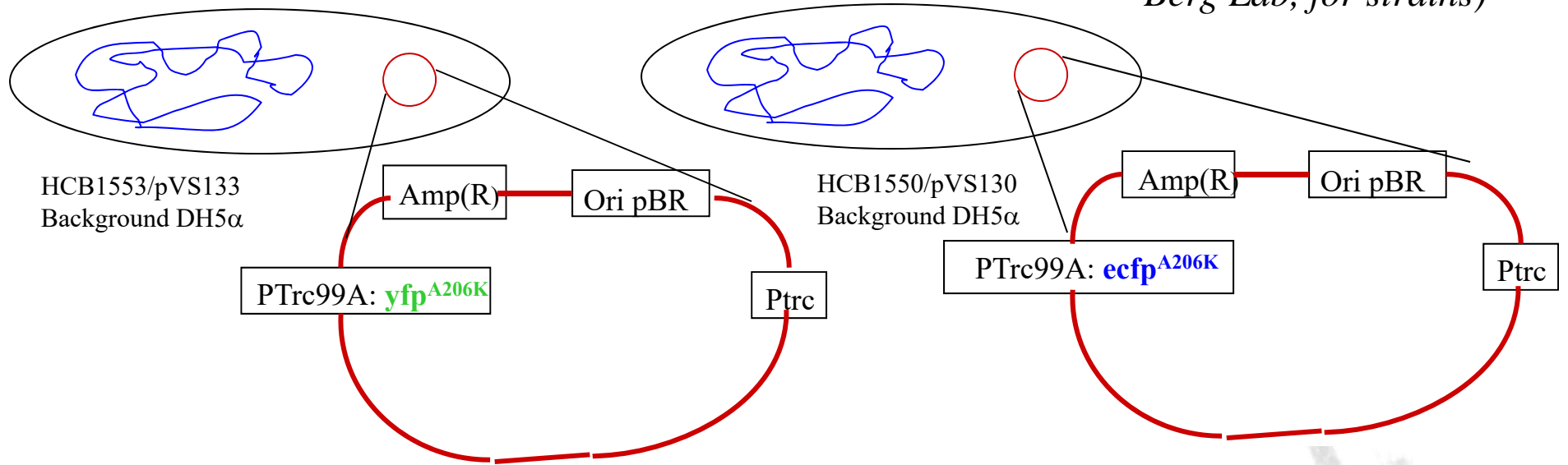
$c(x,t)$, population density

... surfing is not achieved!

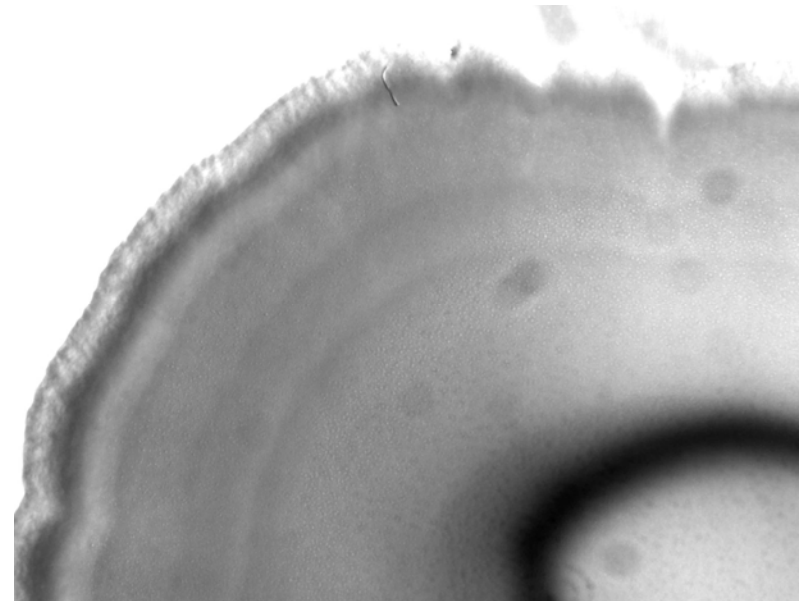


Gene Surfing in nonmotile *E. coli*

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

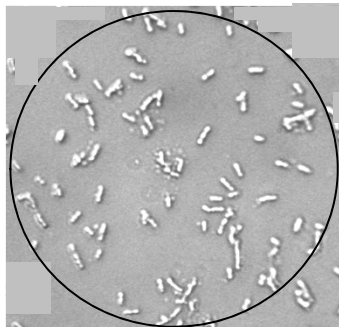
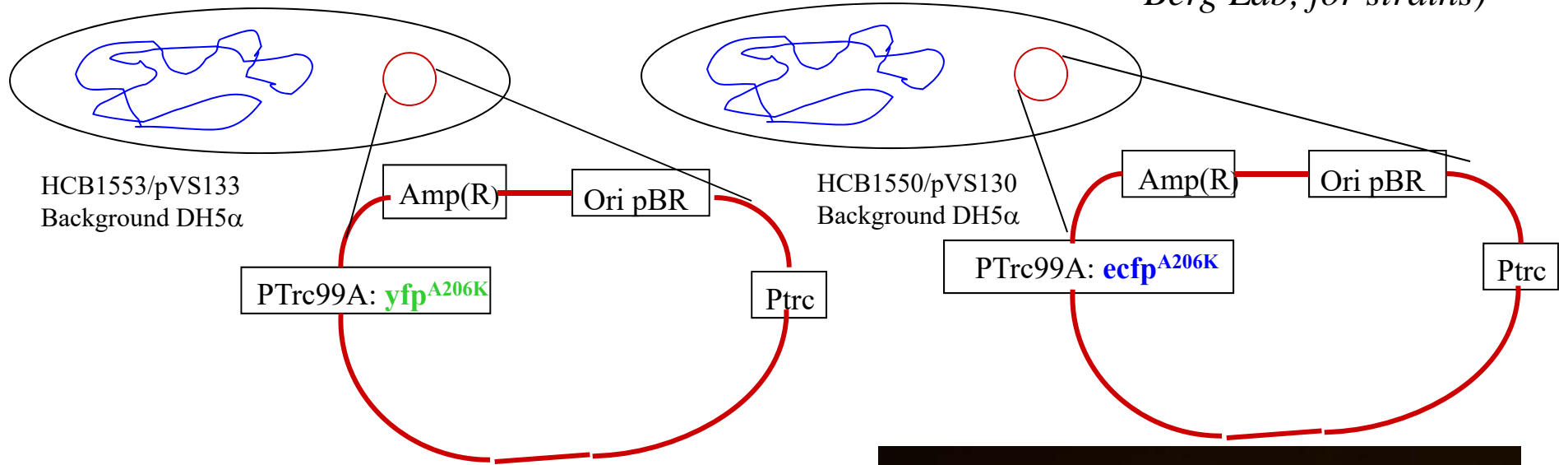


50-50 mixture,
1550/1553

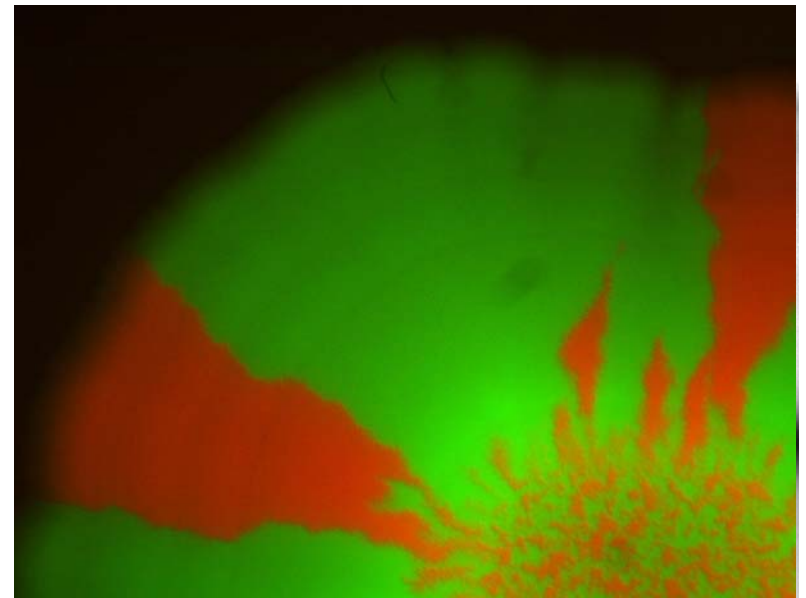


Gene Surfing in nonmotile *E. coli*

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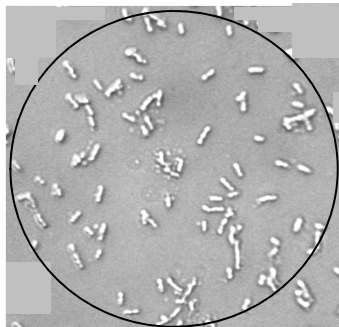
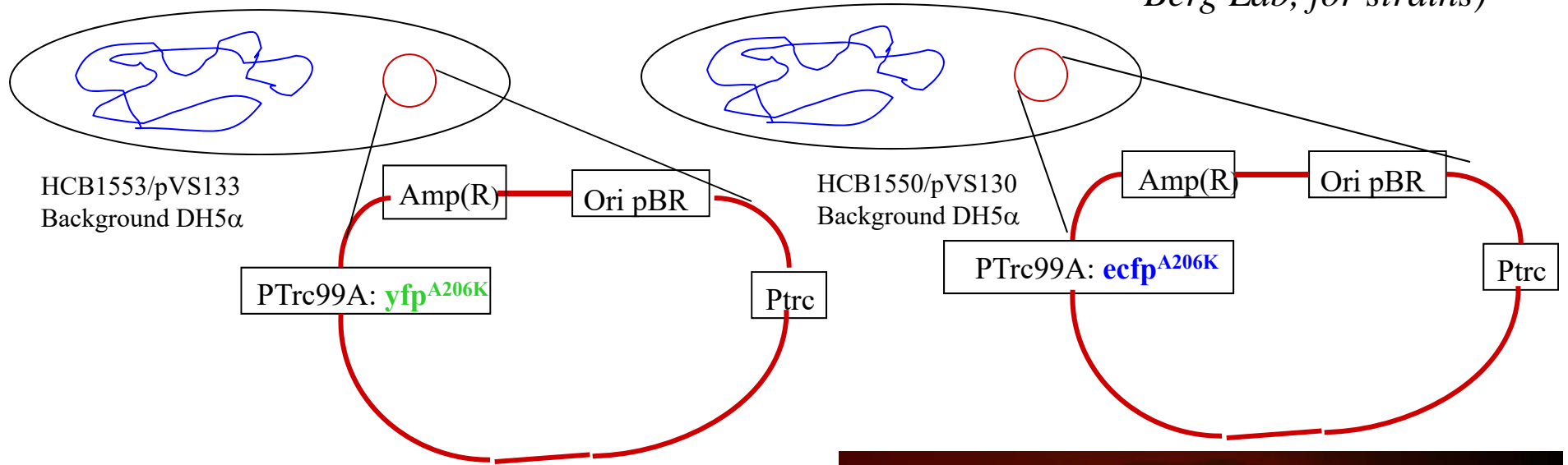
50-50 mixture,
1550/1553



Cyan → Red

Genetic demixing in non-motile *E. coli*

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

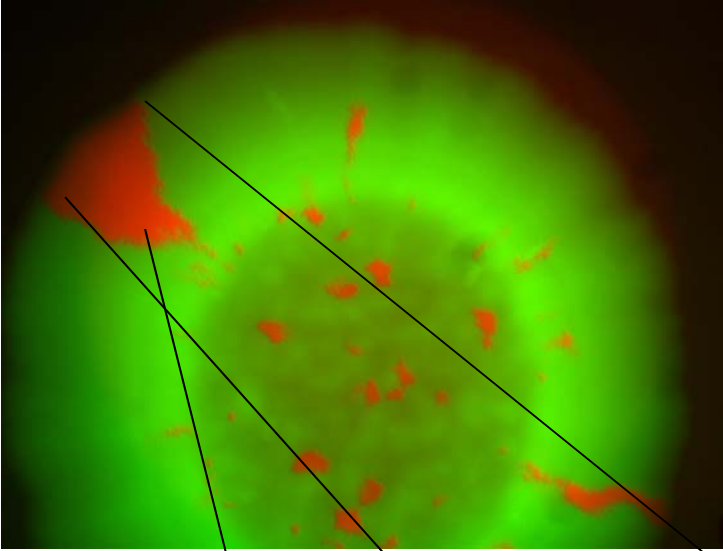


50-50 mixture,
1550/1553

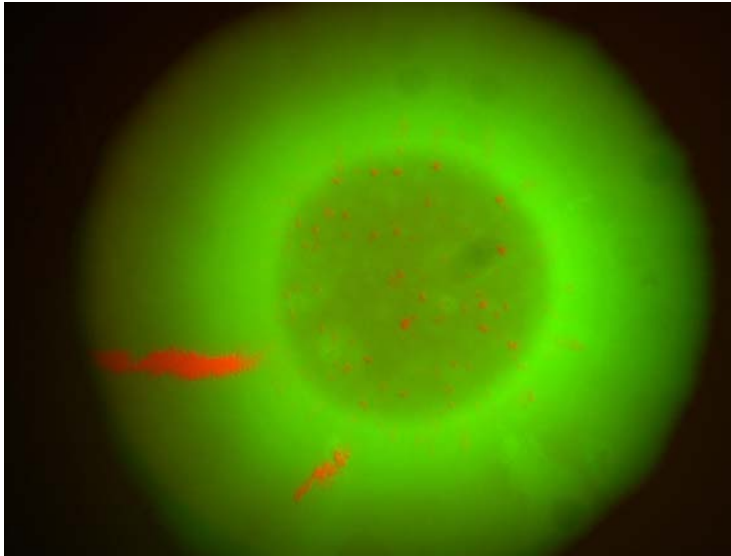


Cyan \rightarrow Red

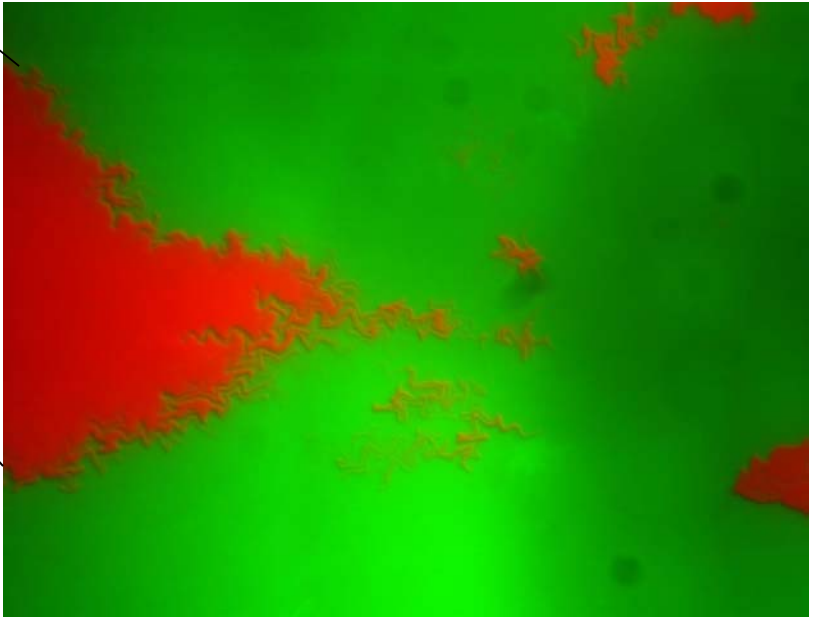
Gene surfing in the dilute limit: “survival of the luckiest”



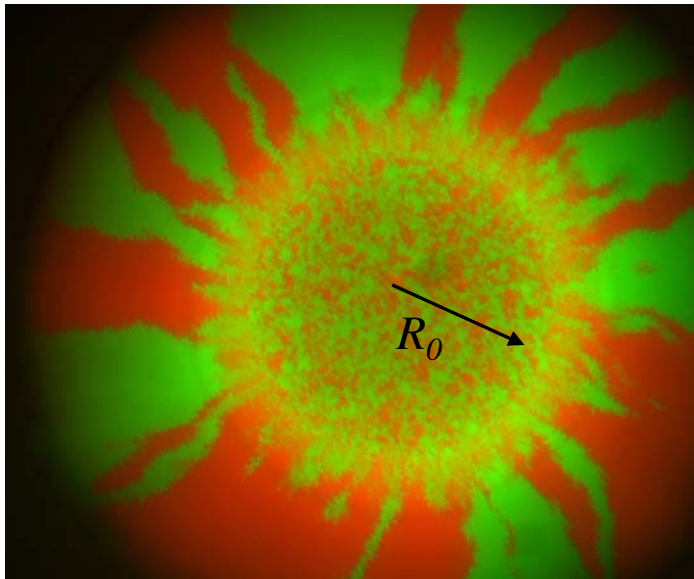
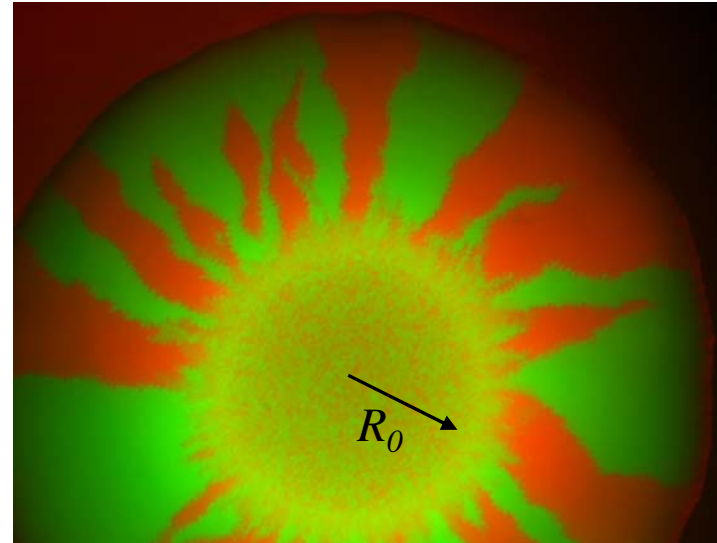
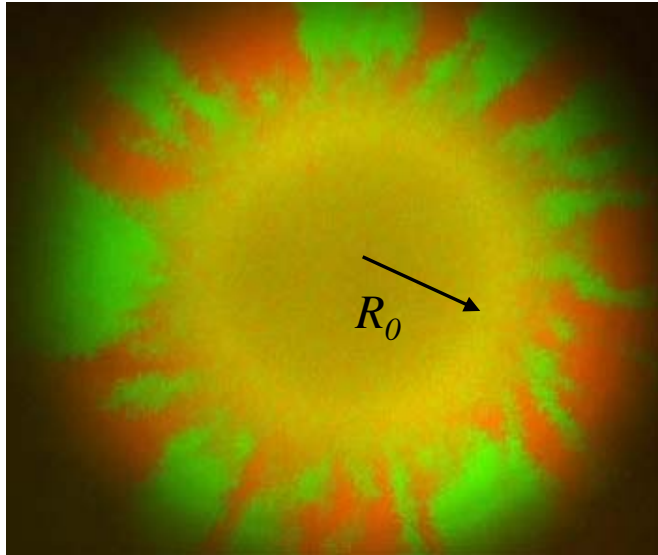
95%-5% mixture, founder population ~ 500



98%-2% mixture, founder population ~ 5000



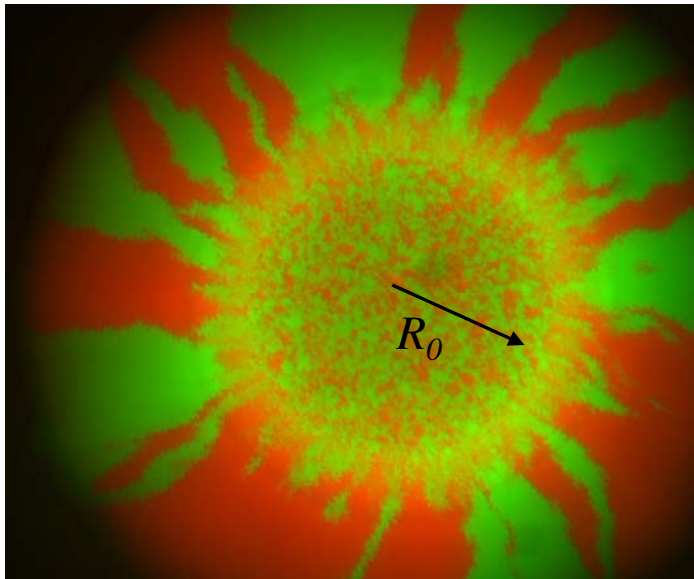
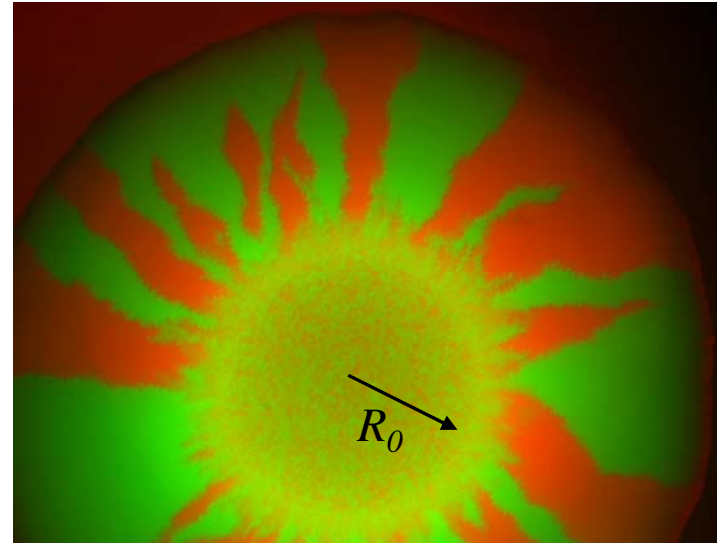
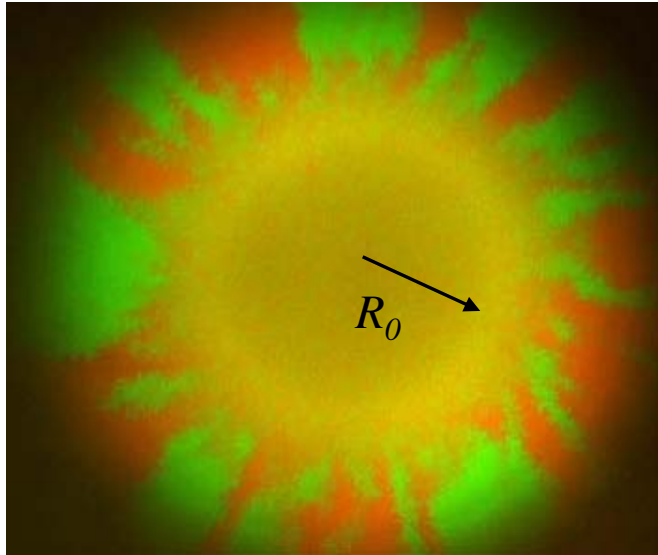
What would happen if we could “replay the tape of life”?



E. coli range expansions:
can infer the radius R_0
of the homeland from
data at the boundary:

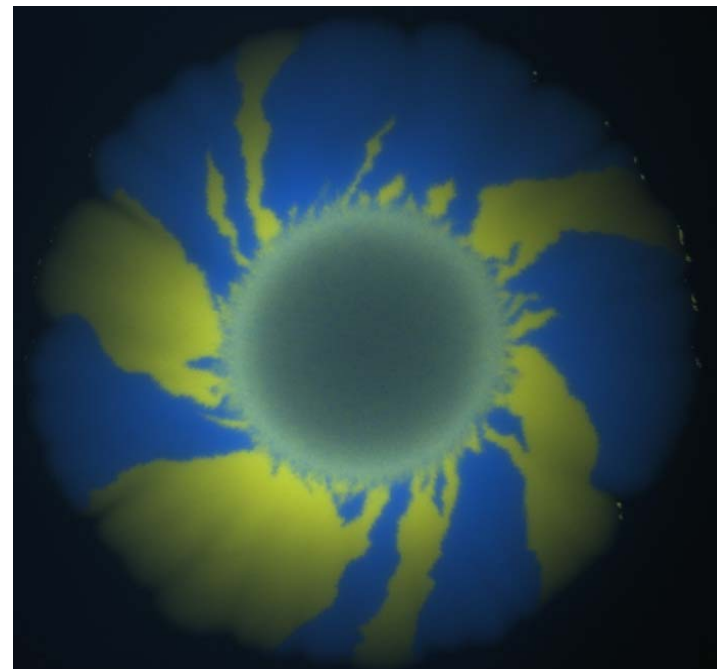
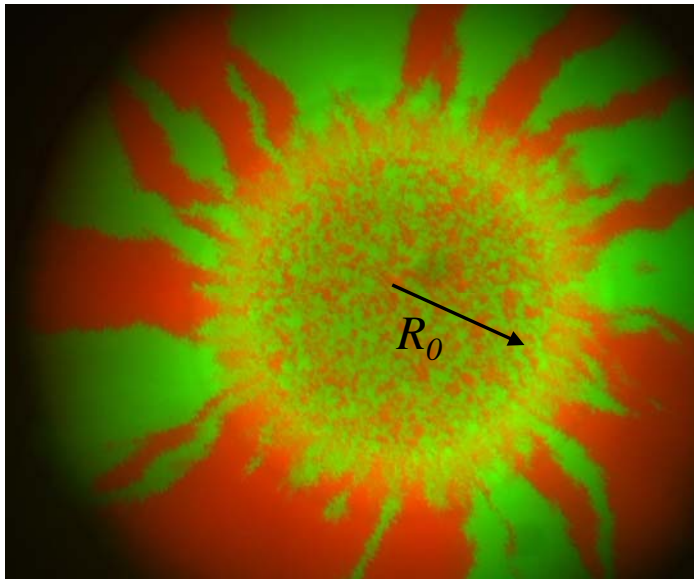
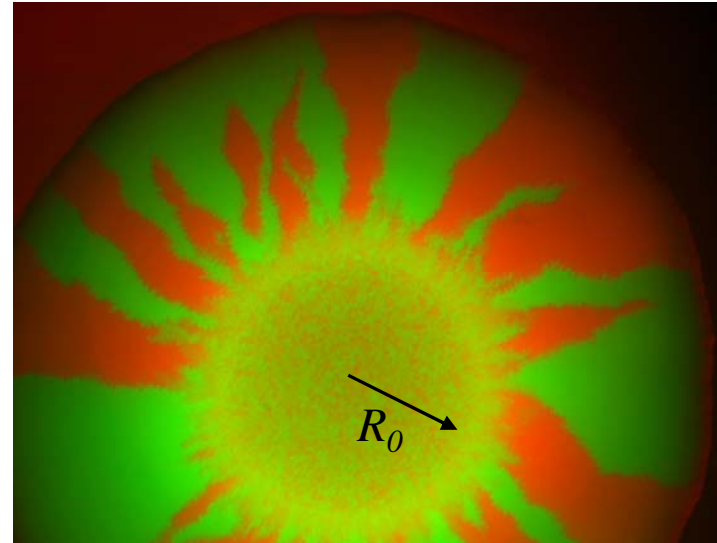
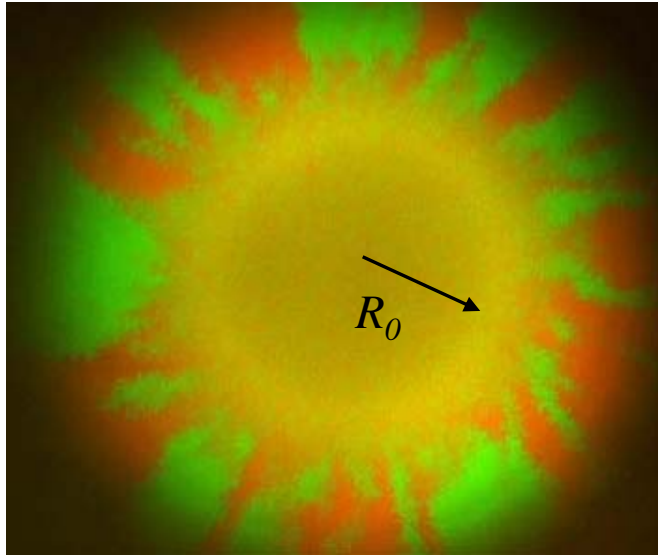
$$N_{\text{sec}} = \sqrt{\pi R_0 v / 2D_w}$$

What would happen if we could “replay the tape of life”?



*“Survival of
the luckiest”*

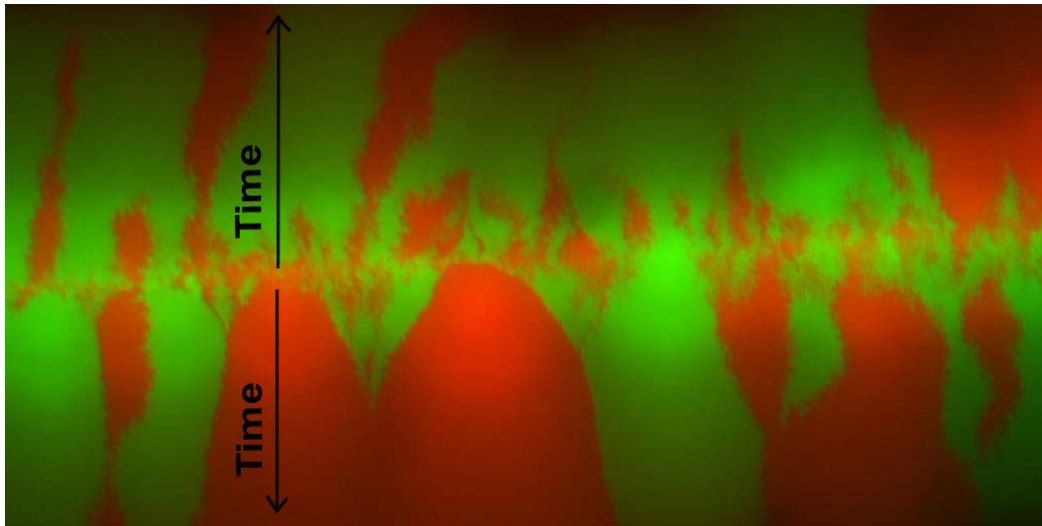
What would happen if we could “replay the tape of life”?



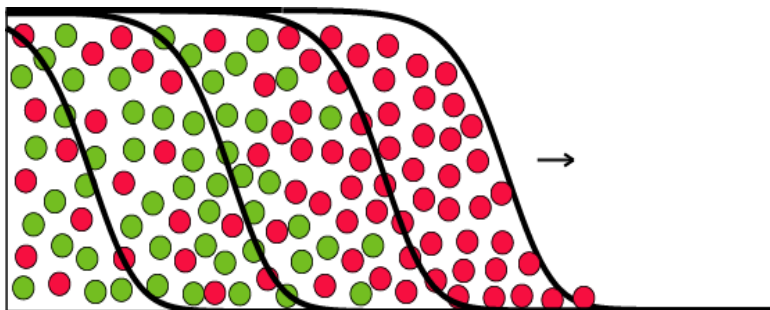
Chiral range expansions

Linear Inoculations: “Genetic demixing” results from number fluctuations at the frontier

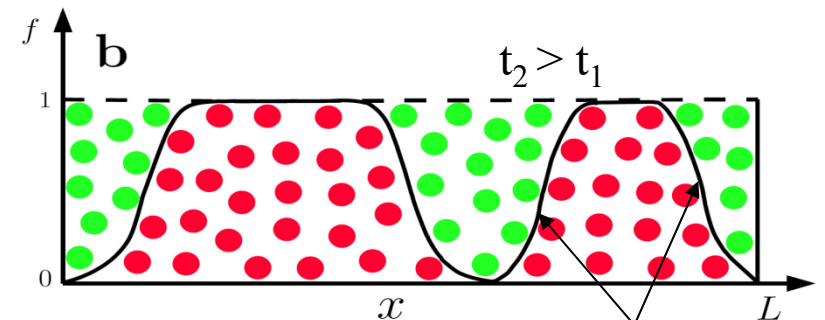
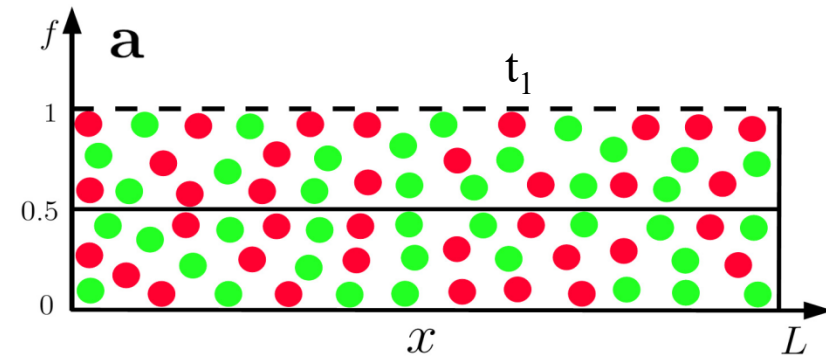
View from the top: razor blade inoculation



Side view as the population wave advances:



View of a “dust mote” on a Petri dish as the wave advances....



Fisher genetic waves

Thank you!



<http://streetanatomy.com>