# Adaptive Evolution and Spatial Structure

(And now for something completely different)

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# Microbial Experimental Evolution & Mathematical Modeling

- Evolution and ecology of microbial pathogens
- 1. Evolutionary and ecological dynamics often on similar time scales (and fast)
  - evolution of pathogens during course of epidemic or within host: influenza, HIV, antibiotic resistance, . . .
  - experimental evolution possible
  - Phage-Bacteria system & Interacting Particle System model

- 2. Huge population sizes, high variability, strong selection
- 3. Most microbial communities grow in spatially structured environments (biofilms, soils, surfaces).
- 4. These communities evolve in the presence of (often dramatic) changes in environmental conditions-biotic and abiotic.
- 5. Environmental changes can alter selective pressure and lead to spatial bottlenecks.

#### Spatial bottleneck



Drought-induced pine tree die-off; New Mexico, 2002.

#### **Main Questions**

- How does spatial structure influence phenotypic changes during adaptive evolution to changing environmental conditions?
- Are the genetic trajectories during adaptation fundamentally different in a spatial setting?

#### Structured coalescent



Migration (mixing) affects patterns of polymorphism

#### Pairwise coalescence time

- D = number of demes; N individuals per deme
- M = migration rate out of (= into) a deme
- $\mathsf{E}(T_w) = 1 \dots$  in units of total pop size (ND)
- $\mathsf{E}(T_b) = 1 + \frac{D-1}{MD}$
- $Var(T_w) = 1 + 2\frac{(D-1)^2}{MD^2}$
- $\operatorname{Var}(T_b) = 1 + \frac{(D-1)^2}{D^2} \left[ \frac{2}{M} + \frac{1}{M^2} \right]$

#### mean and variance $T_{\rm MRCA}$

| М          | $\infty$ | 10   | 1    | 0.1  | 0.01 |
|------------|----------|------|------|------|------|
| $E(T_w)$   | 1        | 1    | 1    | 1    | 1    |
| $E(T_b)$   | 1        | 1.08 | 1.75 | 8.5  | 76   |
| $Var(T_w)$ | 1        | 1.11 | 2.13 | 12.3 | 114  |
| $Var(T_b)$ | 1        | 1.12 | 2.69 | 68.5 | 5740 |

as function of migration rate M (for sample of size 2, and D=4 demes)

Example from Hein, Schierup, and Wiuf 2005.

### Microvirid Phages (ID11, $\phi$ X174 and $\alpha$ 3)



ssDNA viruses (infect bacterial cells), 5-6 kb circular genomes, 11 genes (overlapping)

#### Phage life cycle



attachment to bacterial host cell  $\rightarrow$  injection of phage DNA  $\rightarrow$  reproduction of phage DNA  $\rightarrow$  packaging and assembly of phage progeny  $\rightarrow$  cell lysis and release of phage to environment  $\rightarrow$  ...

#### Genetic map





Genetic map of bacteriophage ID11 indicating protein function and overlapping genes.

#### Liquid adaptation to high temperature

| Genome<br>Position | substitution   | Amino Acid<br>Position | Amino Acid<br>Substitution | Fitness<br>(log <sup>2</sup> increase in pfu<br>per h) |
|--------------------|----------------|------------------------|----------------------------|--|
| 2534               | G→T            | J20                    | V→L                        | 14.61  |
| 3665               | C <b>→</b> T   | F355                   | P→S                        | 20.31  |
| 3850               | G <b>→</b> A/T | F416                   | M                          | 20.05  |
| 2520               | C→T            | J15                    | A →V                       | 19.45  |
| 3543               | C→T            | F314                   | A V                        | 19.13  |
| 3857               | A→T            | F419                   | Т→А                        | 19.04  |
| 2609               | G→T            | F3                     | V <b>→</b> F               | 17.56  |
| 3567               | A→G            | F322                   | N→S                        | 16.74  |
| 3864               | A→G            | F421                   | D→G                        | 16.22  |

Rokyta et al. (2005). Many possible first-step mutations in ID11. Single-step adaptive changes to high temperature  $(37^{\circ}\text{C})$  in liquid; observed 9 large-effect mutations in 20 independent lines.

#### structure



One pentameric unit of ID11, made up of 5 copies of protein F. Capsid formed from 12 pentameric units. Yellow indicates 1st step adaptive mutations to temperature increase (37C, red) and gain of function (43C, blue); occur at interface.

#### Passaging in spatial experiments



#### Localized adaptation

### Spatial structure is expected to increase the genetic variation



#### Initial phase of adaptation



Top: 33C (optimal) . . . phage easily clear plate

Bottom: 40C (stressed) . . . adaptation to high temperature evident in plaque morphology

#### Sampling grid and evolution of plaques



Interacting Particle System models

- Explicitly model
  - 1. discrete spatial structure:  $\mathbb{Z}^2$
  - 2. Each site can be in several different states (vacant, uninfected host cells, free virus, infected cells)
  - 3. randomness & spatial structure down to individual cell level
  - life history parameters (VIRUS: burst size, latent period, timing of lysis, attachment rate; BACTERIA: growth rate)
  - 5. coinfection dynamics & recombination (high MOI conditions on plate)

#### **IPS Simulations: phage competition**

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Spatially explicit pathogen evolution

Q. Can we predict the types of mutants likely to arise and spread in a pathogen population?

Mass-action ODE (well mixed):

$$\frac{dS}{dt} = -\beta SI + \cdots$$
$$\frac{dI}{dt} = \beta SI - \delta I + \cdots$$

Invasion by second pathogen (evolution of virulence):  $\beta_i =$  infection rate for  $I_i$  (host infected with pathogen i)  $\delta_i =$  death rate (virulence) for  $I_i$ 

#### Who wins?

• Success determined by basic reproductive ratio:

$$R_0 = \frac{\beta S}{\delta}$$

- Both pathogens encounter the same density of susceptible hosts in well-mixed (liquid) culture, so
- $\frac{\beta_2}{\delta_2} > \frac{\beta_1}{\delta_1}$  implies  $I_2$  wins (independent of initial densities)
- . . . ignoring co-infection and within-host competition

# IPS Simulations: spatial SIR model with spontaneous mutations

#### With small probability, individual pathogens mutate

Only mutants near edge have a chance to become established



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#### Mutant invasion probability



(with  $\delta_1 = 0.0002, \beta_1 = 0.002$  held constant)

Invasion condition:  $\frac{\beta_2}{\delta_2} \cdot \beta_2^3 > \frac{\beta_1}{\delta_1} \cdot \beta_1^3$  and

 $\frac{\beta_2}{\delta_2} > 3.5.$  Different rules govern competition/evolution in spatial setting.

#### Time to first invasion

Constant wave speed  $\Rightarrow I_2$  mutants arise at rate  $M(t) = \mu 2\pi ct$  at time t. P(mutant invades)= p,  $I_2$  invasion rate . . . pM(t).

Cumulative invasion intensity in time interval [0, t]:

$$\int_0^t pM(s) \, ds = p\mu\pi c \, t^2.$$

$$P(T > t) = \exp(-p\mu\pi ct^2).$$

Expected time for the first successful invasion by  $I_2$  mutant:

$$E(T) = \int_0^\infty P(T > t) \, dt = \frac{1}{2\sqrt{p\mu c}}$$

Estimation of relative invasion probabilities from macroscopic observables:

$$\frac{p}{p'} \approx \left(\frac{\overline{T'}}{\overline{T}}\right)^2$$

Phage competition and evolution on plates

#### Experimental System:

- $\phi$ X174 and  $\alpha$ 3 . . . competing lytic phages infecting host *E. coli* C on agar plates.
- $\phi X$  dominates in spatial setting
- burst size vs. latent period
- after "incubation period" (5h or 18h), host cells killed and some of phage are transferred to fresh hosts using a replicate picker ("bed of nails")
- effects of spatial structure, different passage times, host evolution, phage evolution

#### Start of first passage



yellow =  $\phi X$ , blue =  $\alpha 3$ , green = nutrient, red = host cells

#### Predictions

- Spatial structure localizes competitive dynamics, allowing multiple adaptive changes to arise and persist (for extended period) in different regions.
- Natural high-MOI conditions on plate promote coinfection; recombination in transient hybrid zones.
- Different selective sweeps in different regions leads to opportunities for some recombination events that would be unlikely in well-mixed setting.
- Spatial bottlenecks lead to localized waves of infection (plaques) starting from isolated foci.

#### Molecular dissection of adaptation

- spatio-temporal sequencing
- known gene functions
- tie to phenotypes (life history parameters and fitness)
- Effects of mutations can be additive for some phenotypes, but not for fitness. (Craig Miller)

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Different types on 2-dimensional lattice.