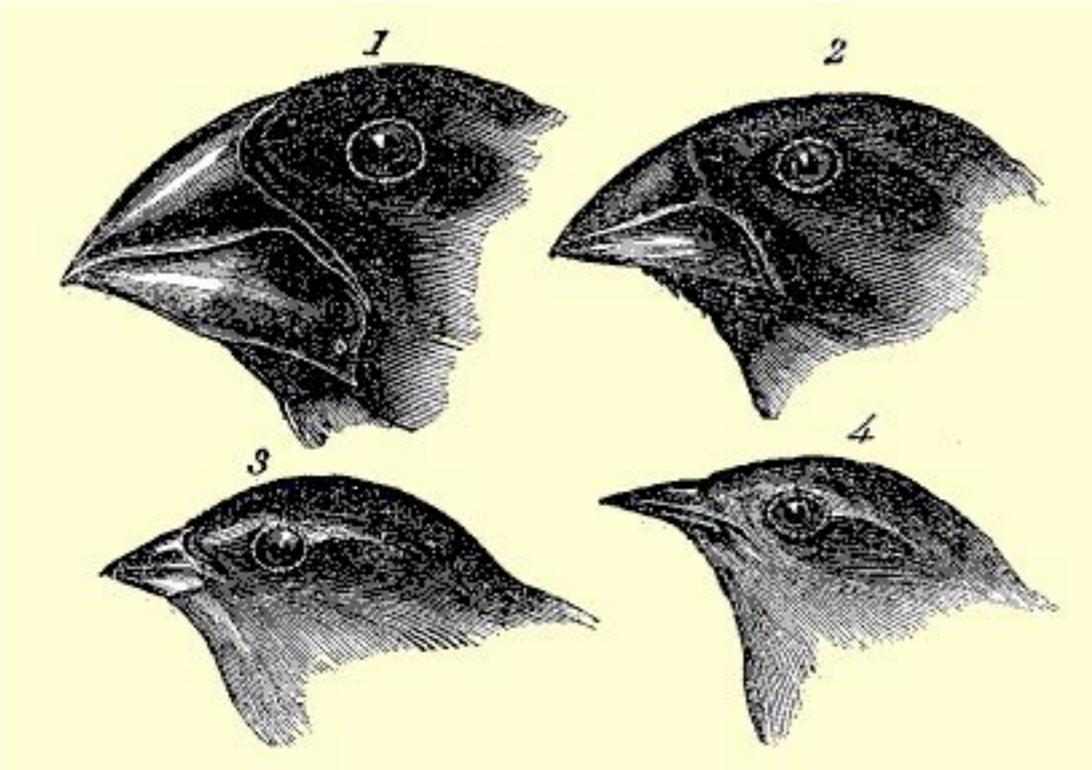




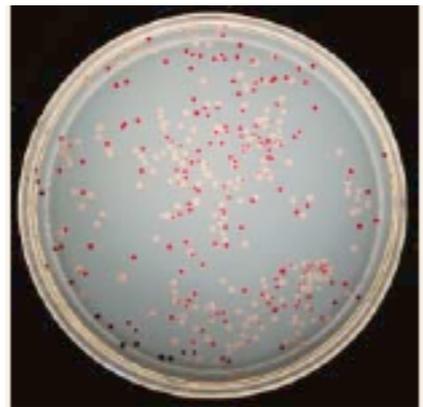
# Darwin's finches



Charles Darwin, On the Origin of Species by Means of Natural Selection or The Preservation of Favoured Races in the Struggle for Life, 24 November 1859, London

# How is evolution studied now

## Fitness Experiments



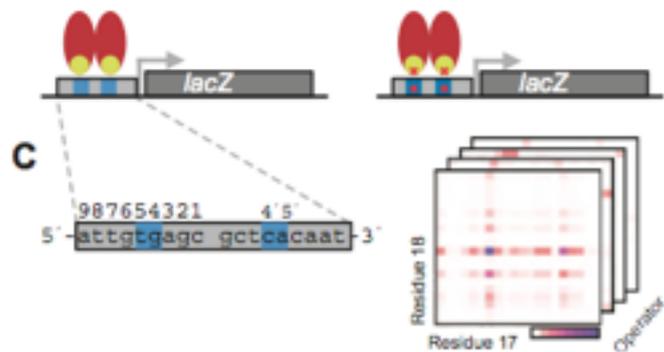
## Theoretical Population Genetics

$$\partial_t q(x_0; x, t) = v(x_0) \frac{\partial q(x_0; x, t)}{\partial x_0} + \frac{D(x_0)}{2} \frac{\partial^2 q(x_0; x, t)}{\partial x_0^2}$$

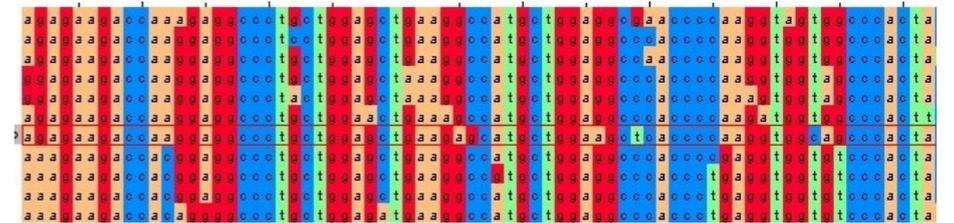
$$v(x_0) = 2N s x_0 (1 - x_0)$$

$$D(x_0) = x_0 (1 - x_0)$$

## Experimental evolution of networks, function



## Inference from Sequence Data (Metagenomics, Phylogeny)



# Evolutionary forces

Mutations:  
beneficial  
deleterious  
neutral

## Genetic Drift

Well understood  
But what do deviations mean?

## Natural Selection

Reduces diversity

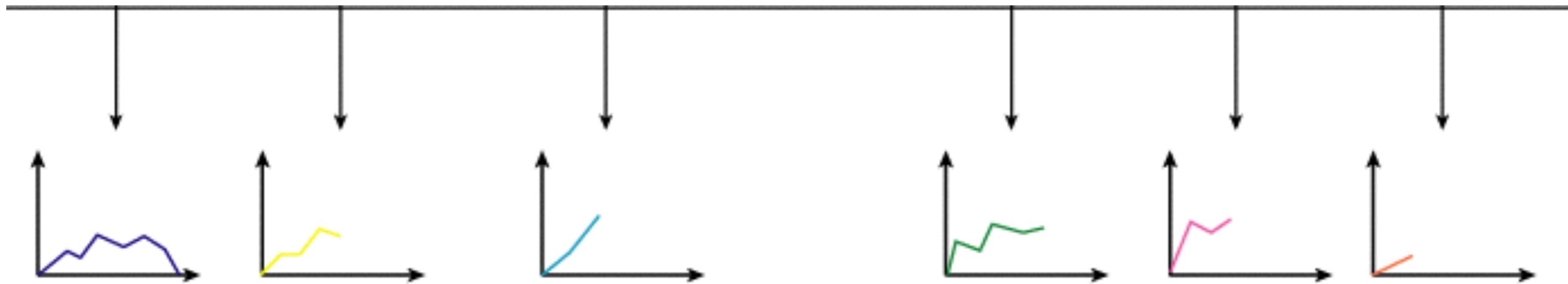


## Demography

Bottlenecks, expansions reduce diversity

## Geography

Environmental structure increases diversity

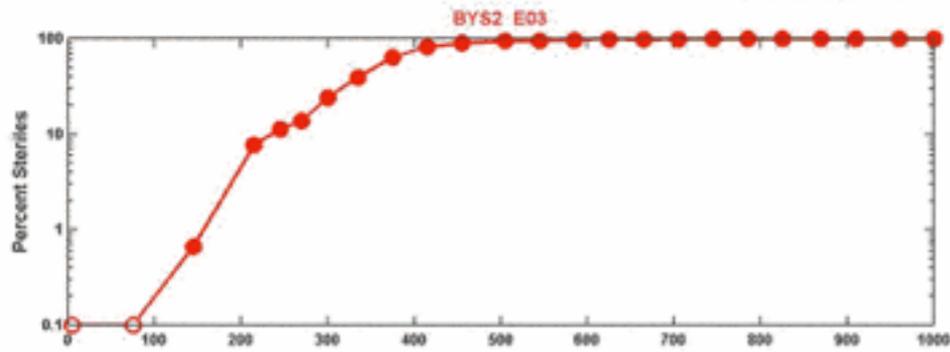
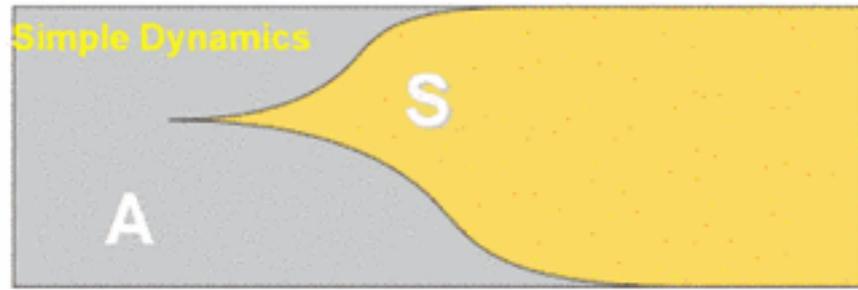


Calculate the fate of each mutant forward in time.

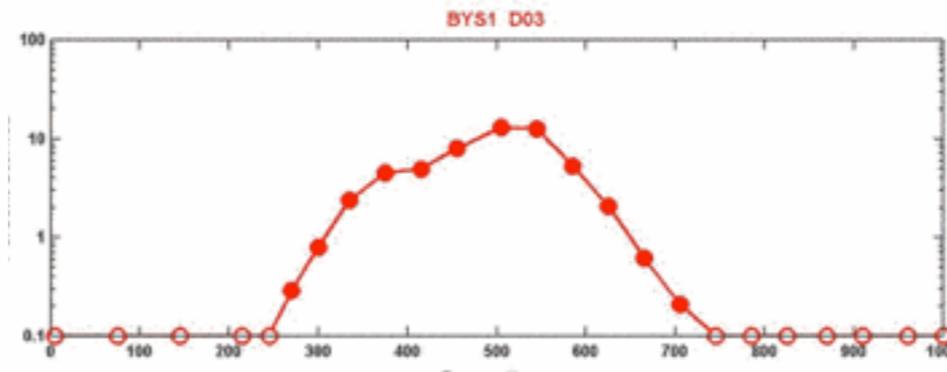
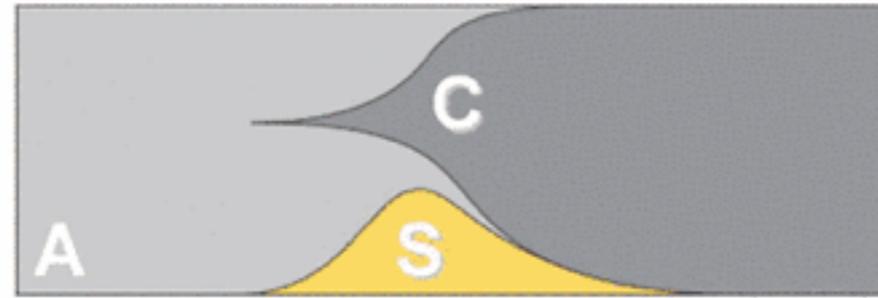
Fate of each mutation is not in steady state

But there is a steady state distribution of the  
distribution of mutant frequencies

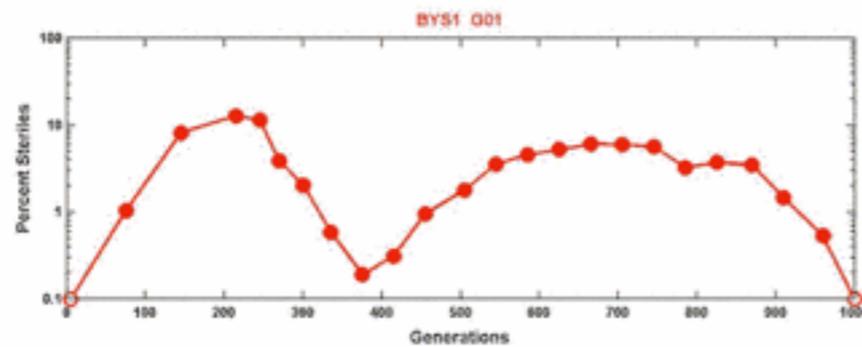
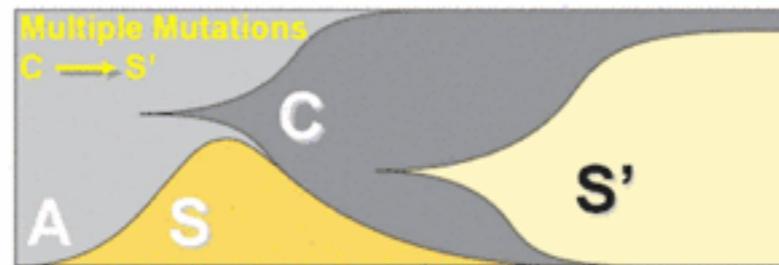
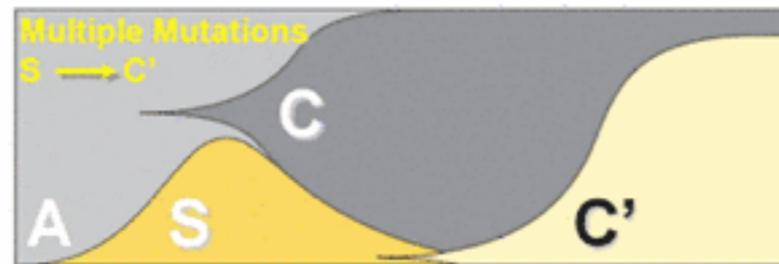
## Simple Selective Sweeps



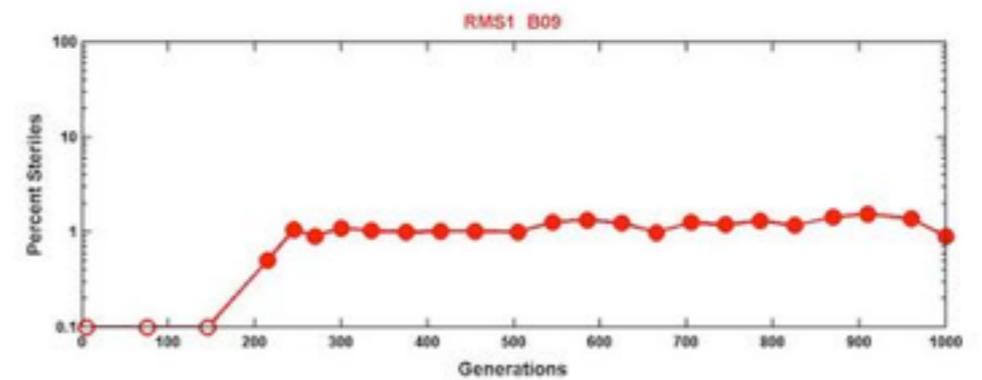
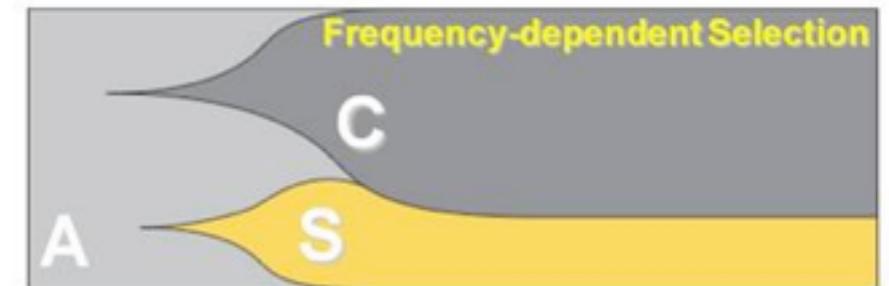
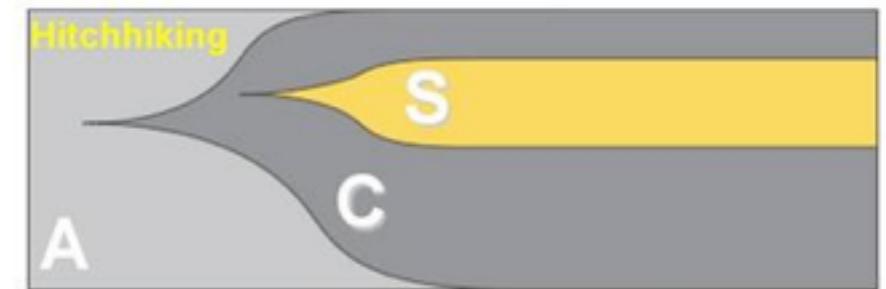
## Clonal Interference



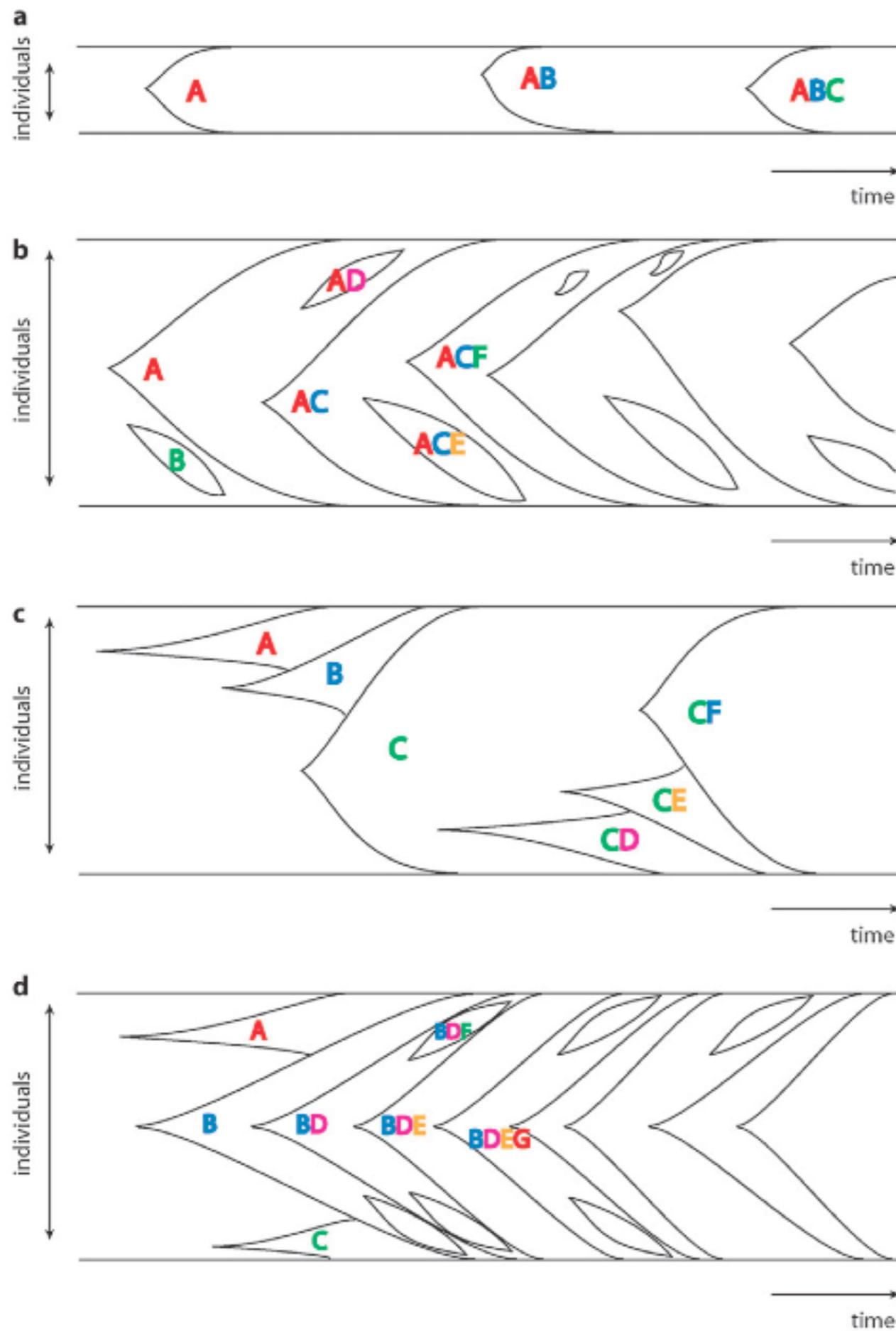
## More Complex Dynamics



## Steady Sterile Frequencies

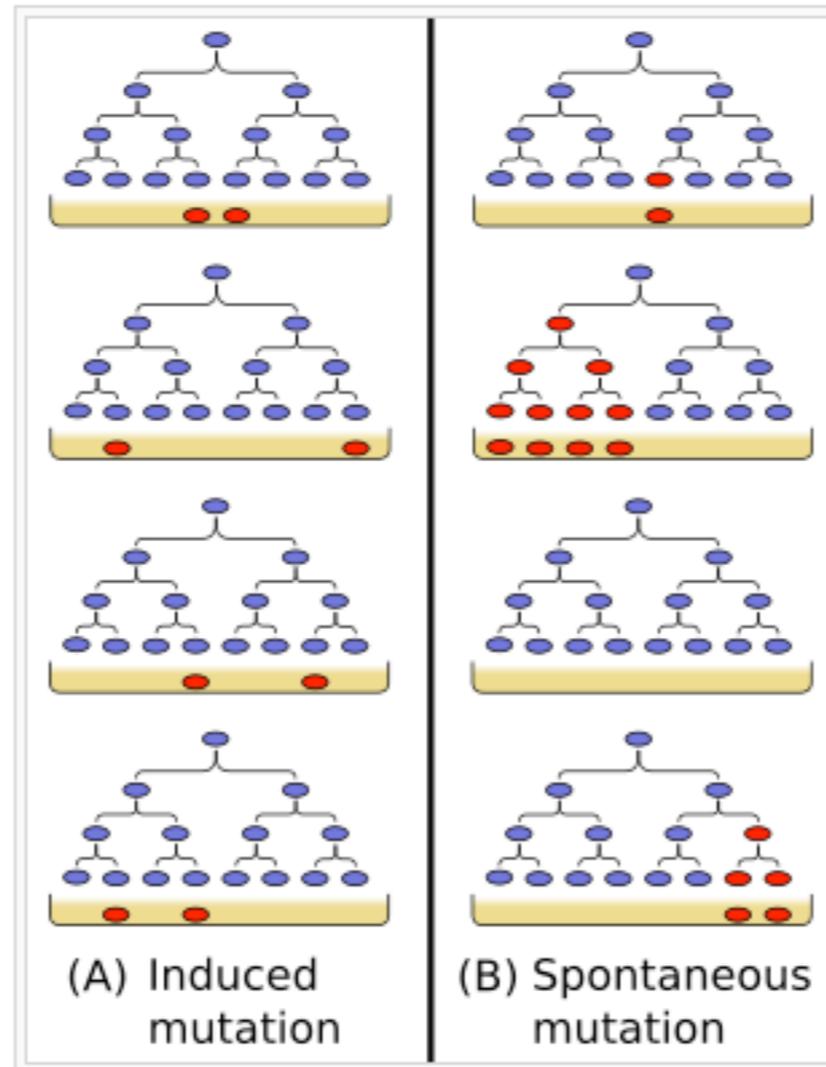


from S. Kryazhimskiy and M. M. Desai



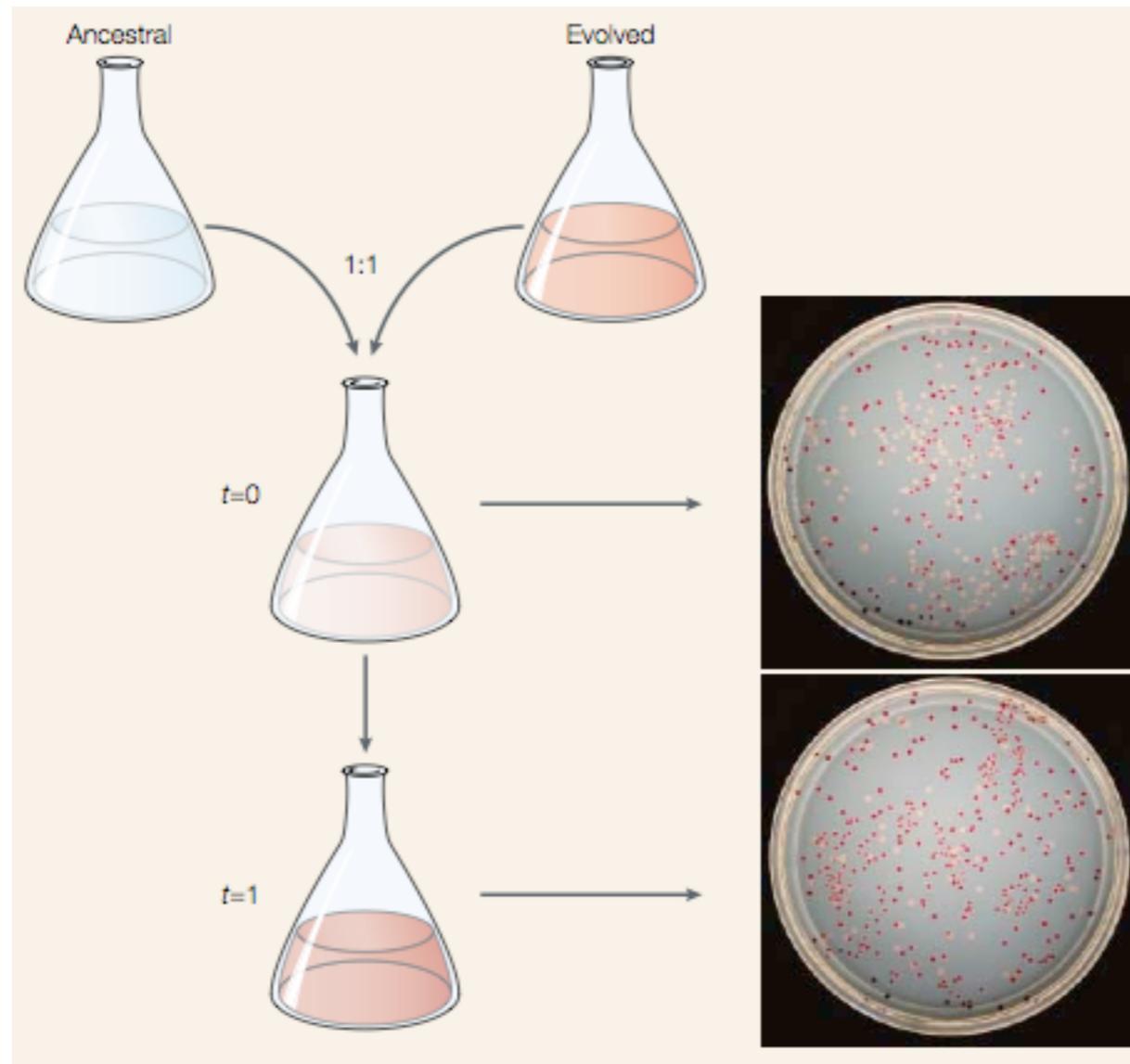
M. M. Desai and D. S. Fisher (2007), "Beneficial Mutation-Selection Balance and the Effect of Linkage on Positive Selection." *Genetics* 176:1759-98 (2007)

# The Luria-Delbrück experiment



SE Luria and M Delbrück, (1943).  
"Mutations of Bacteria from Virus  
Sensitivity to Virus Resistance".  
Genetics 28 (6): 491-511

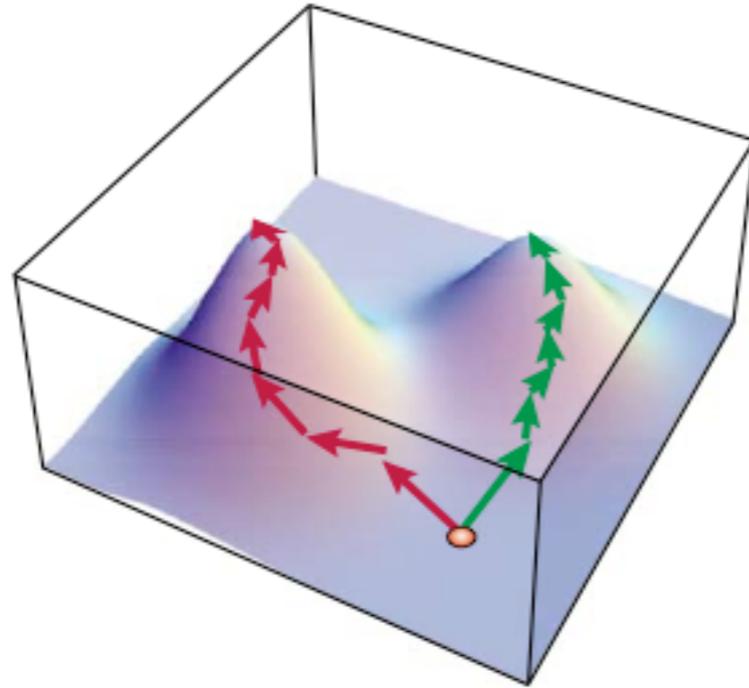
## The Lenski experiment



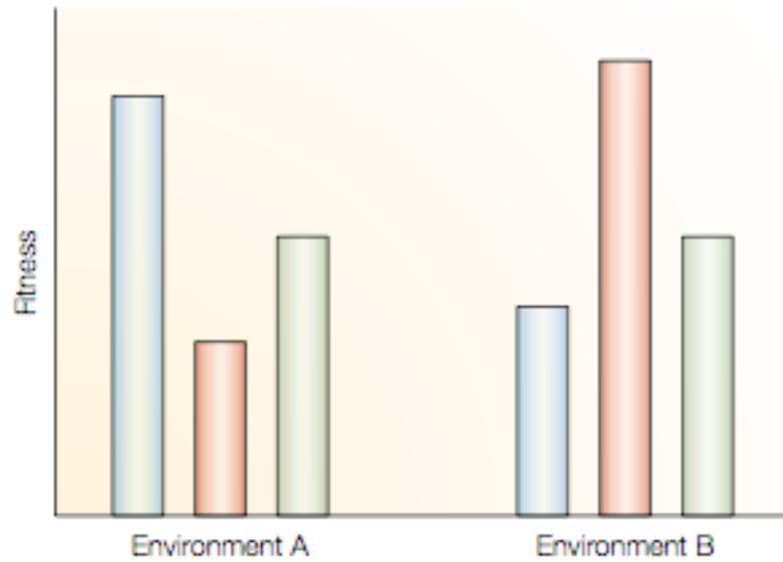
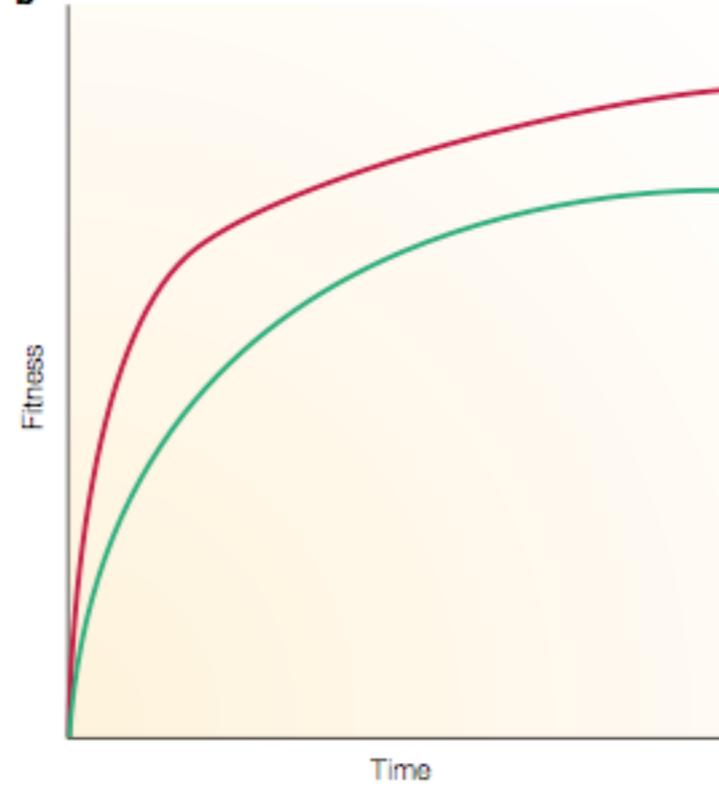
SF Elena and R. E. Lenski. 2003. Evolution experiments with microorganisms: the dynamics and genetic bases of adaptation. *Nature Reviews Genetics* 4:457-469.

# The Lenski experiment

a



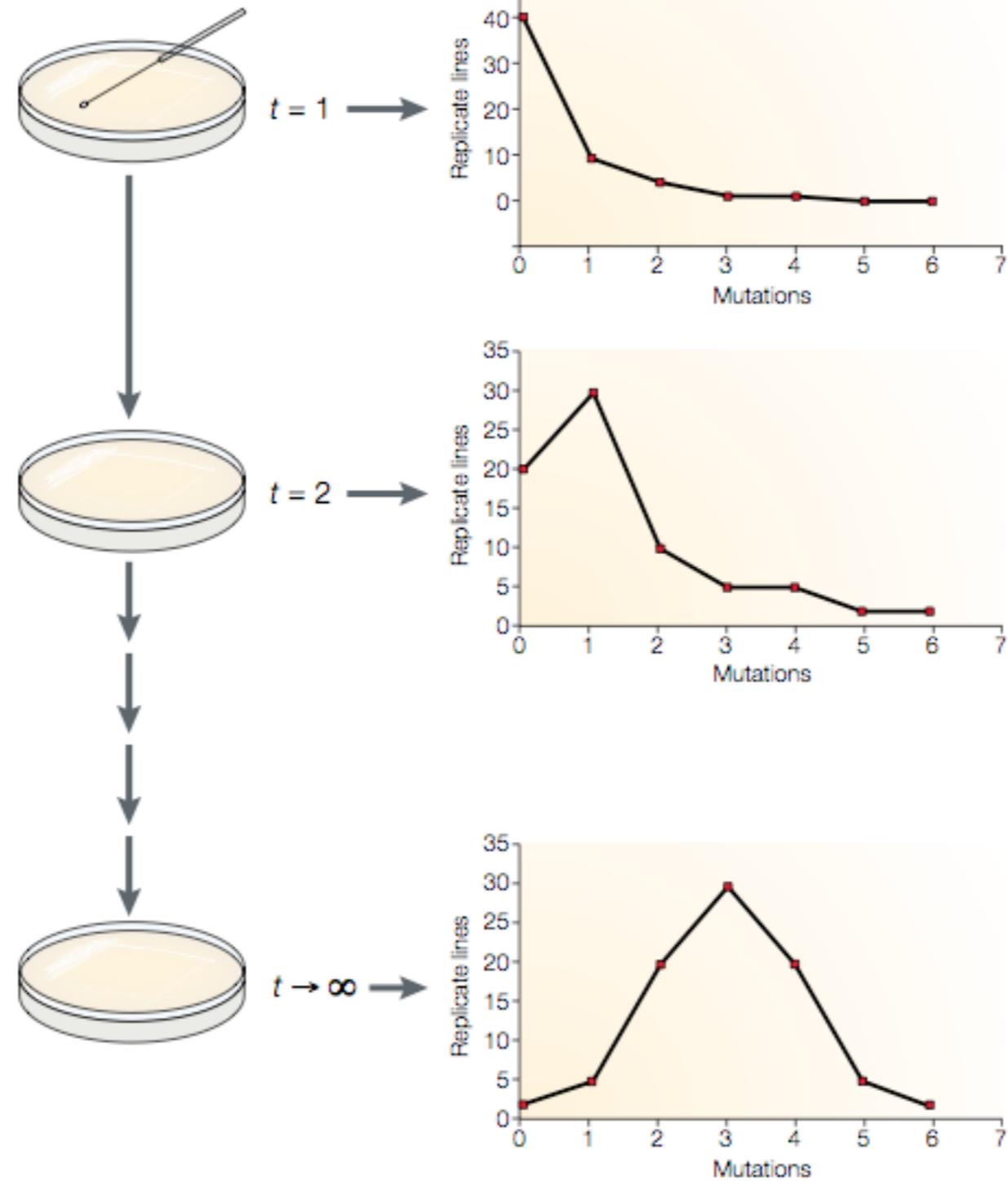
b



- Genotype A, a specialist in A
- Genotype B, a specialist in B
- Genotype C, a generalist

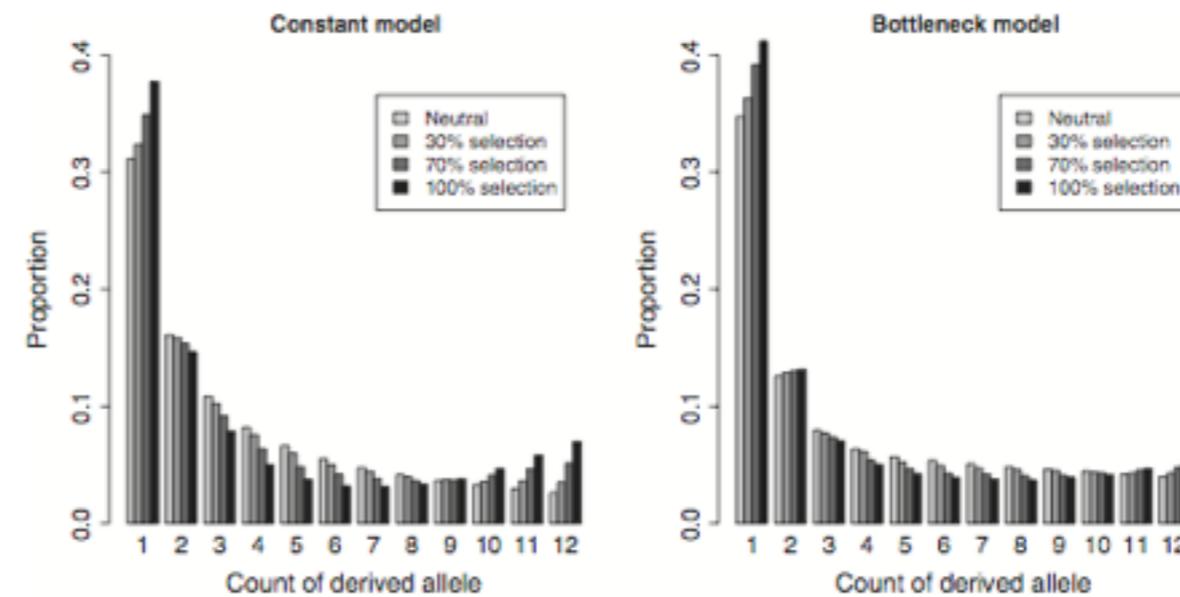
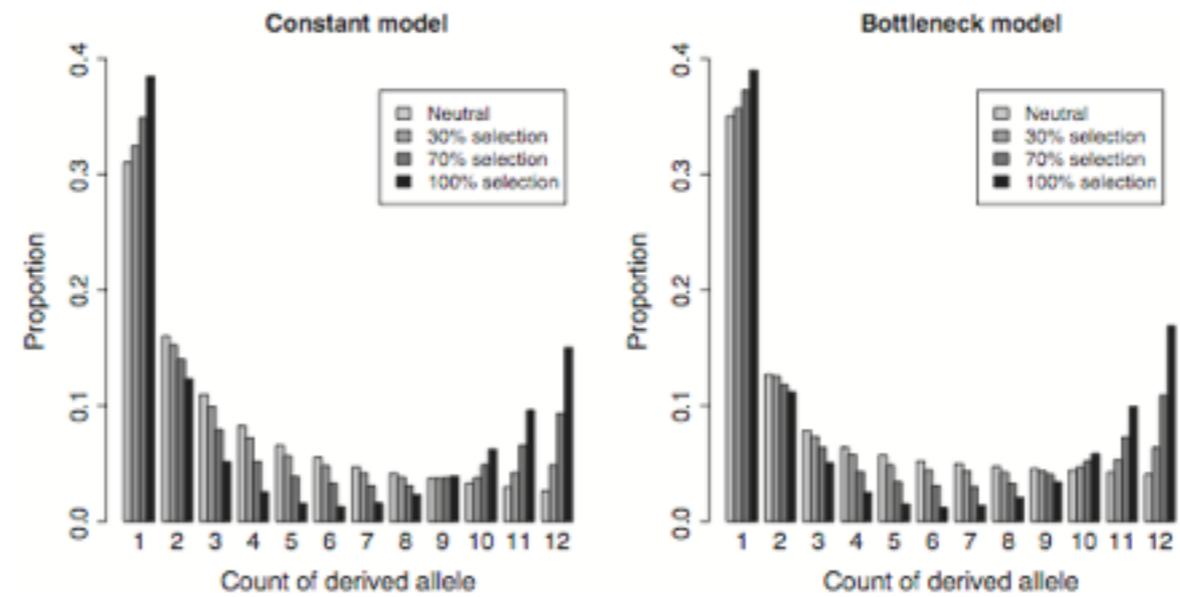
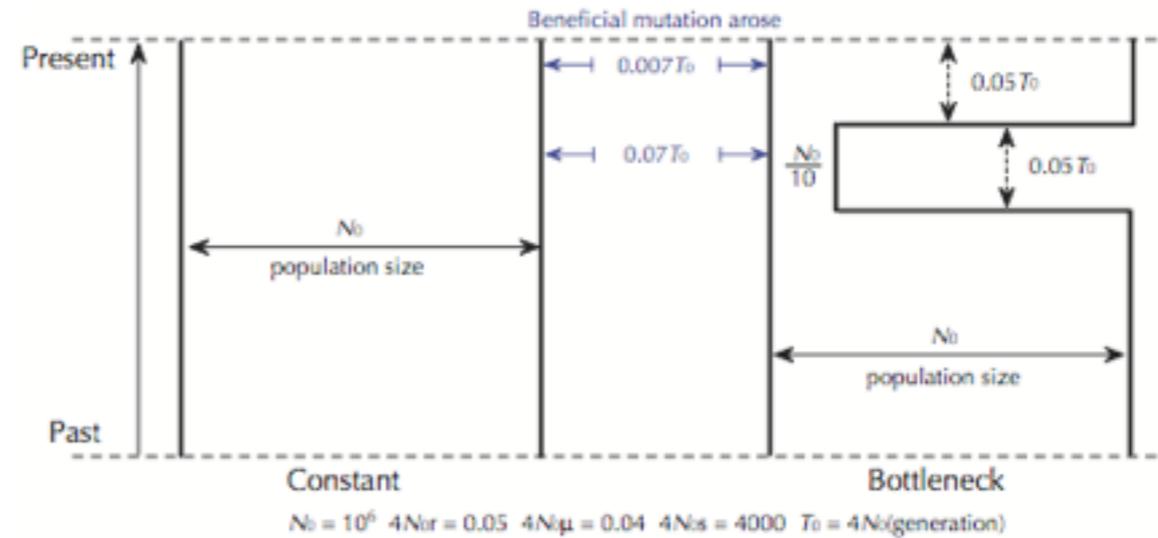
SF Elena and R. E. Lenski. 2003. Evolution experiments with microorganisms: the dynamics and genetic bases of adaptation. *Nature Reviews Genetics* 4:457-469.

# The Lenski experiment



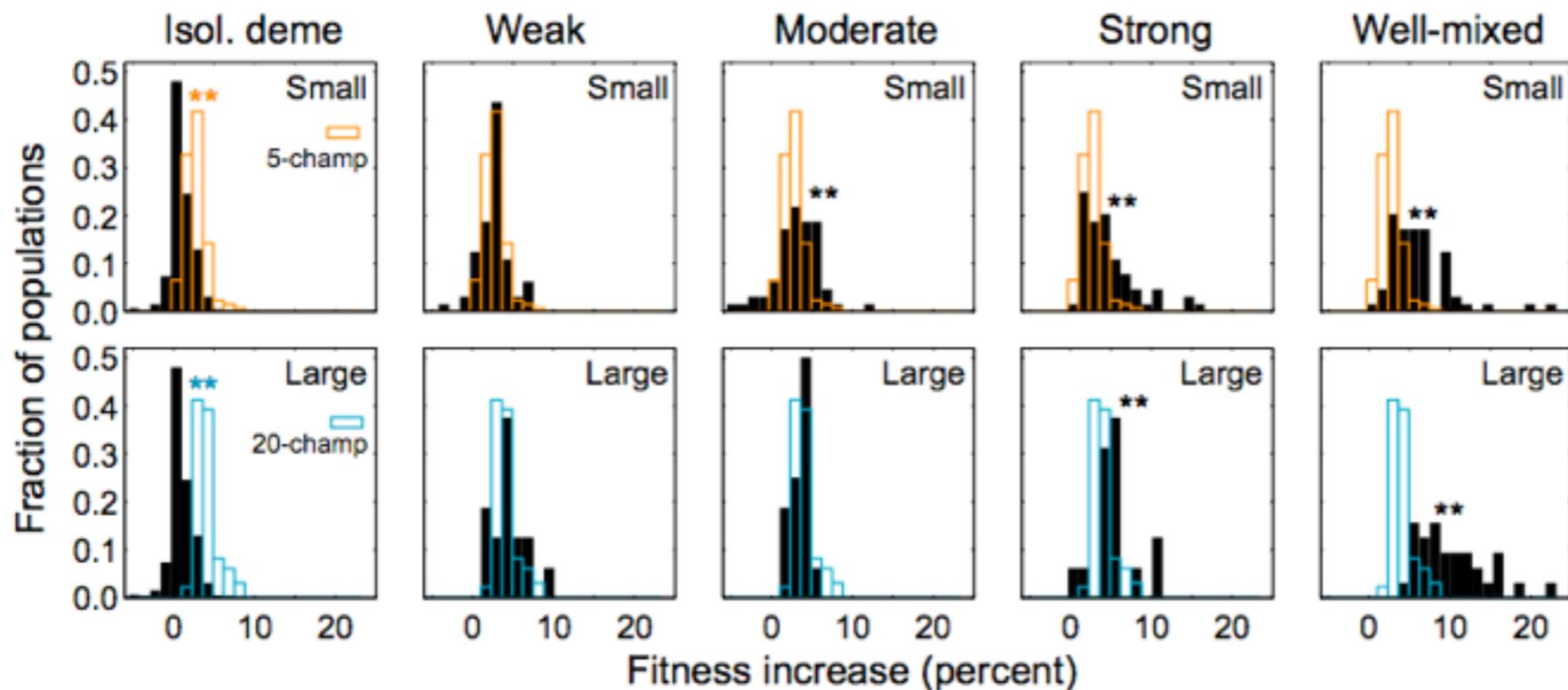
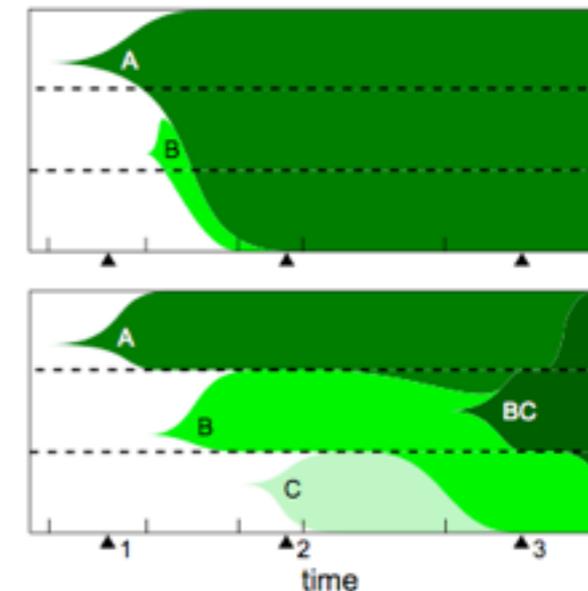
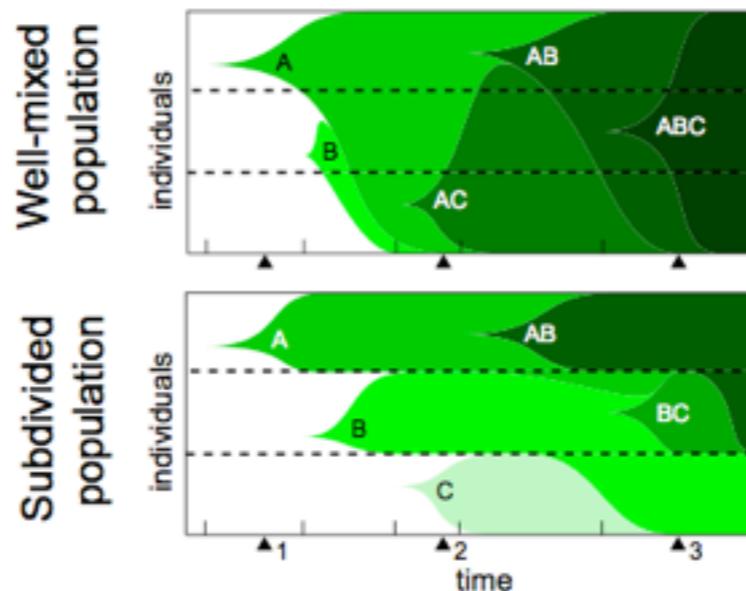
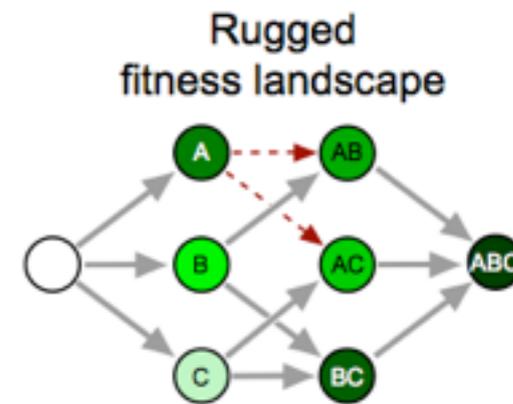
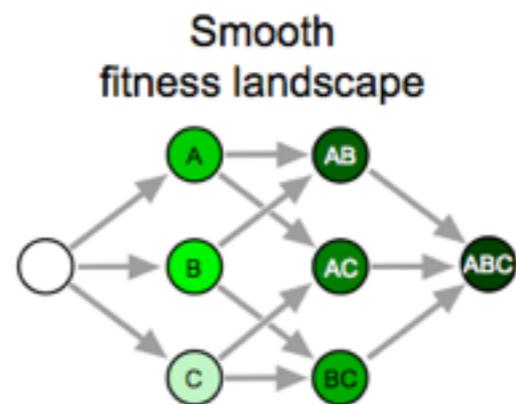
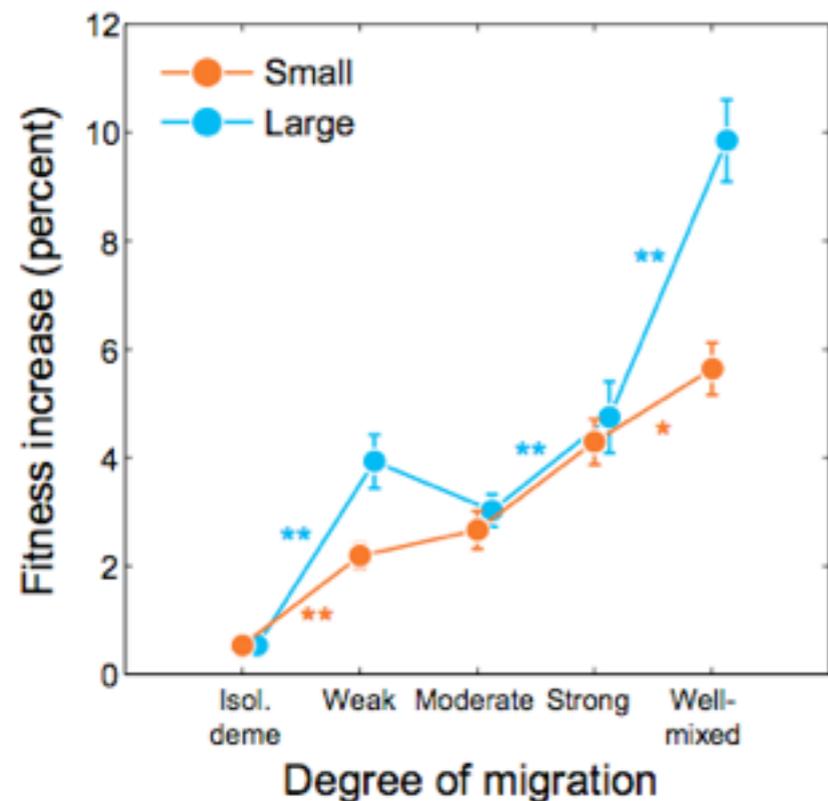
SF Elena and R. E. Lenski. 2003. Evolution experiments with microorganisms: the dynamics and genetic bases of adaptation. *Nature Reviews Genetics* 4:457-469.

# Demography vs Selection



J LI, H LI, M JAKOBSSON, S LI, P SJODIN and M LASCoux  
 Joint analysis of demography and selection in population  
 genetics: where do we stand and where could we go?  
 Molecular Ecology (2011)

# Niches (mixing) and selection

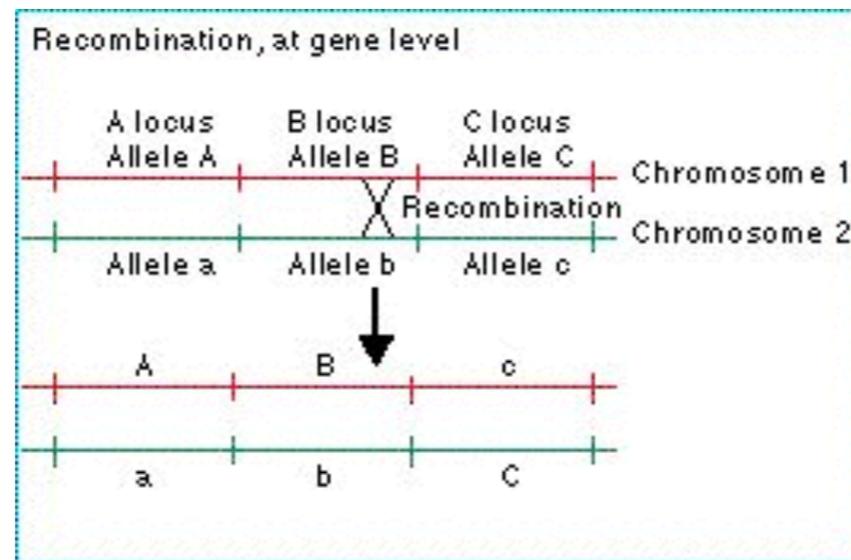


S Kryazhimskiy, DP Rice, MM Desai

Population Subdivision and Adaptation in Asexual Populations of *Saccharomyces cerevisiae*

Evolution (2012)

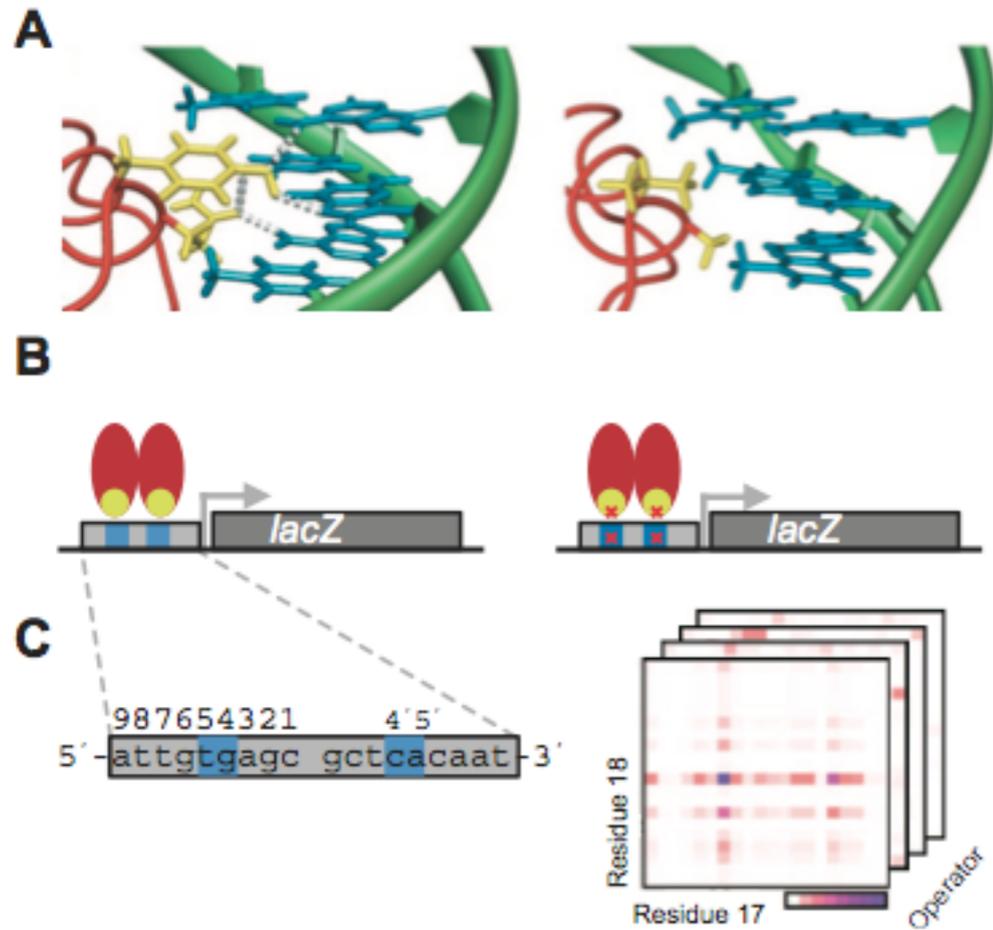
# Sexual reproduction - recombination



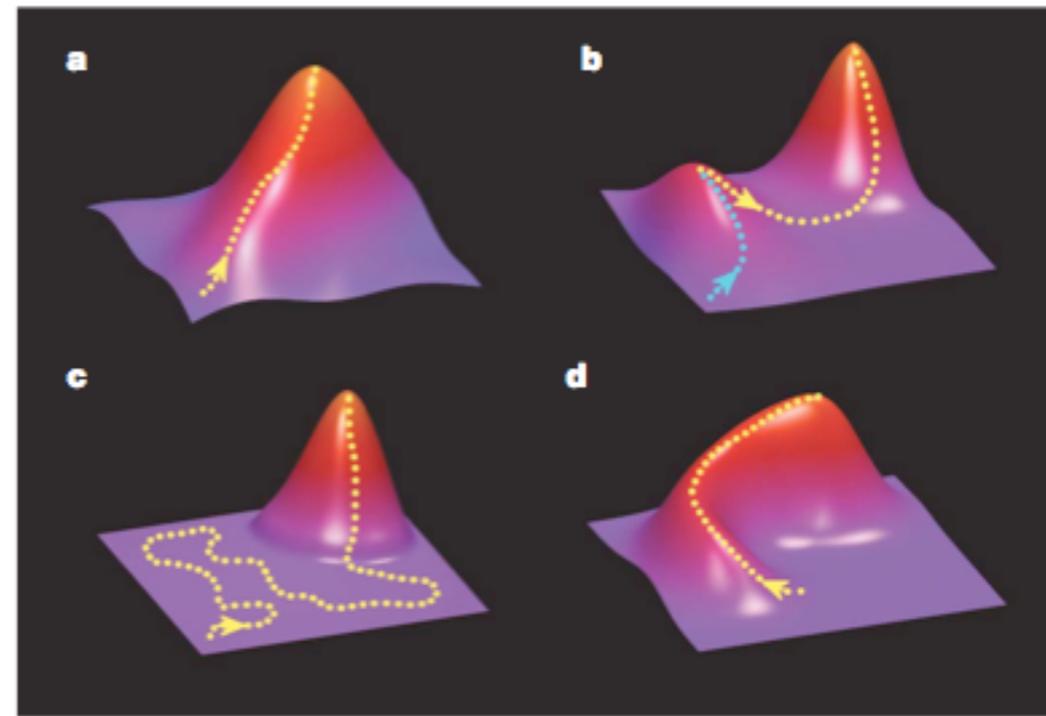
effects of recombination of mutations, effects of selection on recombination ....

how do we distinguish recombination from geographic effects ...

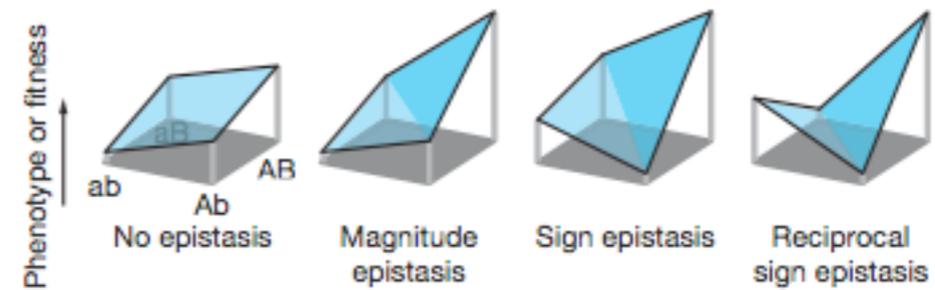
# Molecular evolution



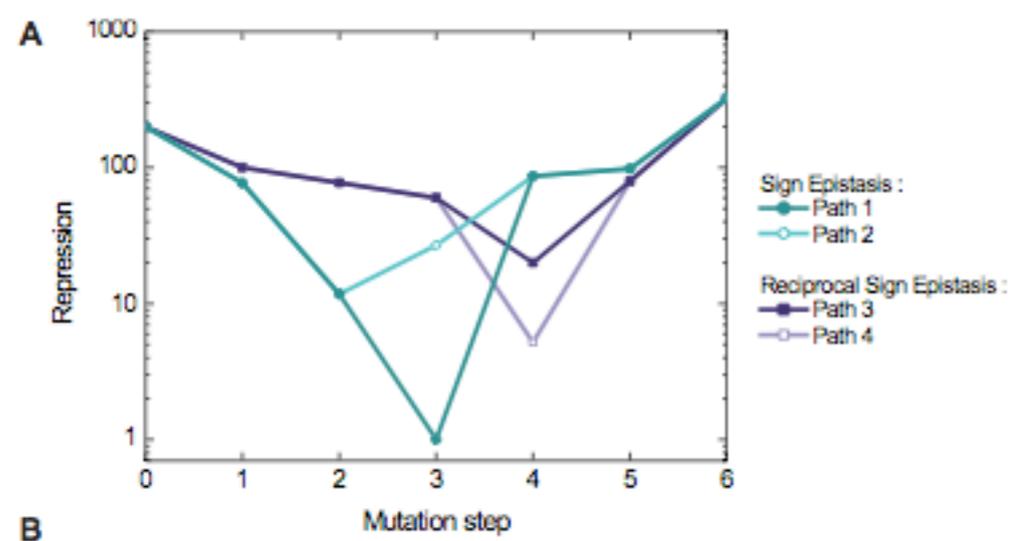
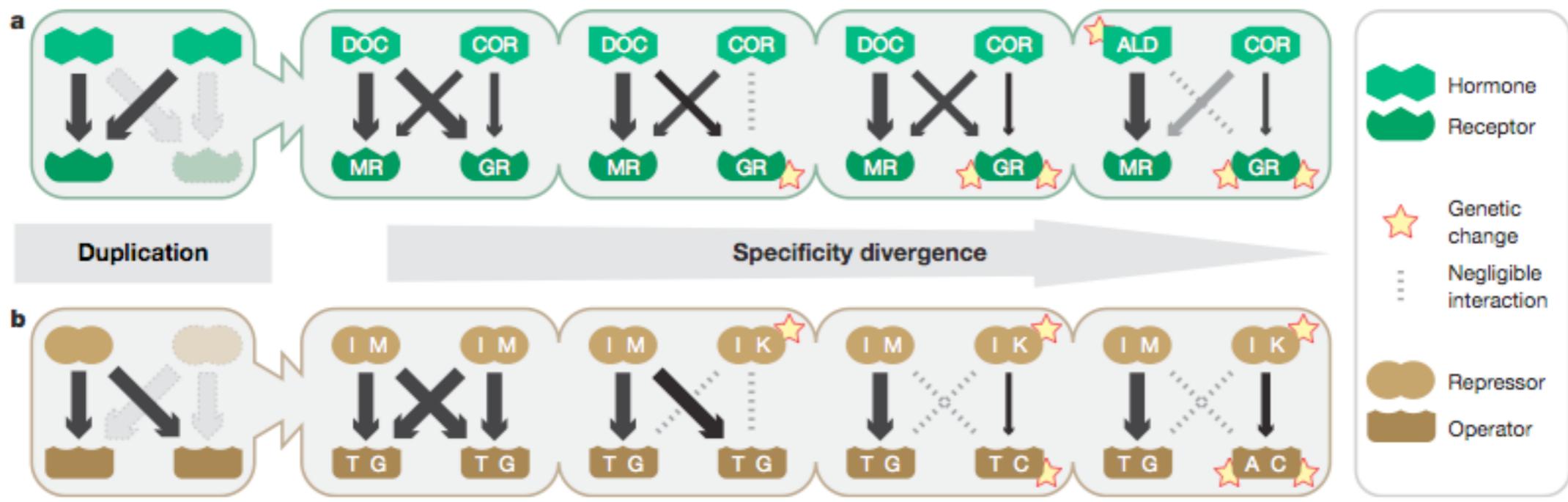
lac repressor



bacterial beta-lactamase to the antibiotic cefotaxime

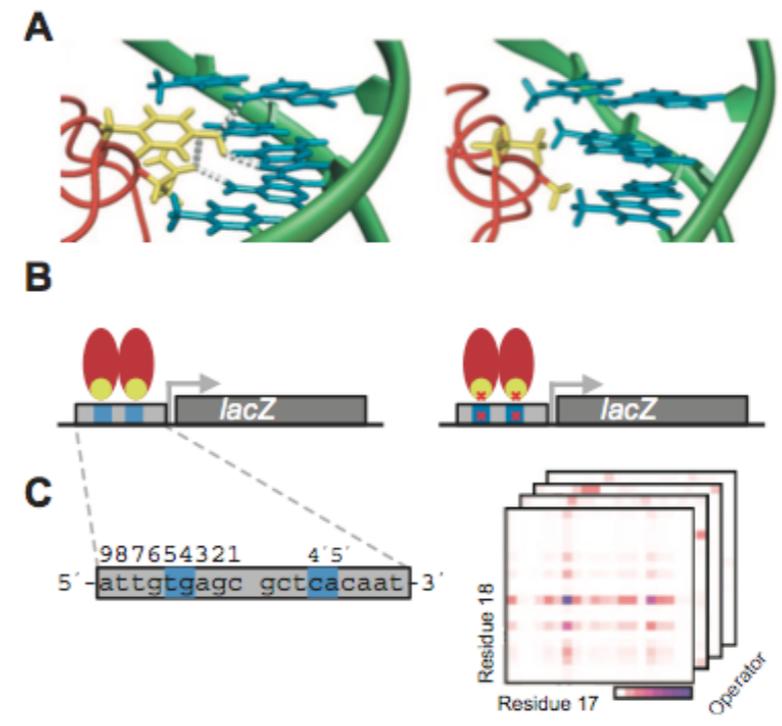


Empirical fitness landscapes reveal accessible evolutionary paths  
 Frank J. Poelwijk, Daniel J. Kiviet, Daniel M. Weinreich and Sander J. Tans  
 NATURE Vol 445 25 January 2007



**B**

Mutation steps	oper.	rep.	oper.	rep.	oper.	rep.	oper.	rep.
0	ac == gt	PK						
1	ac == ga	PK	ac == ga	PK	ac == gt	SK	ac == gt	SK
2	ag == ga	PK	ag == ga	PK	tc == gt	SK	tc == gt	SK
3	ag == ca	PK	ag == ga	PQ	tc == ga	SK	tc == ga	SK
4	ag == ca	PQ	ag == ca	PQ	tc == ca	SQ	tc == ca	SQ
5	ag == ca	SQ	ag == ca	SQ	tc == ca	SQ	tc == ca	SQ
6	tg == ca	SQ						
	Path 1		Path 2		Path 3		Path 4	



Multiple peaks and reciprocal sign epistasis in an empirically determined genotype-phenotype landscape  
 Alexandre Dawid, Daniel J. Kiviet, Manjunatha Kogenaru, Marjon de Vos, and Sander J. Tans