

Evolutionary dynamics in spatially structured (as opposed to well-mixed) asexuals.

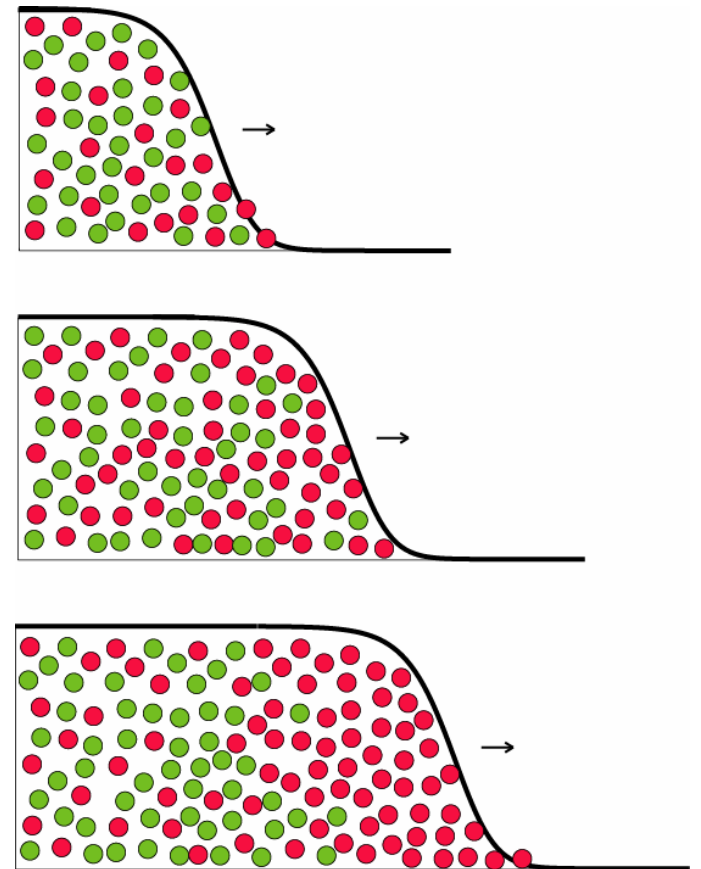
Oskar Hallatschek

MPI-Dynamics and Self-Organization

Göttingen

<http://www.ds.mpg.de/Forschung/index.php>

P.h.D. and postdoc positions available!



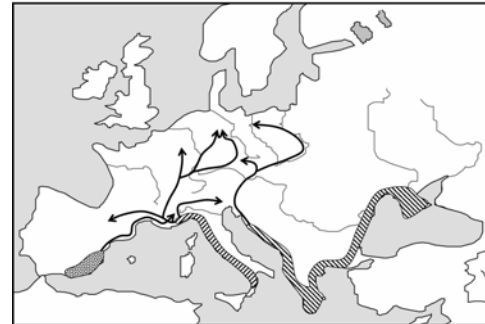
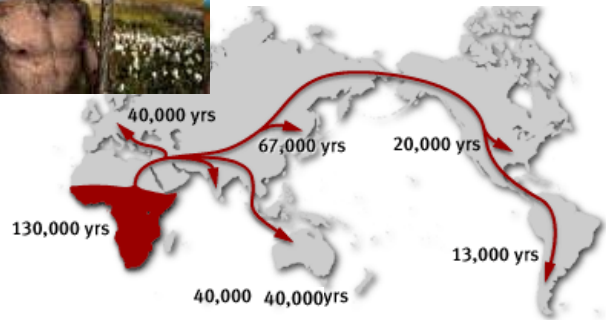
Outline

- Neutral drift during range expansions
- Speed of adaptation and genetic load in 1d models

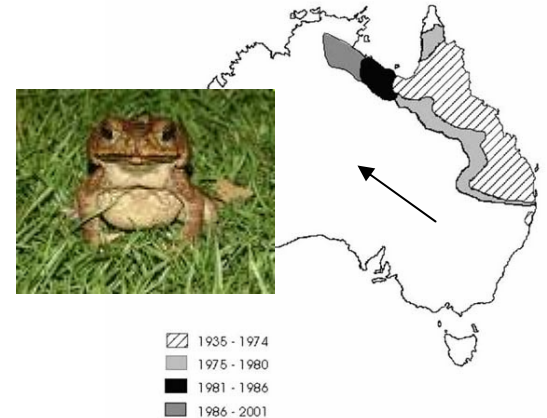


Hill & Robertson

Rang expansions are ubiquitous



Glacial cycles

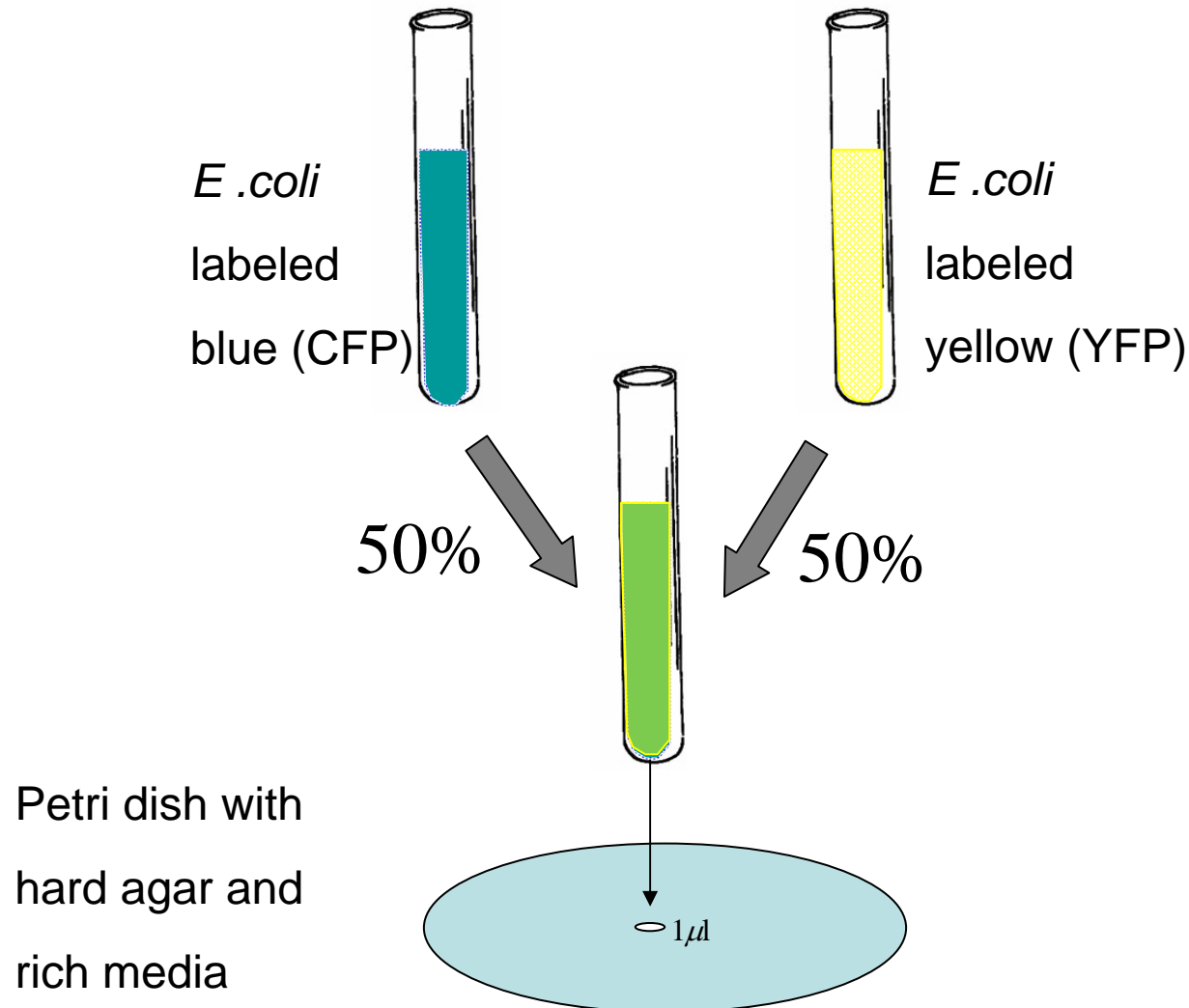


What is the impact of a range expansion on the gene pool of a population ?

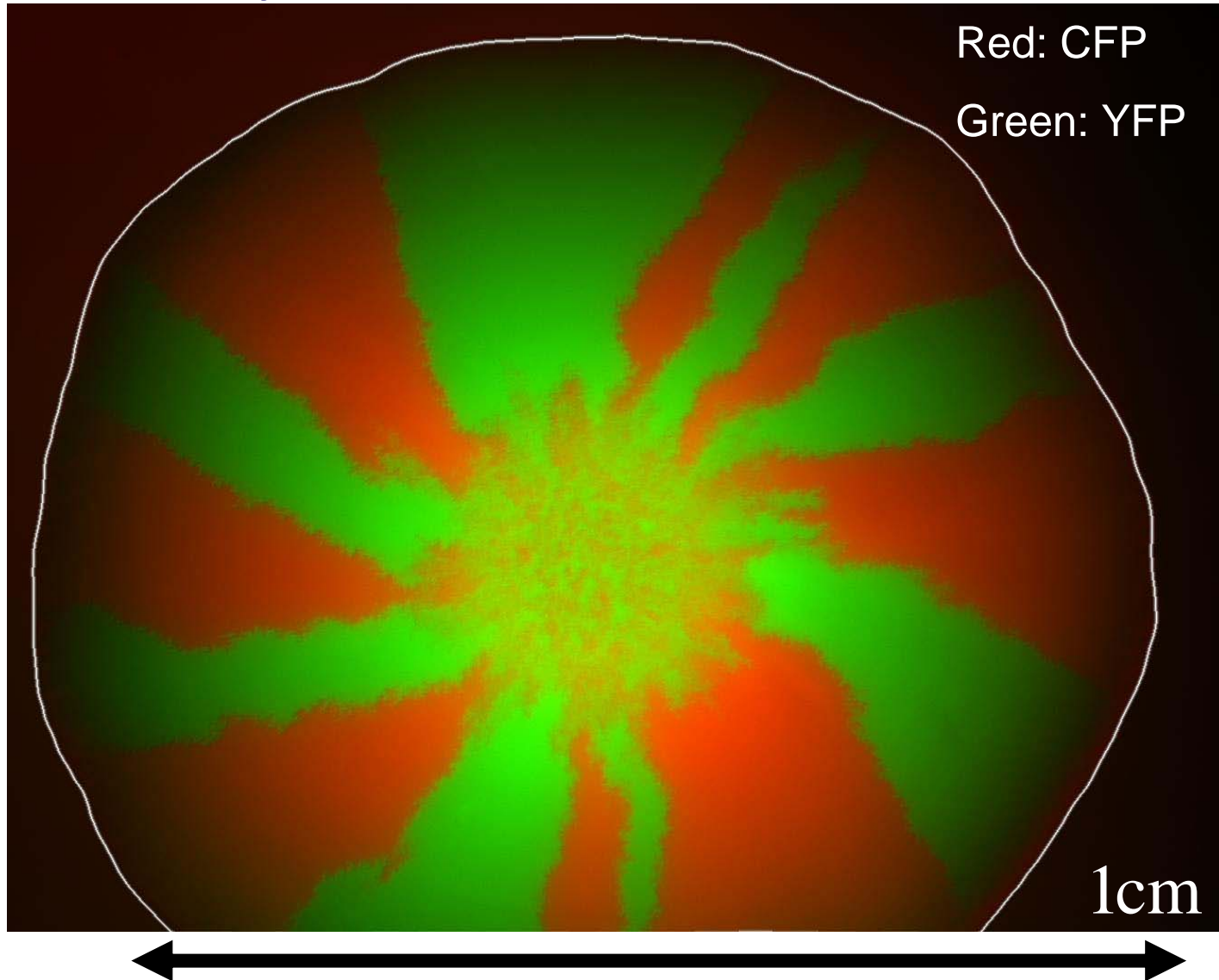
Edmonds, C. A., Lillie, A.S., & Cavalli-Sforza LL. (2004) *PNAS*.

Ramachandran S, Deshpande O, Roseman CC, Rosenberg NA, Feldman MW & Cavalli-Sforza LL. (2005) *PNAS*.

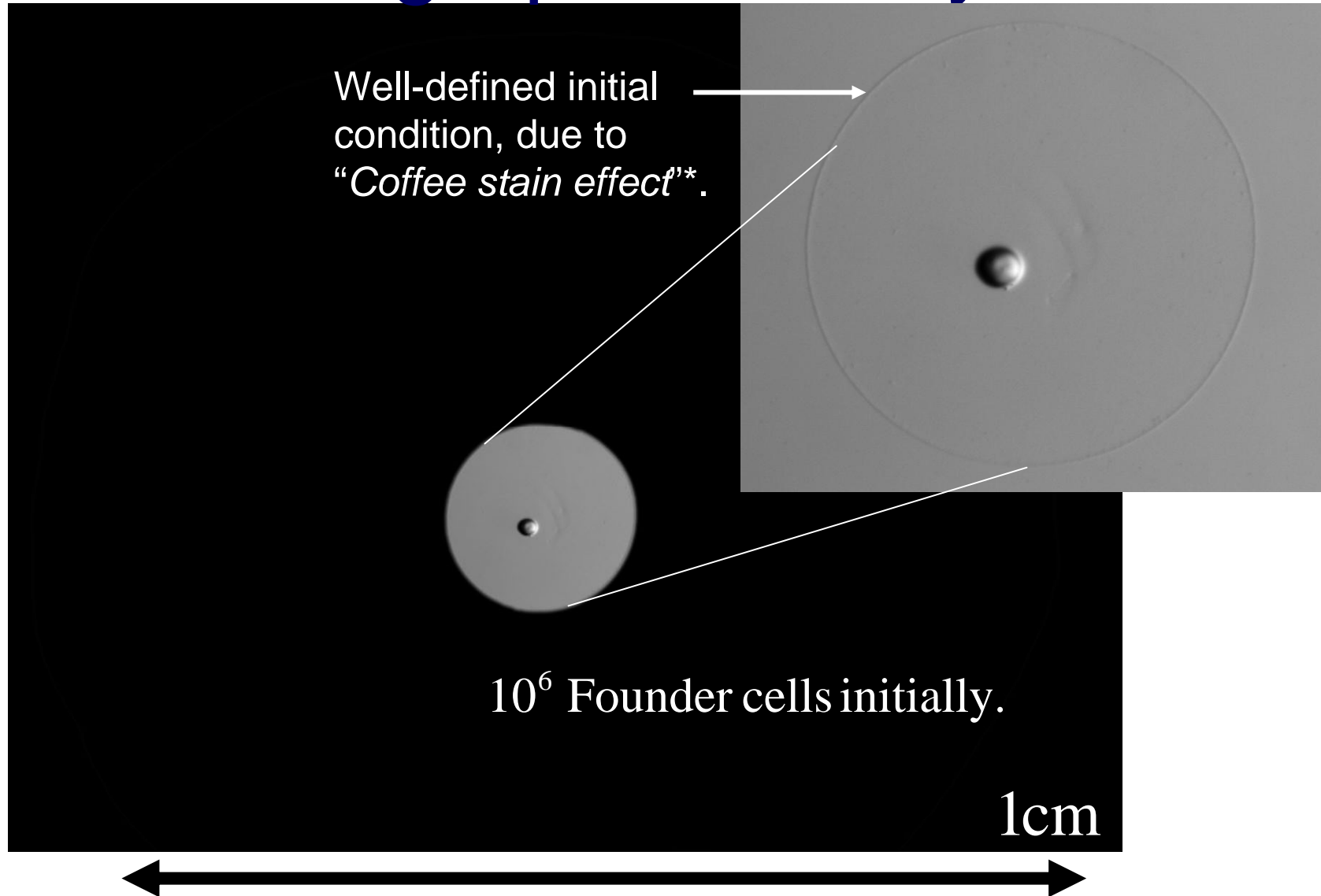
Tracer dynamics in microbial range expansions



Tracer dynamics in *E. coli* colonies



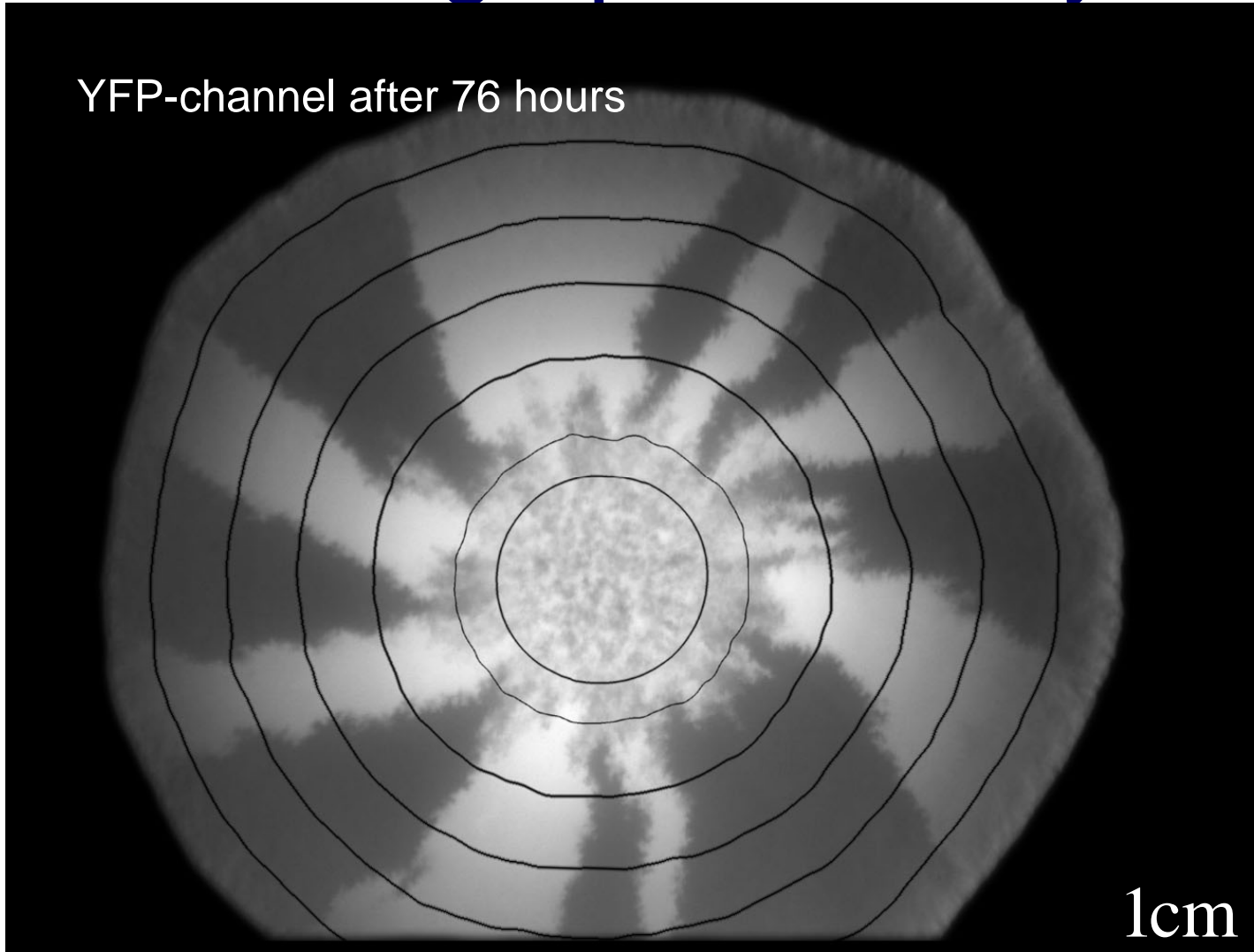
Demographic history



* Deegan RD, Bakajin O, Dupont TF, Huber G, Nagel SR & Witten TA. (1997) Nature 389: 827-829.

Demographic history

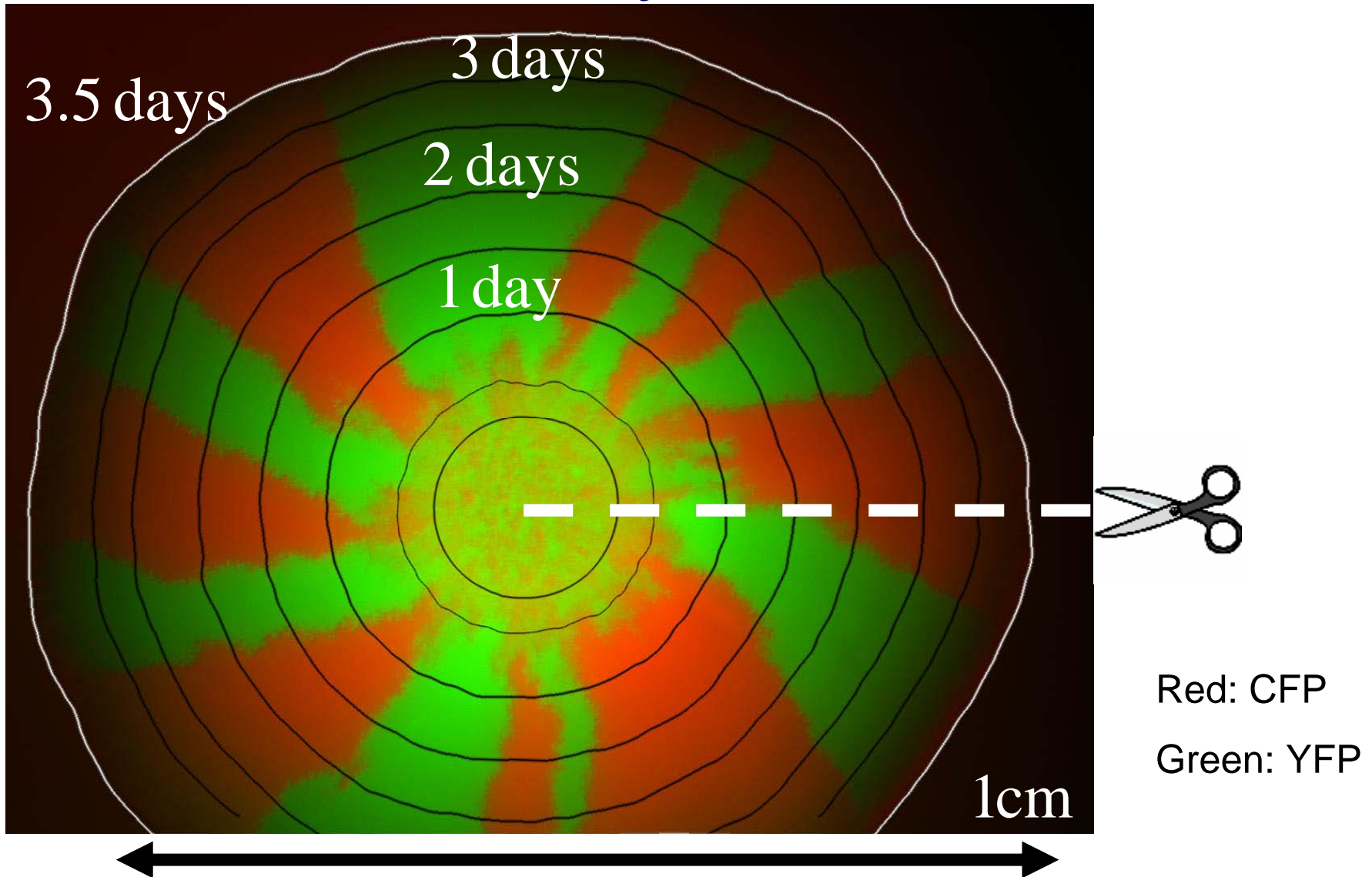
YFP-channel after 76 hours



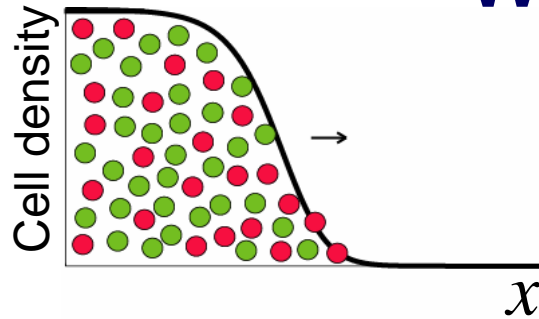
1cm



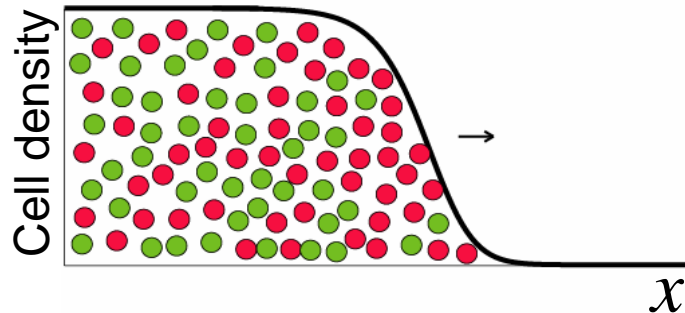
Marker diversity in *E. coli* colonies



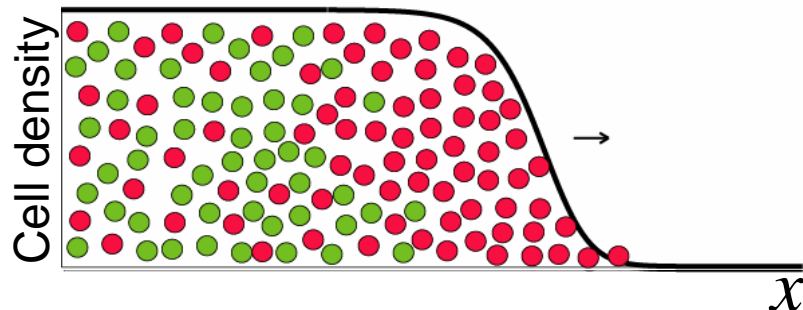
Density waves with internal states



$$\partial_t c(x, t) = D\Delta c + s\left(1 - \frac{c}{K}\right)c + \text{noise!}$$



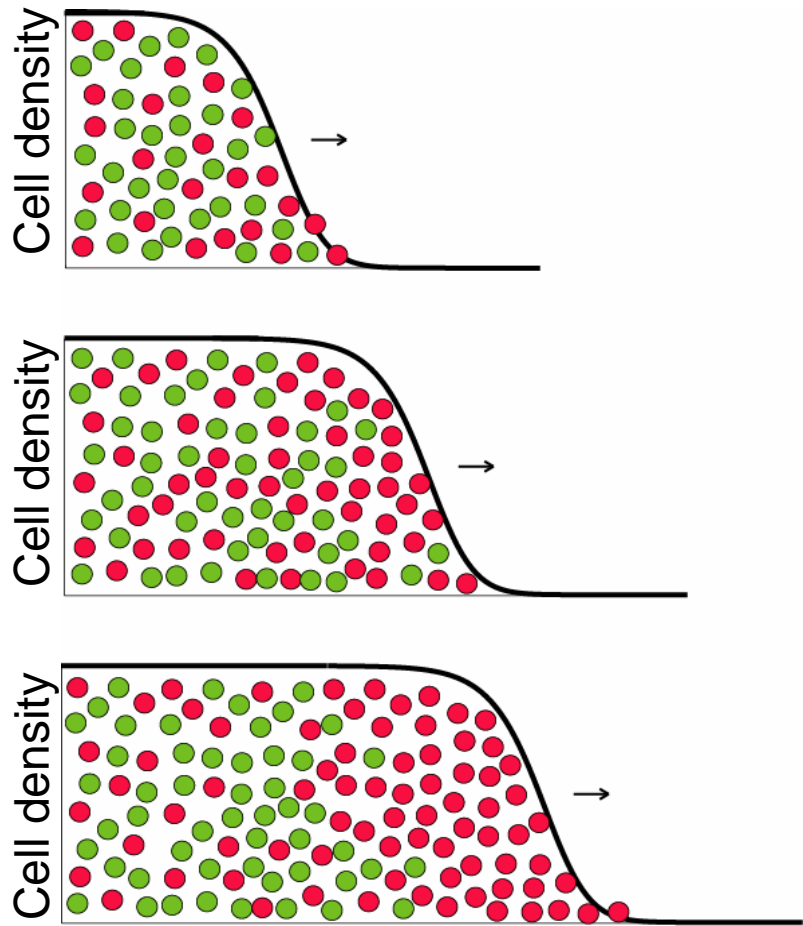
$$\text{velocity} = 2\sqrt{Ds} \times \left\{1 - O(\ln^{-2} K)\right\}$$



R. A. Fisher (1937)

E. Brunet, B. Derrida (1997)

Number fluctuations cause demixing in 1d



Mixed initial condition



Number fluctuations

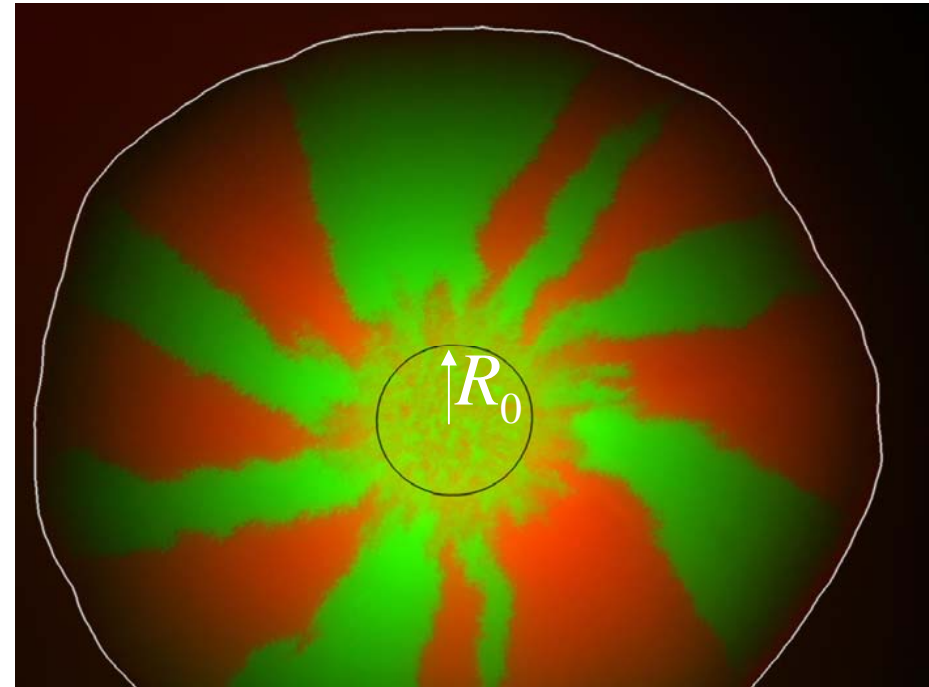
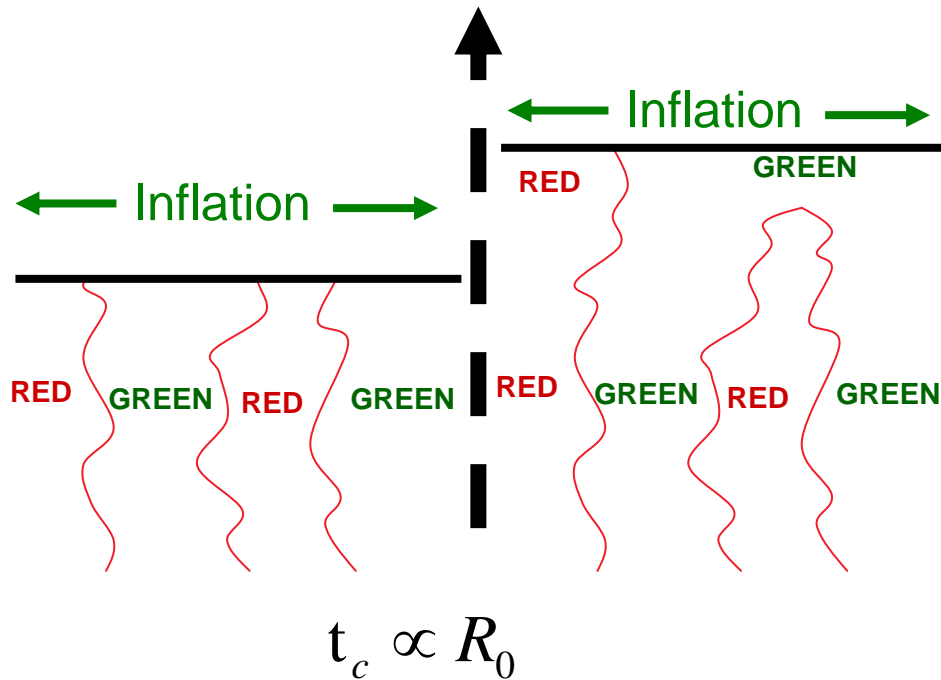


Demixed frontier

= absorbing state

$$T_{\text{fixation}} = O(\ln^\alpha K)$$

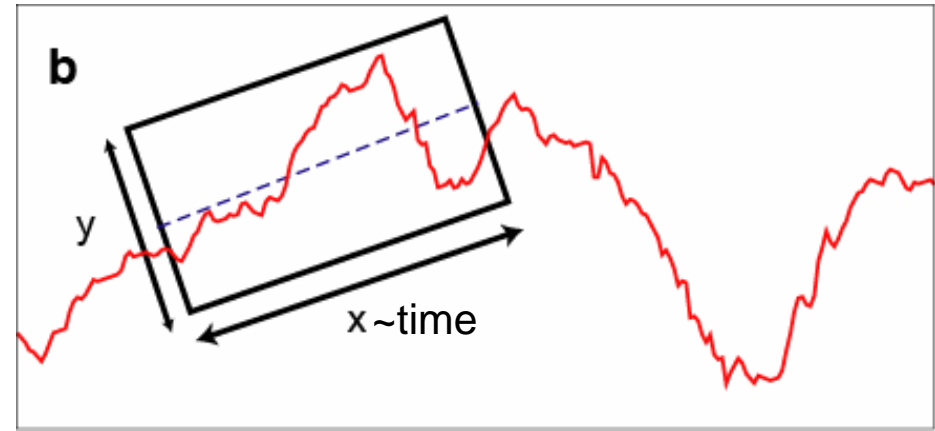
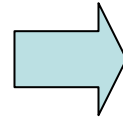
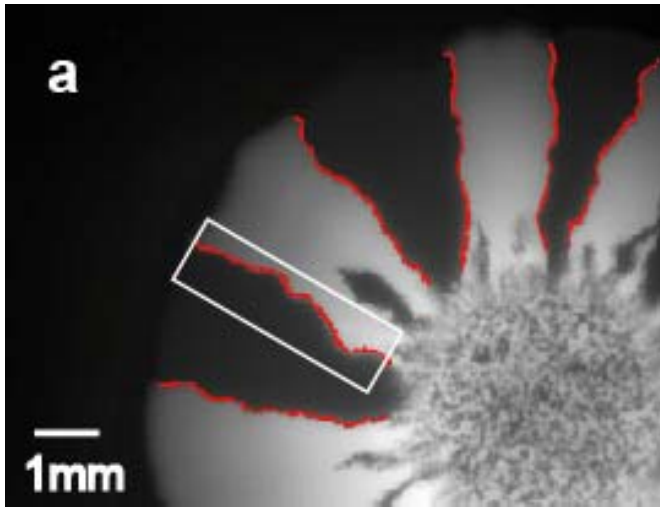
Annihilating random walker model with “inflation”



$$\langle \# \text{Sectors} \rangle = \sqrt{2\pi R_0 / D_W}$$

... assuming regular diffusion.

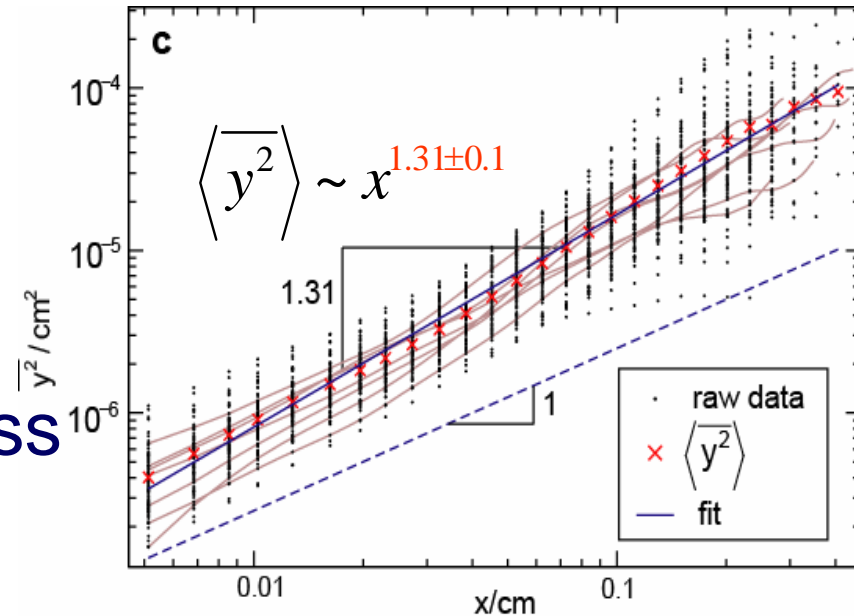
Meandering of domain boundaries



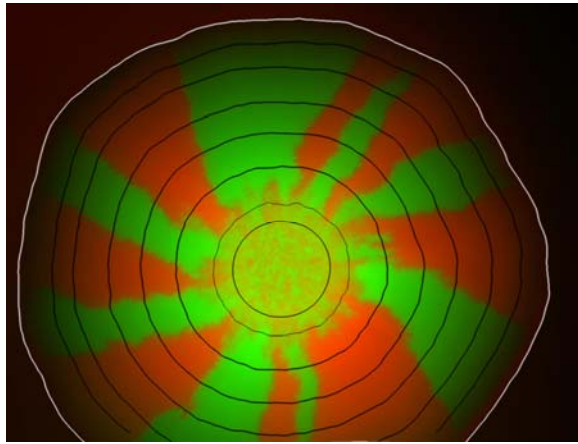
Wandering is **superdiffusive!**

Why?

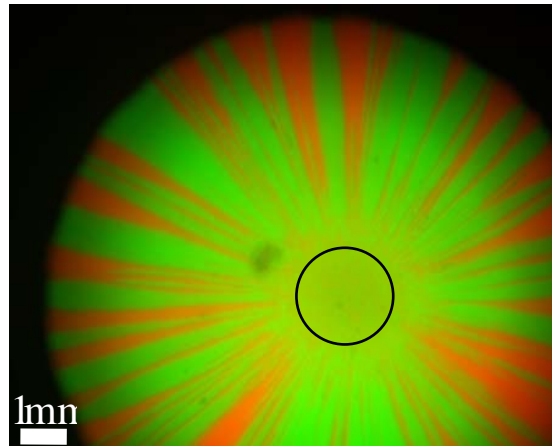
Hypothesis: surface roughness guides wandering $\Rightarrow \langle y^2 \rangle \sim x^{4/3}$



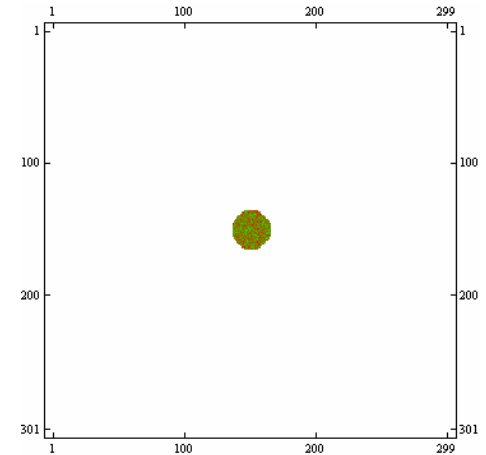
Demixing & coarsening are generic



E. coli



S. Cerevisiae

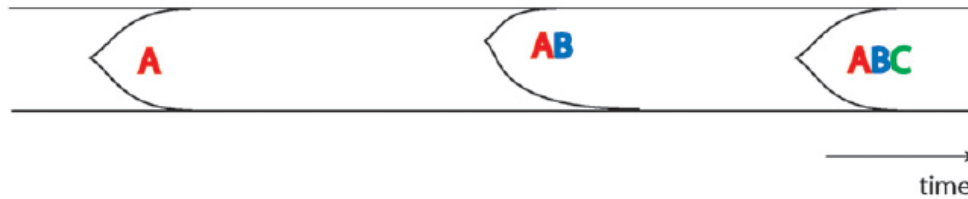


Simulations

Summary:

- Genetic sectoring patterns are characteristic for simple range expansions.
- Can be explained by effects of chance alone.

Speed of adaptation in asexuals – Rep.: The wellmixed case

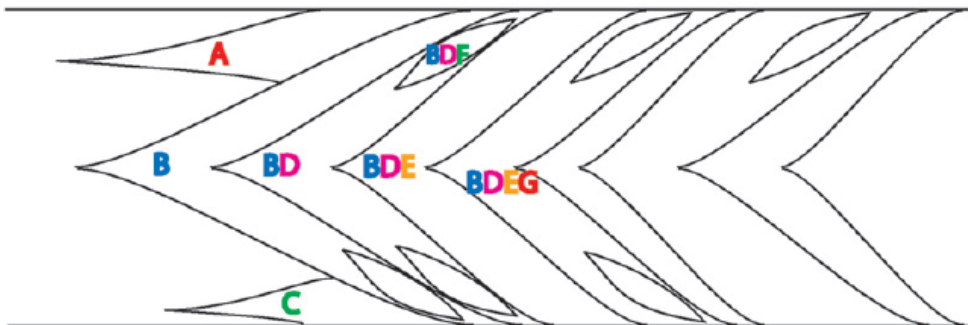


Periodic selection regime

Beneficial mutations occur at rate NU_b
become established with probability $2s_0$

➔ $R \equiv \langle \partial_t W \rangle = (NU_b)(2s_0)s_0$

Fixation time $\log(Ns_0)/s_0 \ll (2s_0NU_b)^{-1}$ waiting time

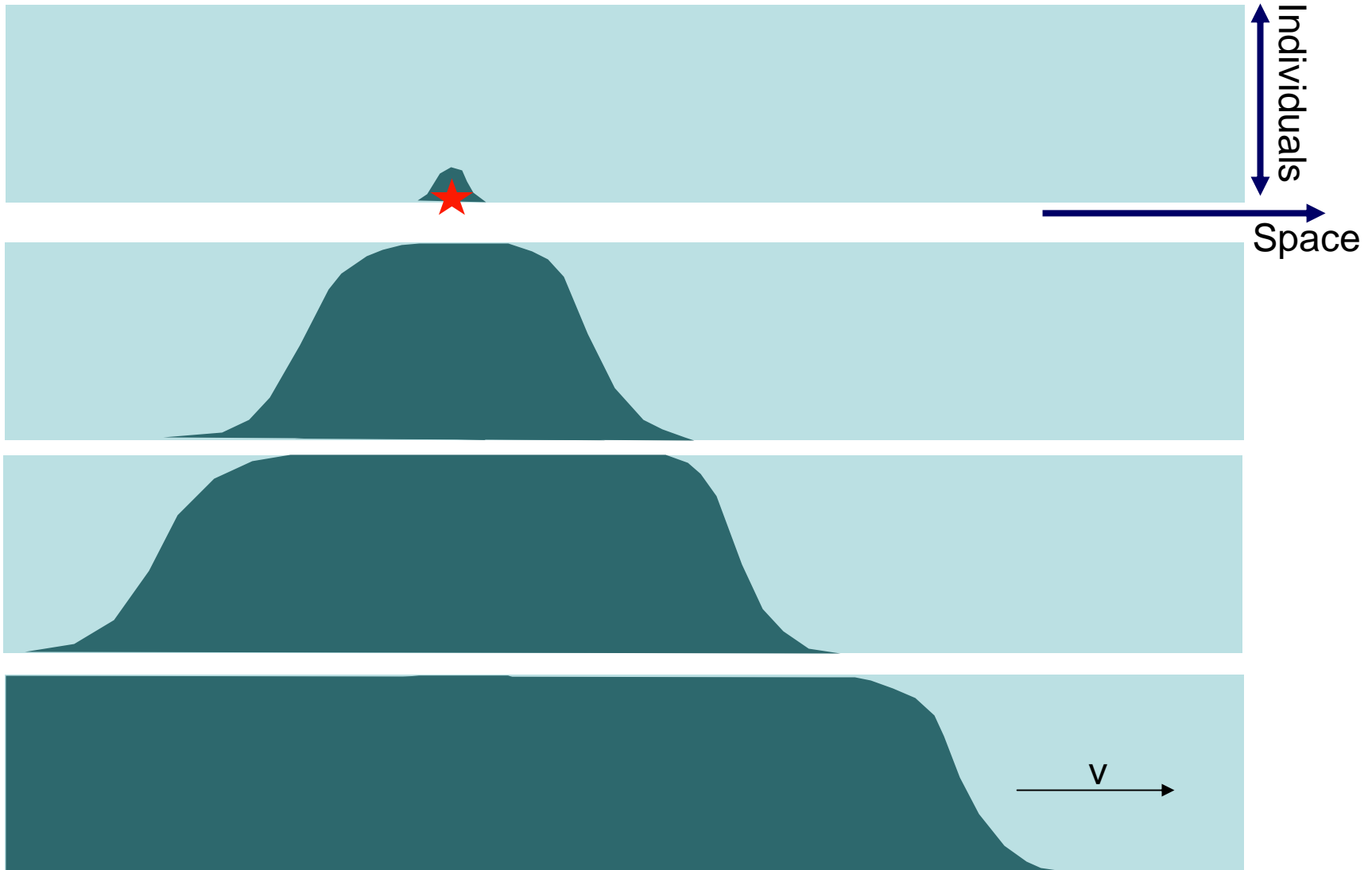


Clonal interference regime

$$R \sim \frac{s_0^2 \ln(N)}{\ln^2(U_b / s_0)}$$

Distribution of fitness effects matters!

Selective sweeps in 1 dimension



Selective sweeps in 1 dimension

$$\partial_t p(x,t) = D\Delta p + sp(1-p) + \frac{\eta}{K} \sqrt{p(1-p)}$$

Noisy Fisher-Kolmogorov equation

- Establishment probability: $2s$

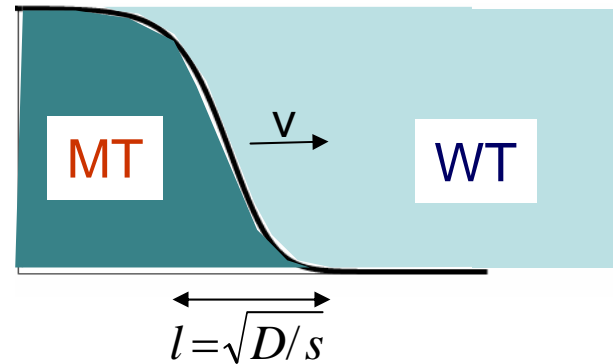


- Wave speed depends on

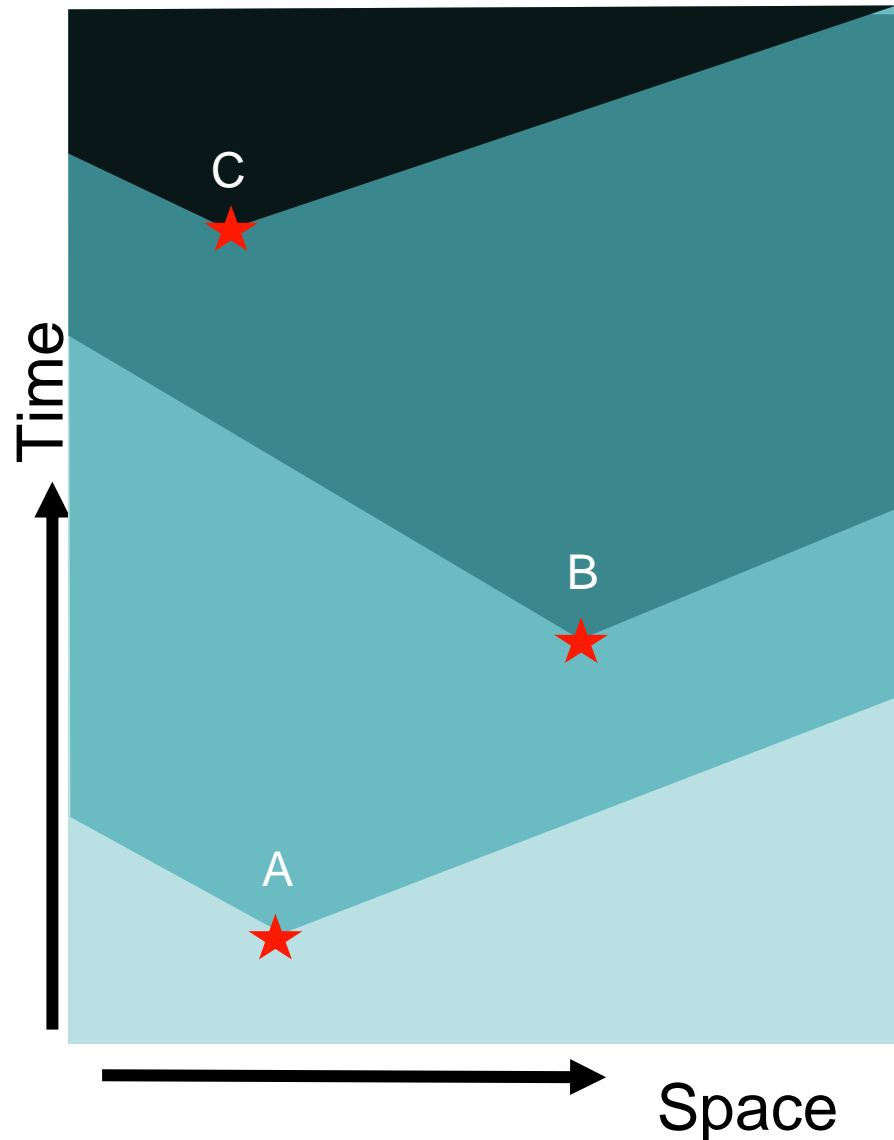
$$"Ns" \equiv Kls = K\sqrt{D/s}s = K\sqrt{Ds}$$

$$\left\{ \begin{array}{l} "Ns" \gg 1, \quad v = 2\sqrt{Ds} \\ \text{R. A. Fisher (1937)} \end{array} \right.$$

$$\left\{ \begin{array}{l} "Ns" \ll 1, \quad v = 2KDs \\ \text{Doering et al. (2003)} \end{array} \right.$$



Speed of evolution — $R \equiv \langle \partial_t W \rangle = ?$



Suppose: all new mutations confer the same selective advantage s_0

$$\rightarrow R_{1D} = NU_b (2s_0) s_0 = R_{0D}$$

(periodic selection)

Dimensional analysis:

$r \equiv R / s_0 = [T^{-1}]$ can only depend on

$$\mu_b \equiv U_b K (2s_0) \quad [(LT)^{-1}]$$

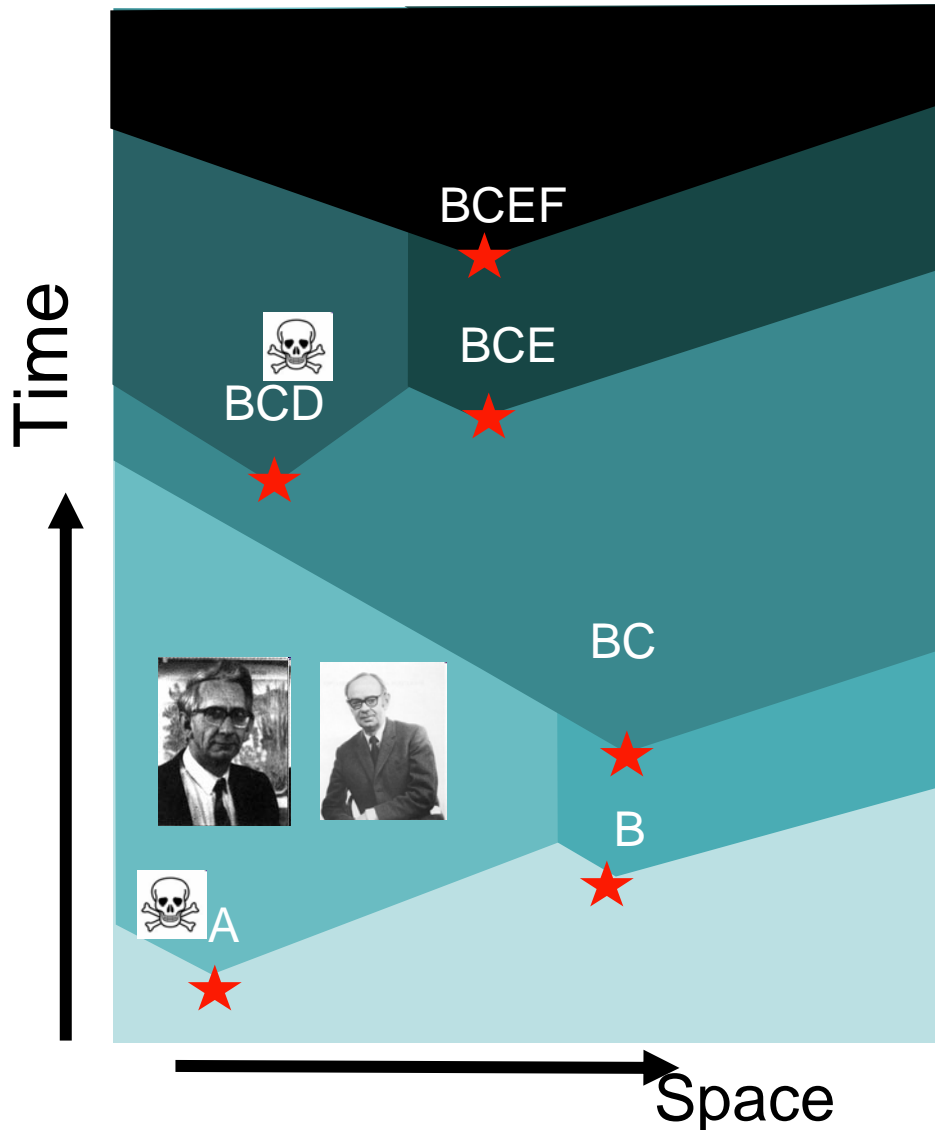
$$v \quad [L/T]$$

$$L_{\text{tot}} \quad [L]$$

Periodic selection for $\mu_b L_{\text{tot}} \ll v/L_{\text{tot}}$

$$r_{1D} = \mu_b L_{\text{tot}}$$

Speed of evolution – clonal interference



In general, a fraction F of beneficial mutations is lost by Hill & Robertson.

$$r = L_{tot} \mu_b F \left(\frac{L_{tot}}{\sqrt{v/\mu}} \right)$$

Expectation:

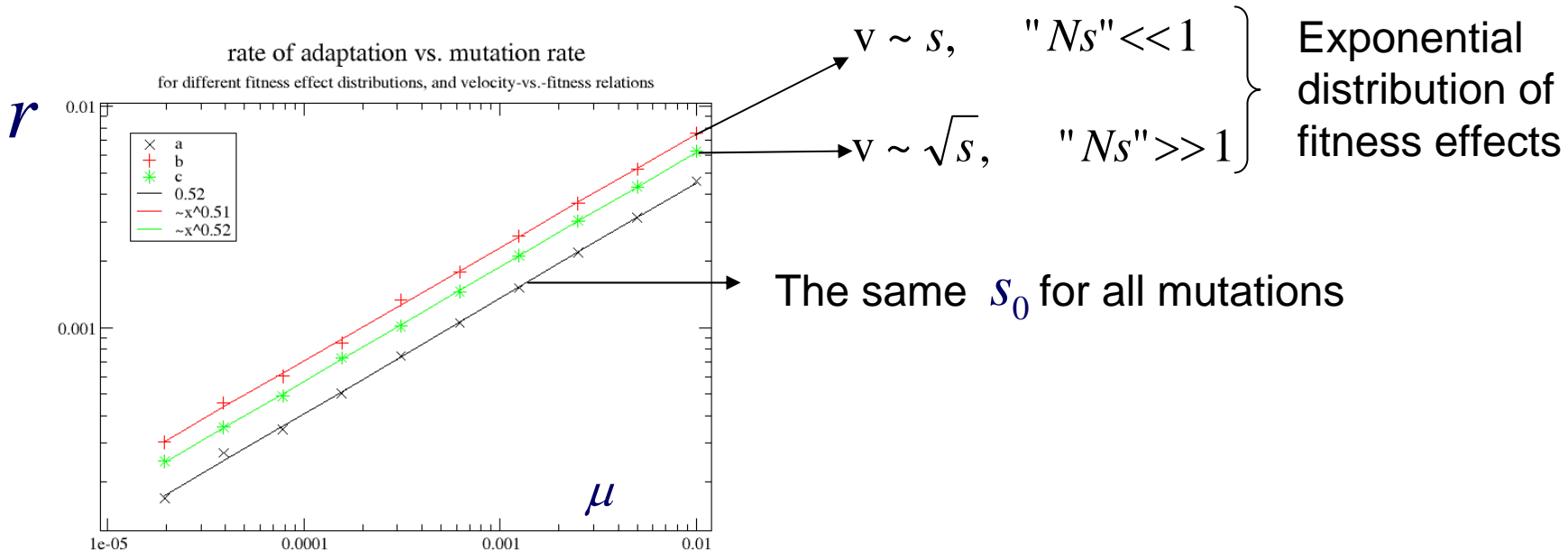
$$F(x) \rightarrow \begin{cases} 1, & \text{for } x \rightarrow 0 \\ \text{const.}/x, & \text{for } x \rightarrow \infty \end{cases}$$

i.e., in the clonal interference regime, we have

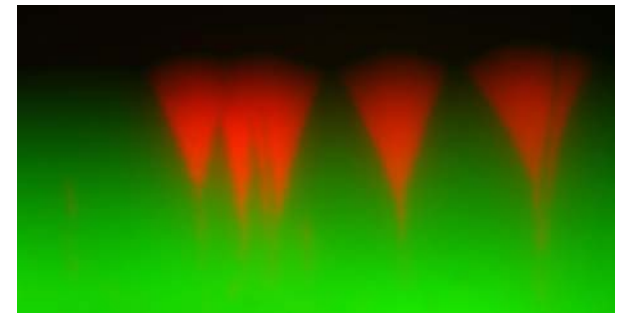
$$R_{1D} \sim \sqrt{U_b K v s_0^{3/2}}$$

Compare with $R_{0D} \sim \frac{s_0^2 \ln(N)}{\ln^2(U_b / s_0)}$

Scaling seems robust



- The scaling $R_{ID} \propto \sqrt{U_b K}$ for large systems seems independent of the distribution of fitness-effects and on relation between velocity and fitness advantage!
- generalization to $D > 1$ straight forward.
- could possibly be tested in microbial experiments.



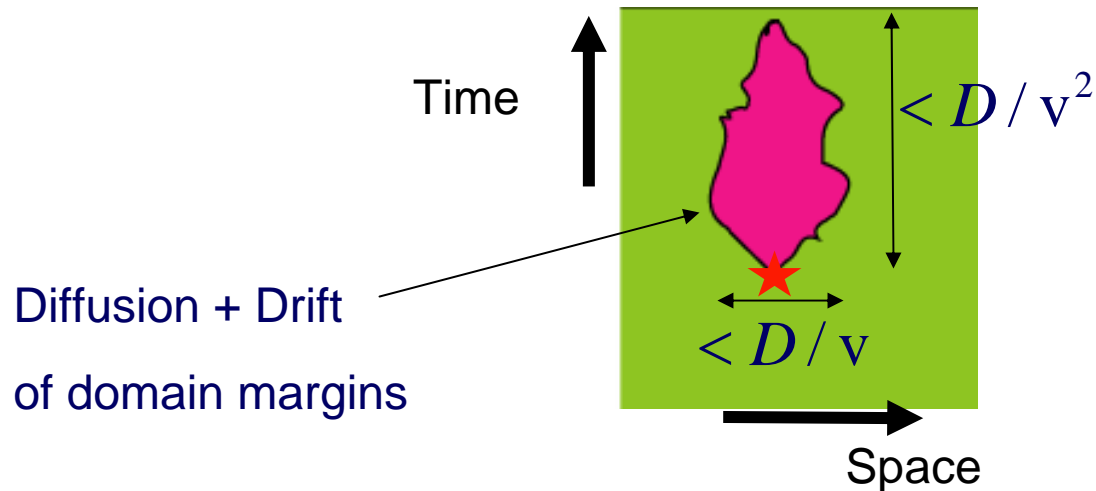
Genetic load

- U_d mutation rate of wildtype into less fit mutant type.
- s selective disadvantage.
- Question: What is the fraction of mutants in equilibrium?

" Ns " $\gg 1$, Deterministic limit \rightarrow Genetic load is as in the well-mixed case

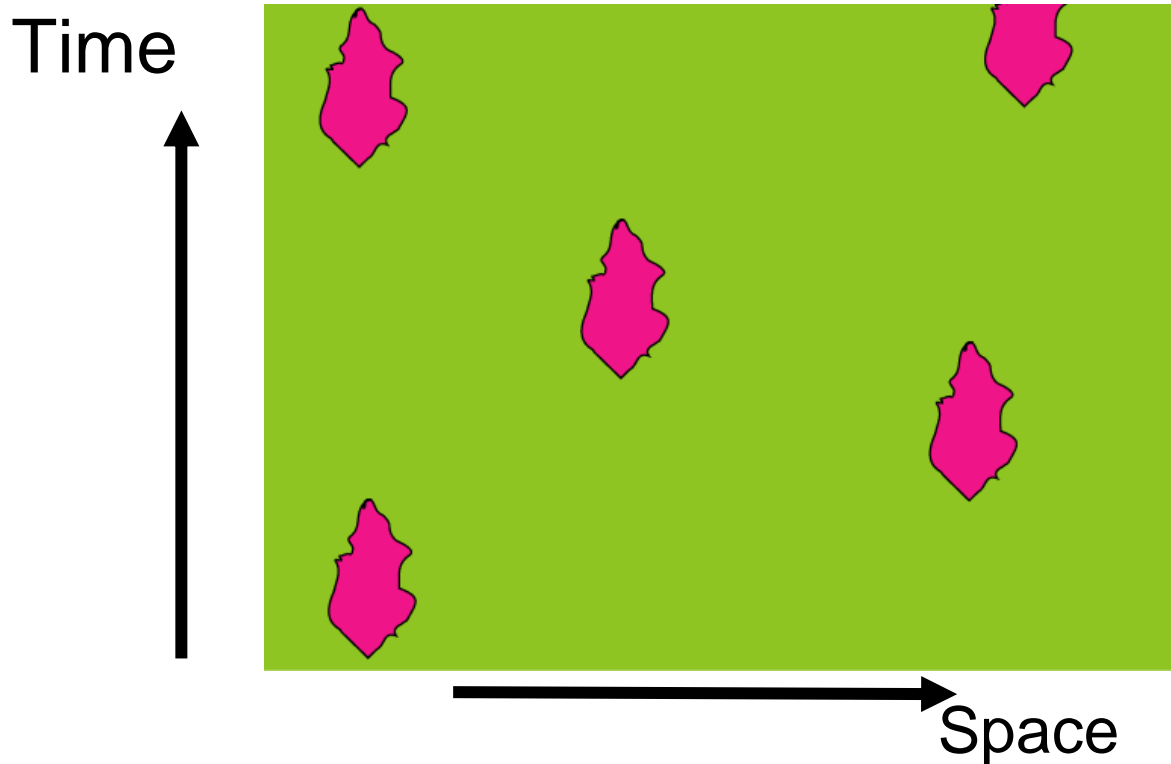
i.e., fraction of mutants $q = \frac{U_d}{s}$

" Ns " $\equiv K\sqrt{Ds} \ll 1$ Weak selection limit \rightarrow "bubbles"



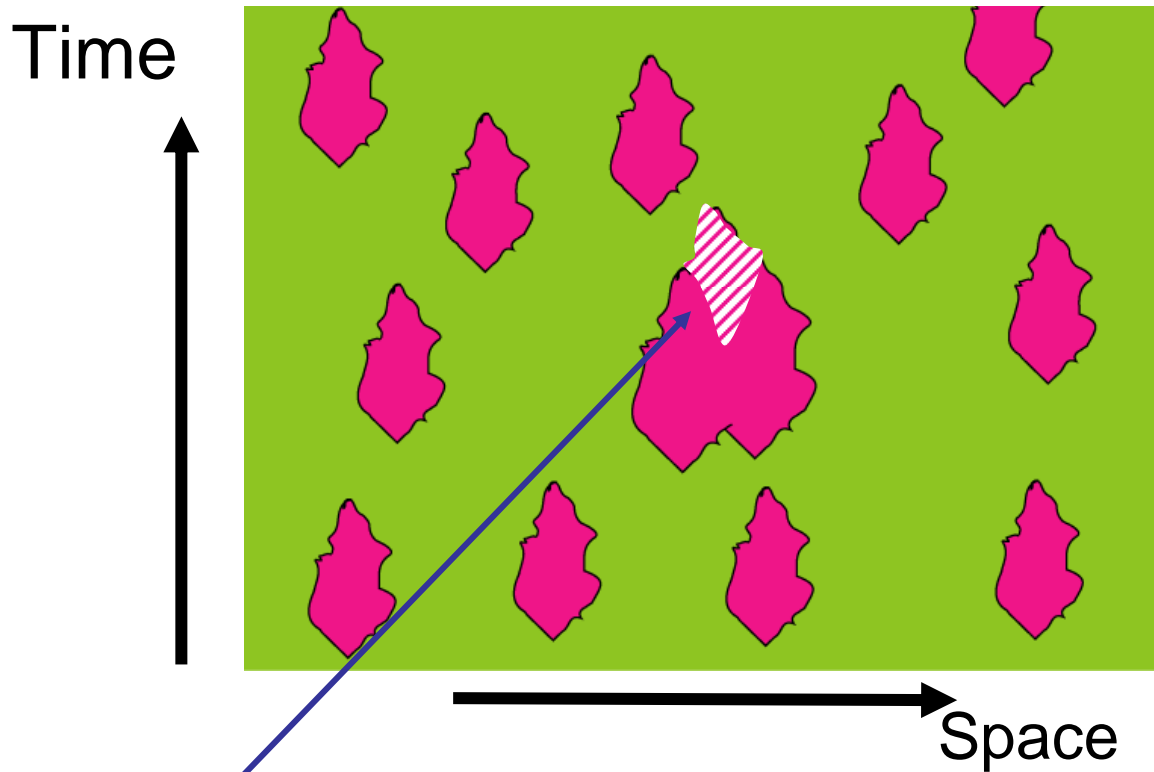
$q = ?$

Genetic load independent bubbles



$$\text{fraction of mutants} \equiv q = \frac{U_d D}{2v^2}, \quad \text{indep. of } K$$

Genetic load, interacting bubbles



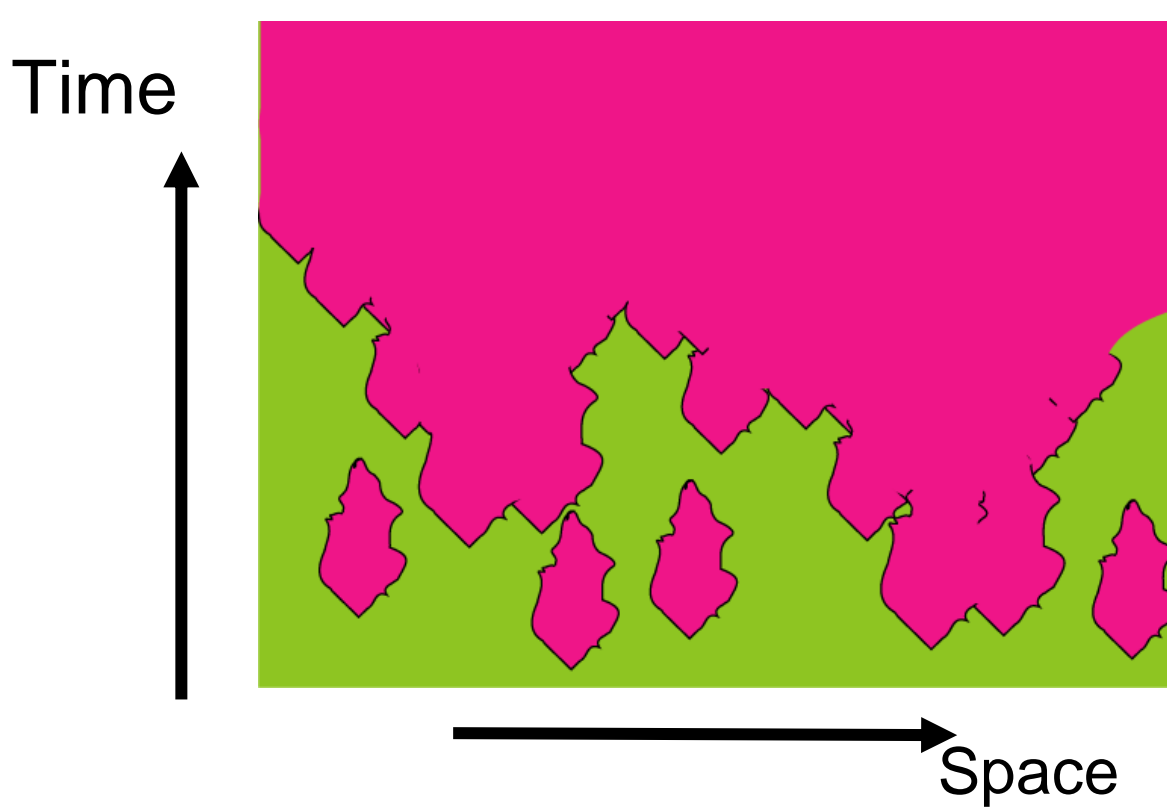
2 x Expected Area
of a single bubble



Expected Area
of a doublet

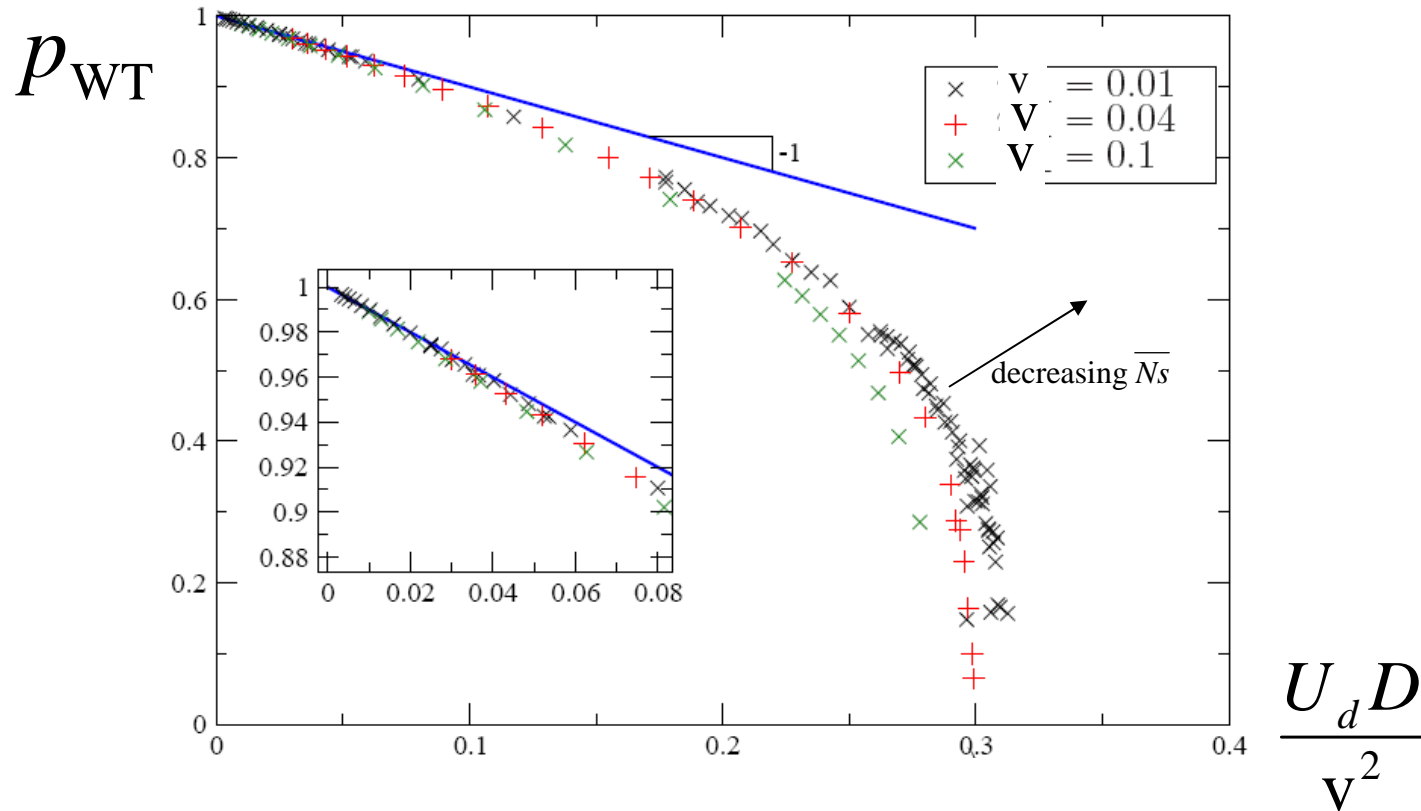
$$q = f\left(\frac{U_d D}{2v^2}\right)$$

Genetic load



Loss of wildtype for $U_d > U_{crit} \sim \frac{v^2}{D} \sim D(Ks)^2$, " Ns " < 1

Genetic load is a function of one compound parameter



Universality class of
“directed percolation”

Summary

Compared to well-mixed populations, Hill-Robertson effects in spatial systems

- have qualitatively different impact
- are more common
- could possibly be tested with microbes

Thanks to ...

- David R. Nelson, Sharad Ramanathan and Pascal Hersen
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- Andrew Murray, Nilay Karahan
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For more information:

O. H., D. R. Nelson (2008) *Theoretical Population Biology* 73, 158-170

O. H., P. Hersen, S. Ramanathan, David R. Nelson (2007) *Proceedings of the National Academy of Sciences USA* 104, 19926-19930

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