

# Bet-hedging strategies in expanding populations

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# Outline

- Bet-hedging in jellyfish      with N. Azaña, P. Mariani (DTU, Copenhagen)
- Bet-hedging waves      with P.V. Martin (OIST), M.A. Muñoz (U. Granada)

# Bet-hedging

In gambling:

A New Interpretation of Information Rate  
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By J. L. KELLY, JR.

(Manuscript received March 21, 1956)

- Diversify investment strategy when playing an uncertain game
- Theory of bet-hedging is related with information theory

# Betting on a biased coin

$q$ : fraction of capital bet on head

$p$ : probability of head  $> 1/2$

$\$(t)$ : capital at round  $t$

$n_H, n_T$ : number of head and tails until  $t$

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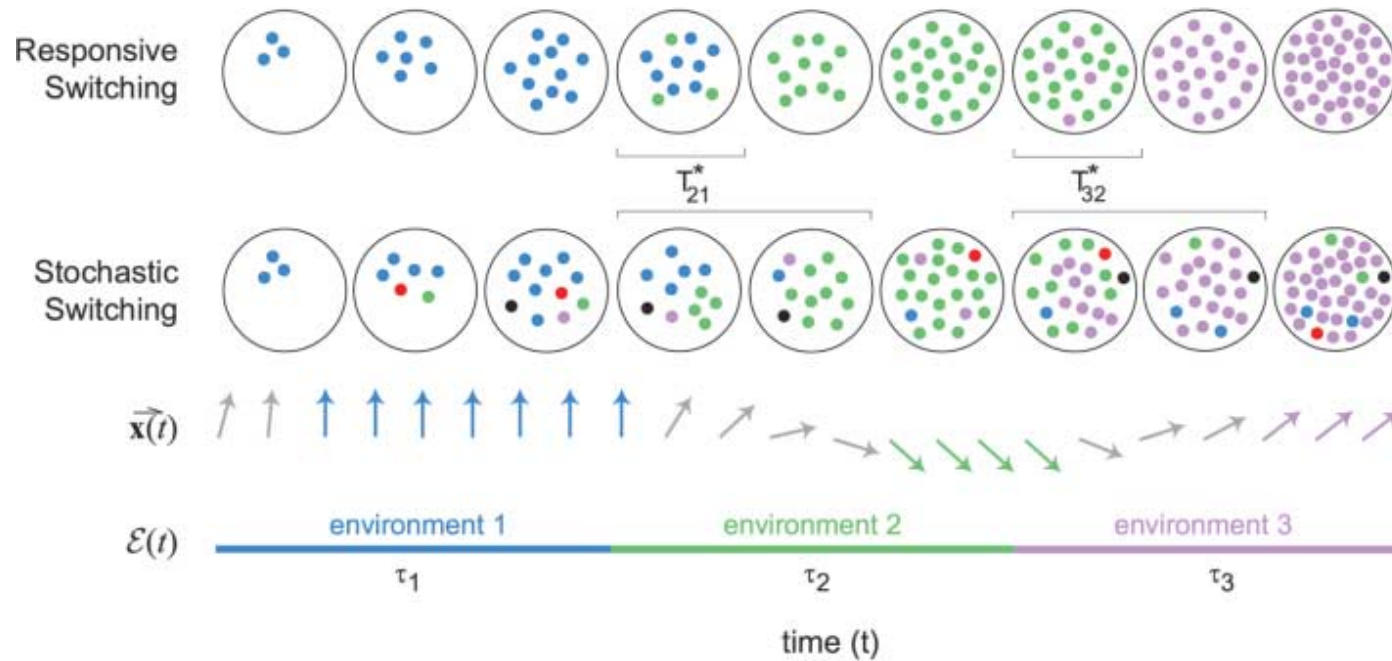
$n_H, n_T$ : number of head and tails until  $t$

$$\begin{aligned}\$(t) &= \$(0)(1 + q)^{n_H} (1 - q)^{n_T} \\ &\approx \$(0)e^{t[p \ln(1+q) + (1-p) \ln(1-q)]}\end{aligned}$$

Maximized for  $q = 2p - 1$

-> maximum average growth rate  $\ln 2 + p \ln p + (1 - p) \ln(1 - p)$

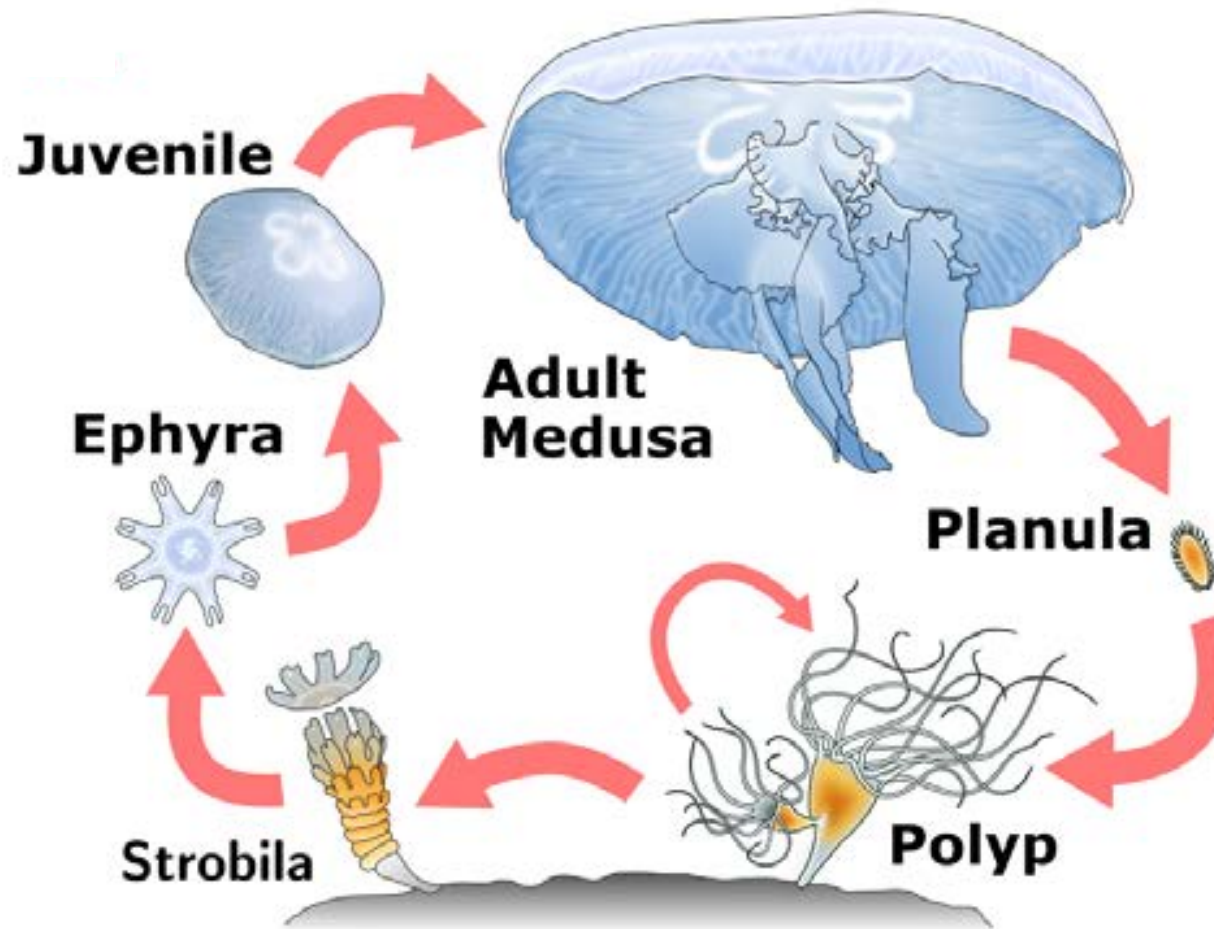
# Bet-hedging in biology



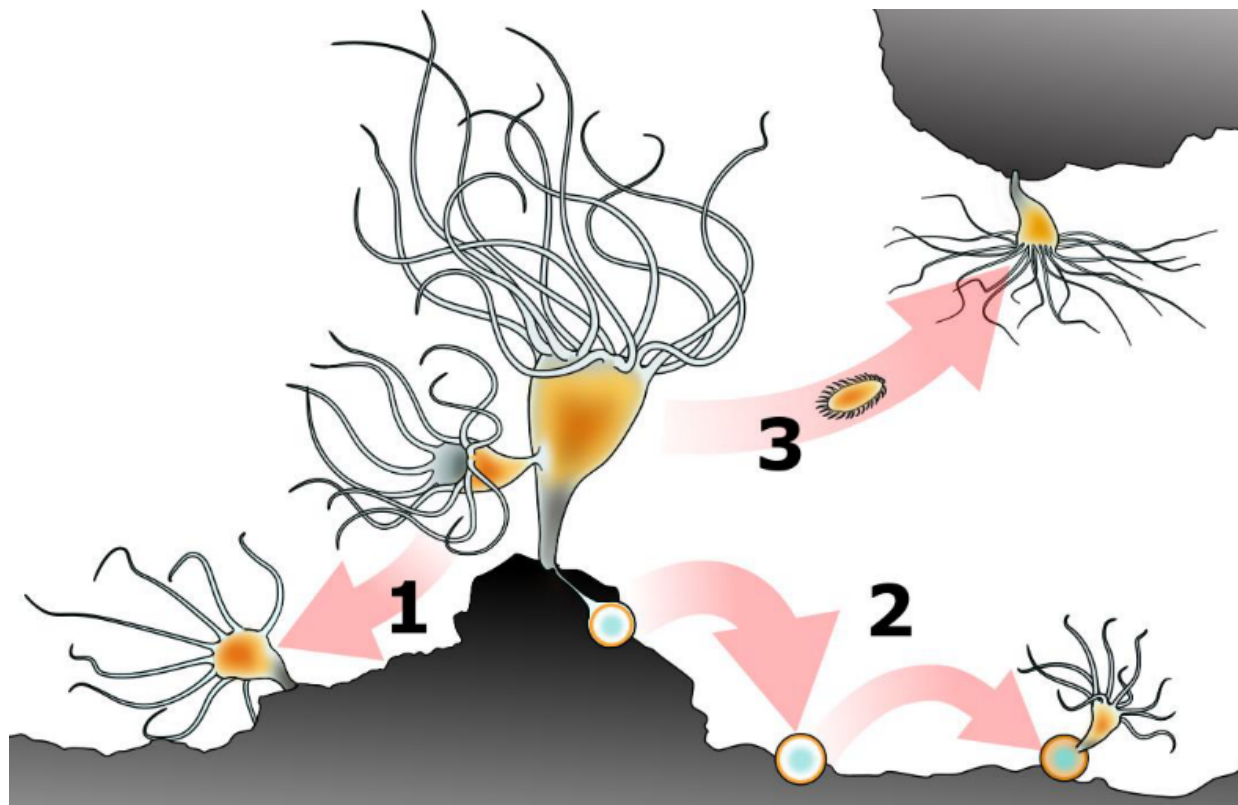
Kussell, Leibler 2005



# Life cycle of scyphozoan jellyfish



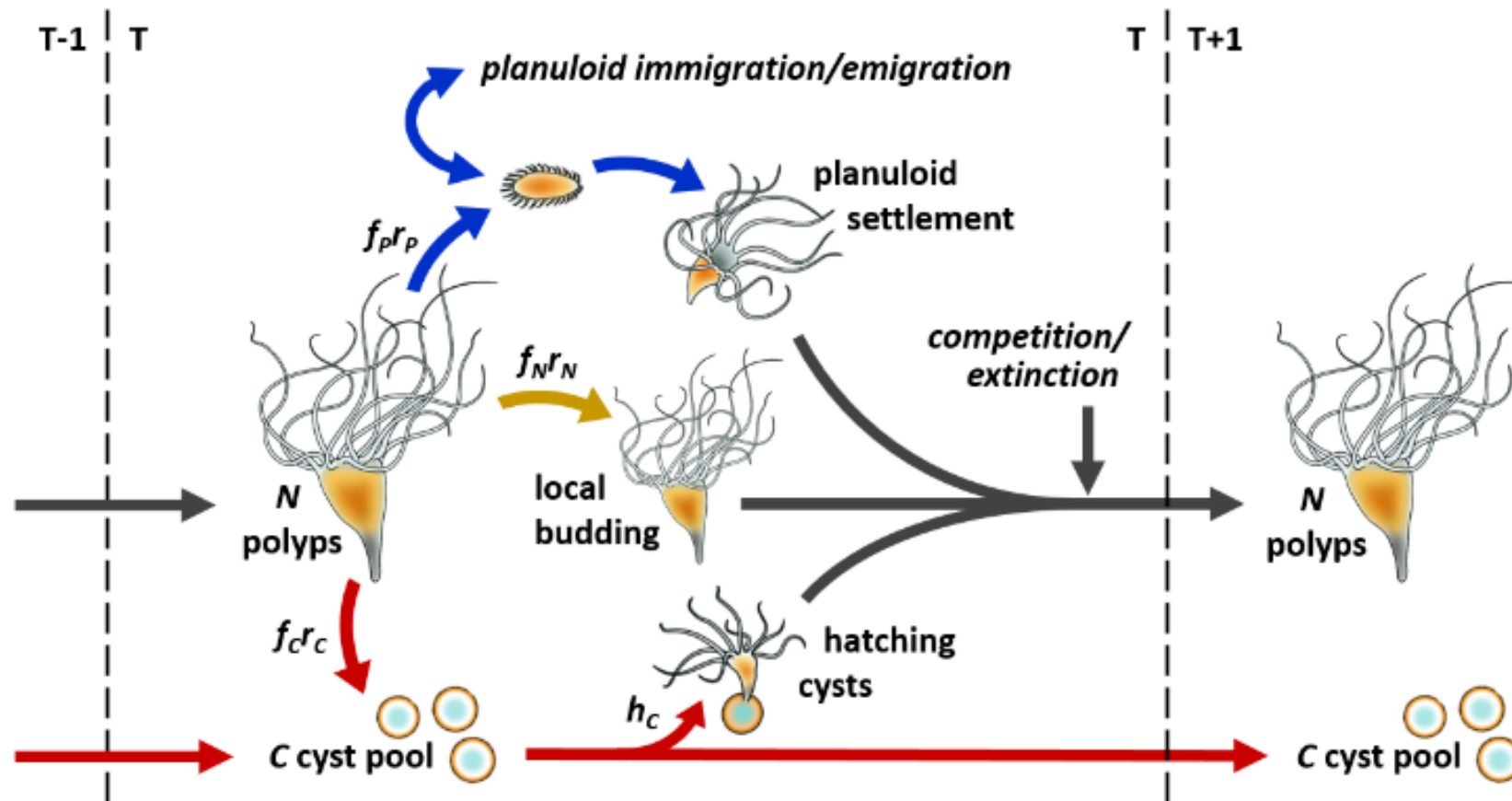
# Asexual life cycle of jellyfish



- 1. Polyps
- 2. Cysts
- 3. Planuloids

N. Azaña, SP, P. Mariani, American Naturalist (2018)

# Model



# 1. Beginning of the season

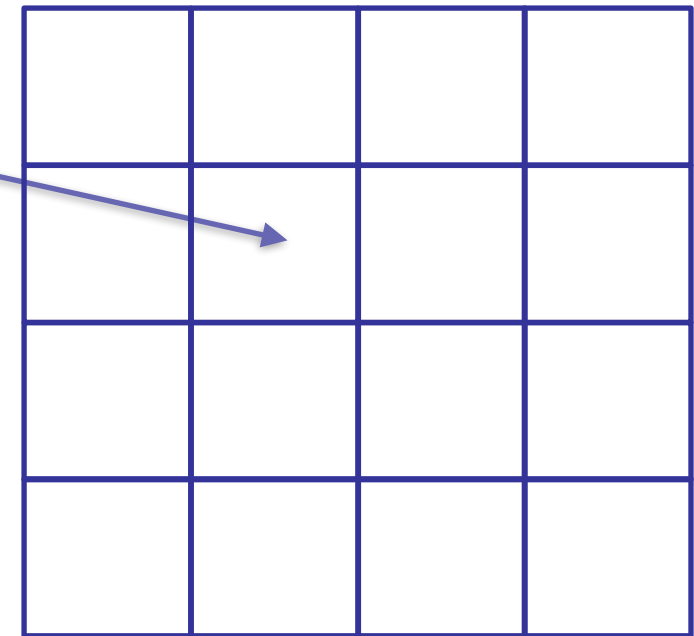
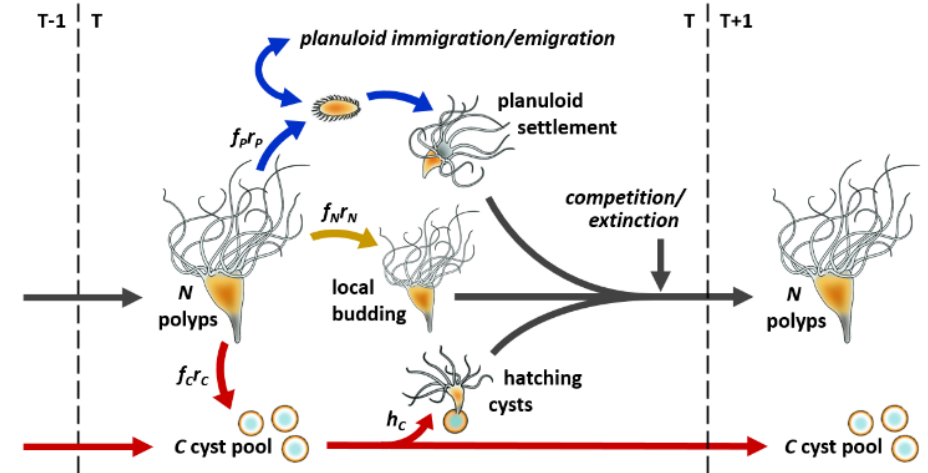
In each patch:

Wild type ( $w$ ), mutant ( $m$ )

Fraction of polyps:  $N_t^w, N_t^m$

with  $N_t^w + N_t^m = 1$

Number of cysts:  $C_t^w, C_t^m$



Sea: square lattice of  $L \times L$  patches

## 2. Reproduction

Local budding:

$$B_{t+1}^w = N_t^w f_N^w r_N$$

Motile buds:

$$M_{t+1}^w = N_t^w f_M^w r_M$$

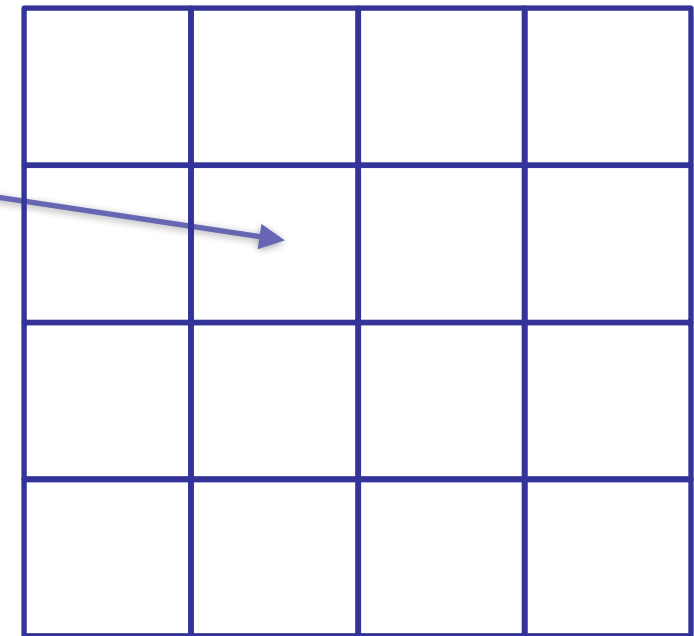
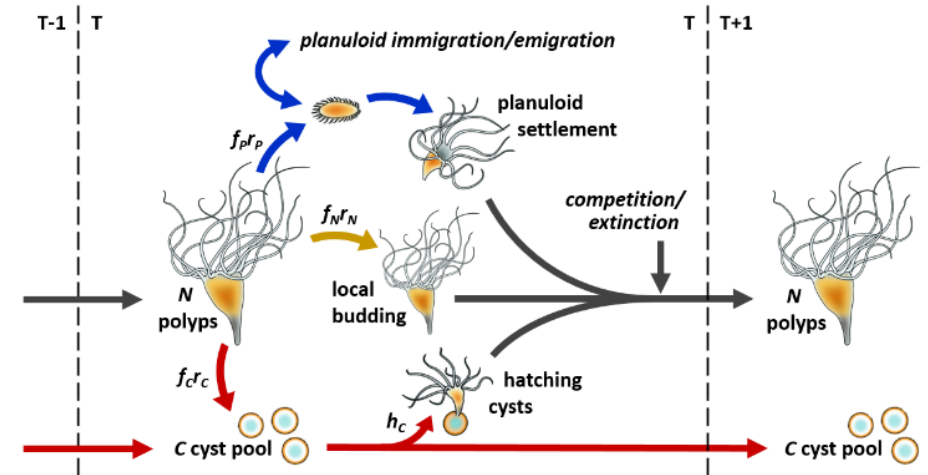
(spread among neighboring patches)

Hatching cysts:

$$H_{t+1}^w = C_t^w h_c$$

New number of cysts:

$$C_{t+1}^w = C_t^w (1 - h_c) + N_t^w f_C^w r_C$$



### 3. Competition

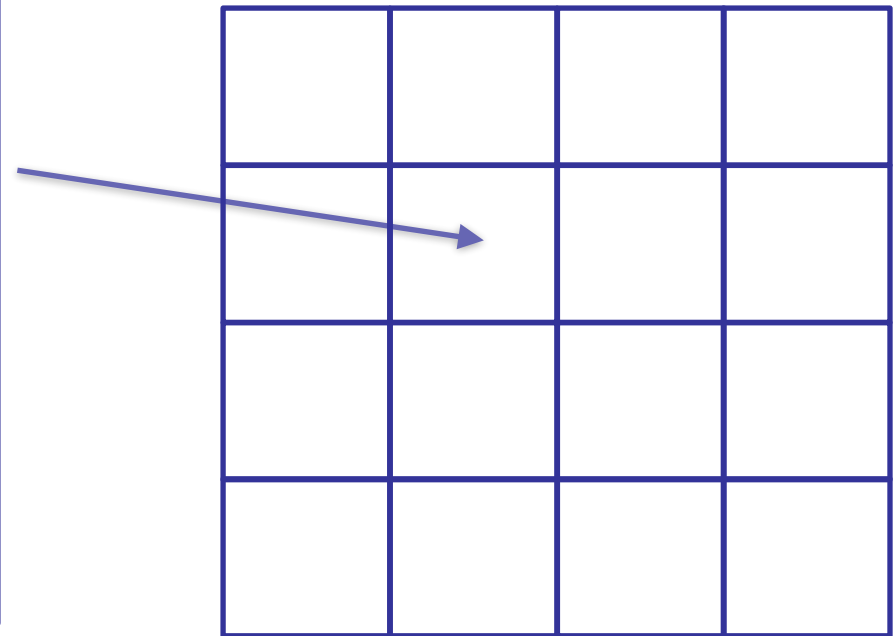
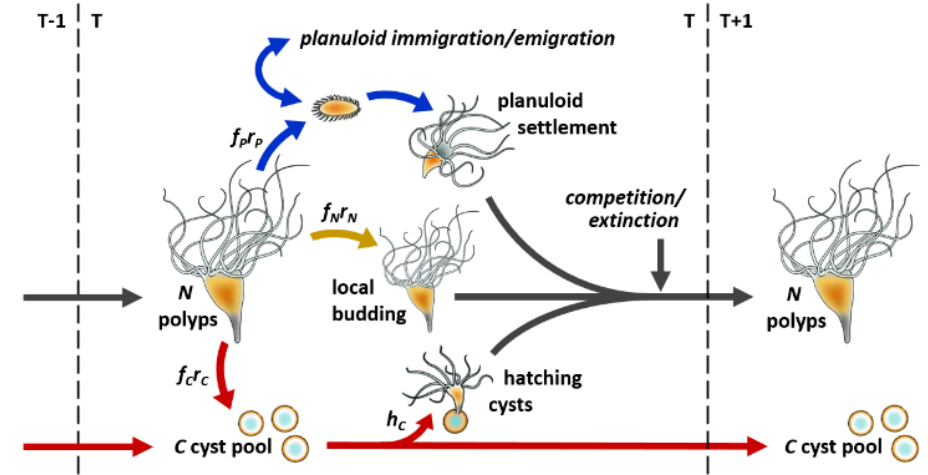
Total hatched:

$$S_{t+1}^w = B_{t+1}^w + M_{t+1}^w + H_{t+1}^w$$

Competition:

$$N_{t+1}^w = \frac{S_{t+1}^w}{S_{t+1}^w + S_{t+1}^m}$$

$$N_{t+1}^m = \frac{S_{t+1}^m}{S_{t+1}^w + S_{t+1}^m}$$

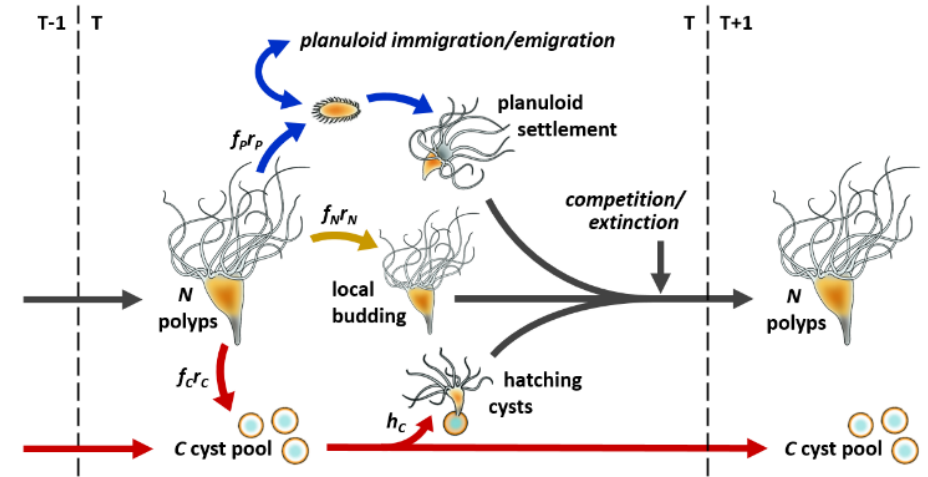


# 4. Extinction

Each patch undergoes an extinction (from predation, bad environment conditions etc) with probability  $e$

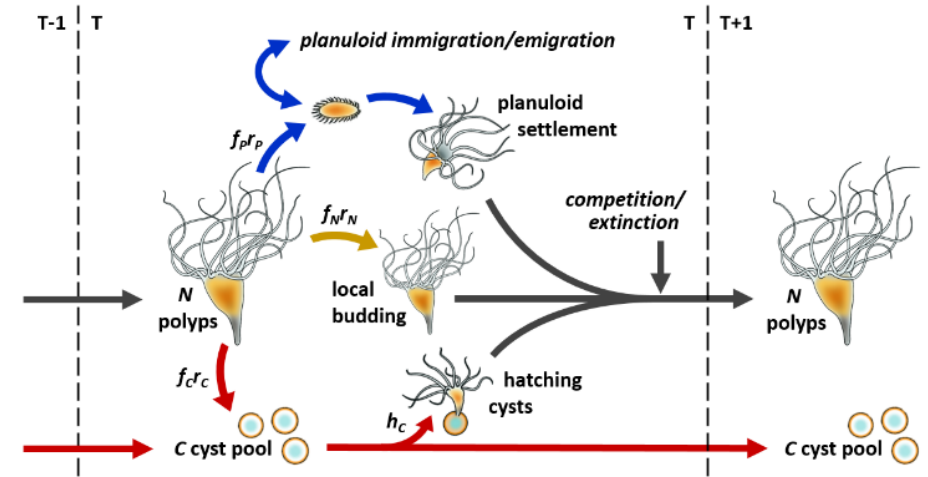
If extinction occurs:

$$N_{t+1}^w = N_{t+1}^m = 0$$

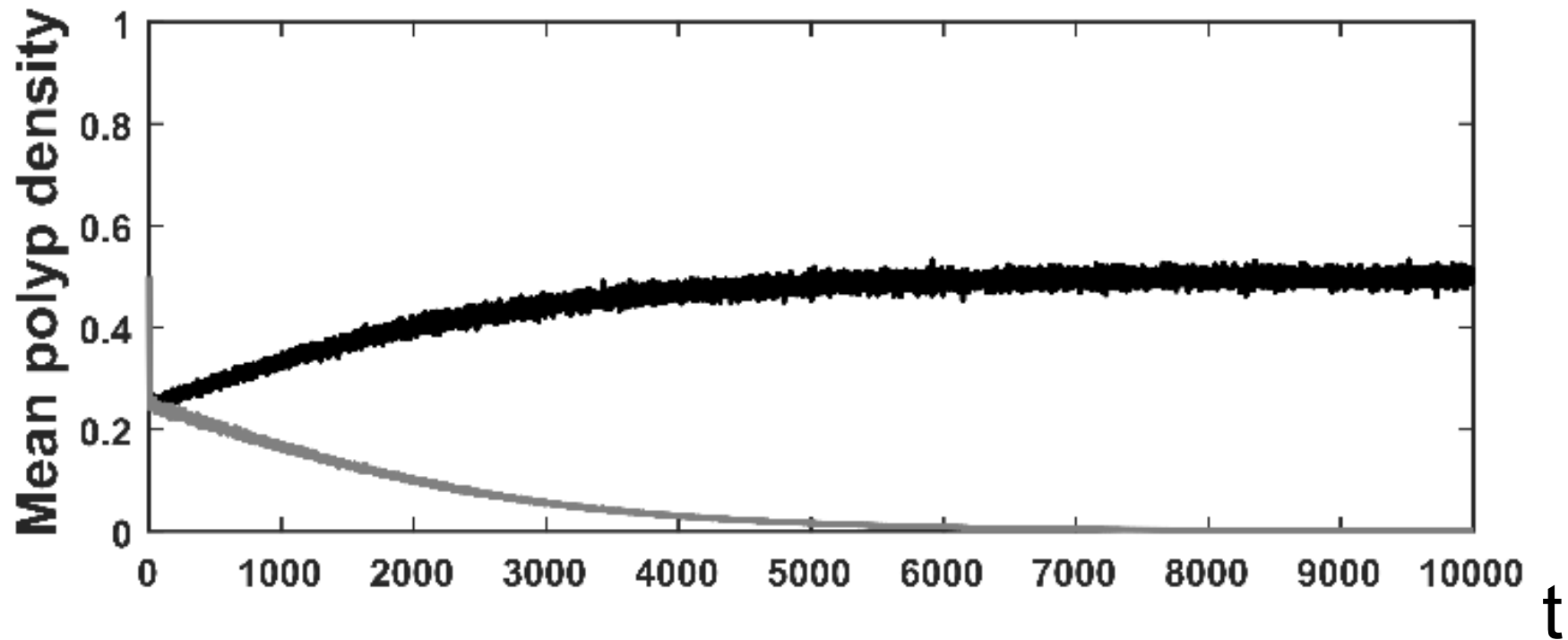


	X		X
X	X		
X		X	
			X

# 5. Repeat

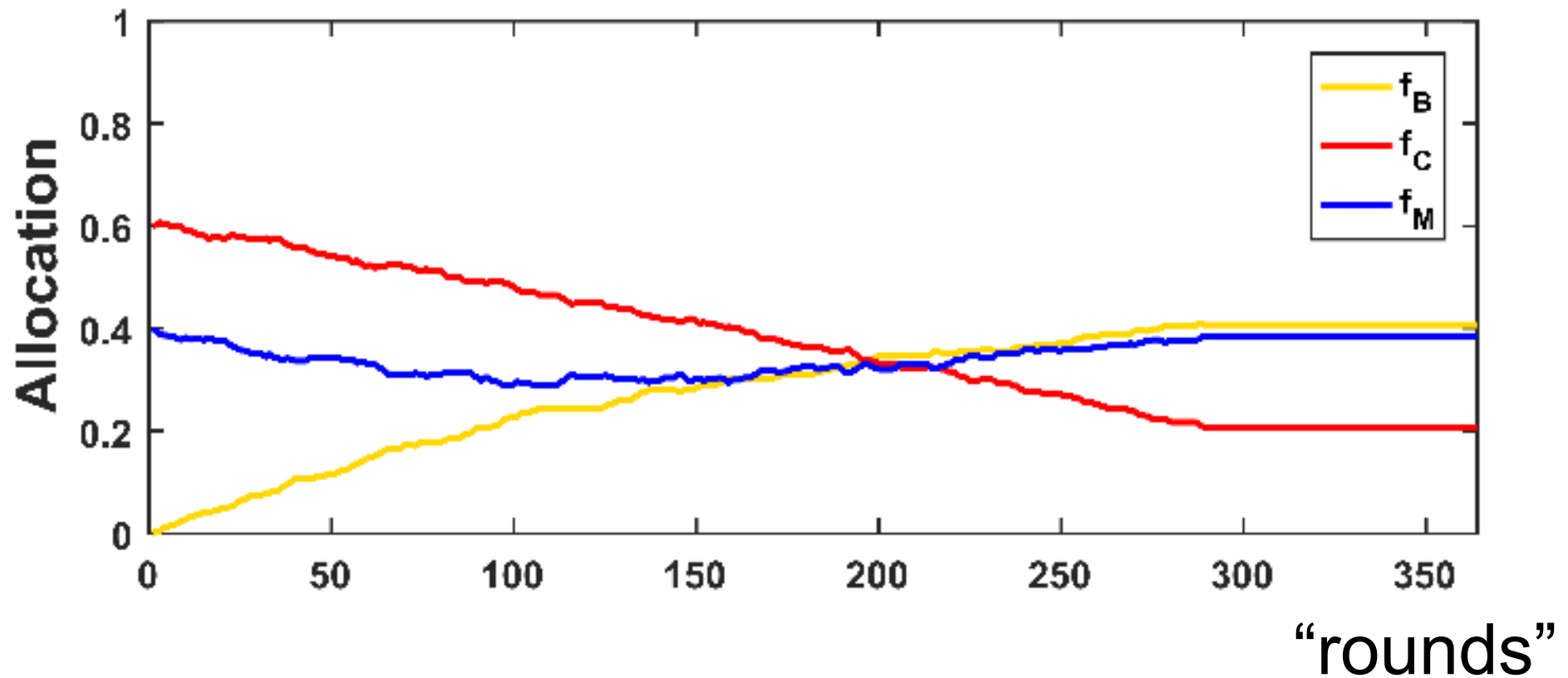



Different strategies  $\Rightarrow$  competitive exclusion

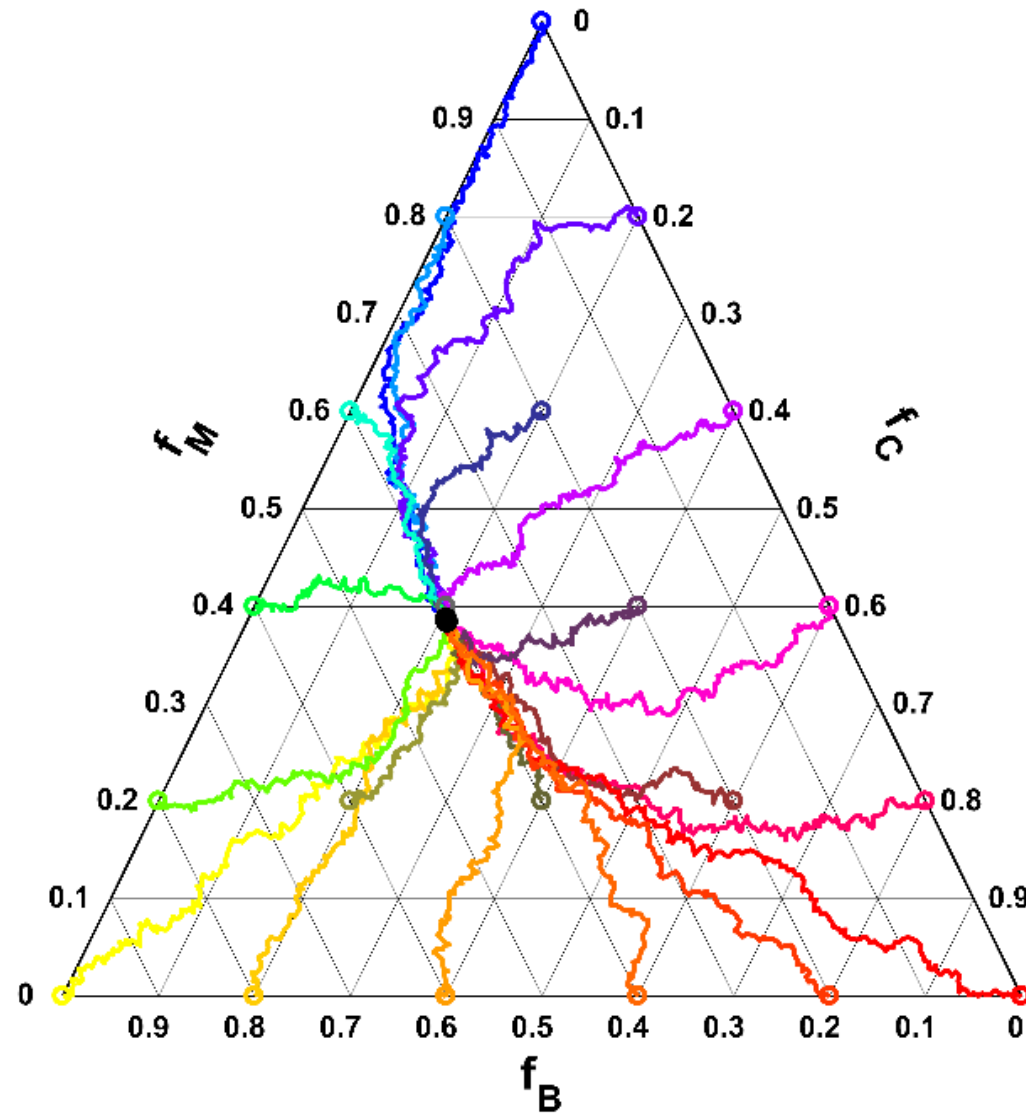


# Evolution

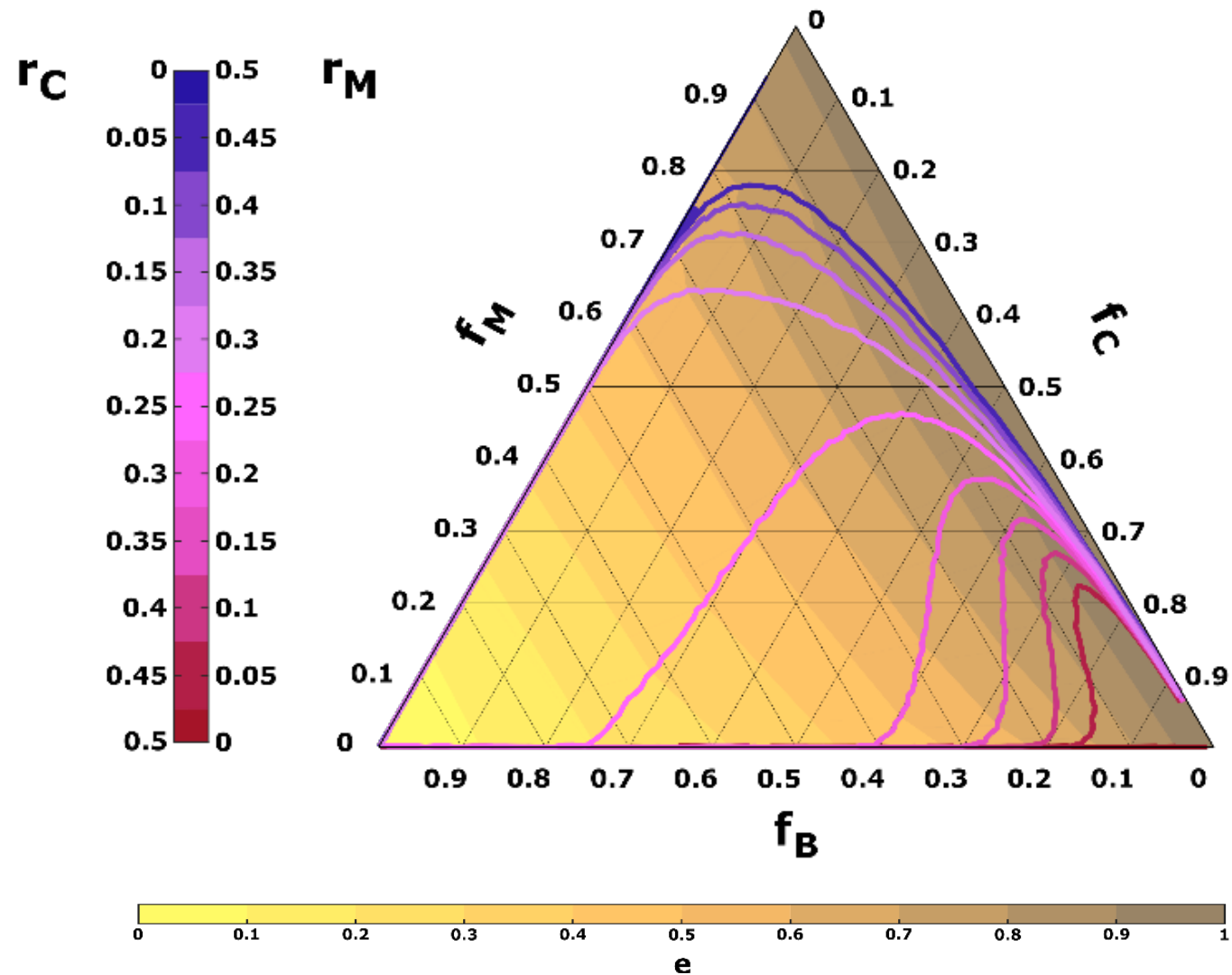
Each round: WT vs. mutant, if mutant wins becomes new WT



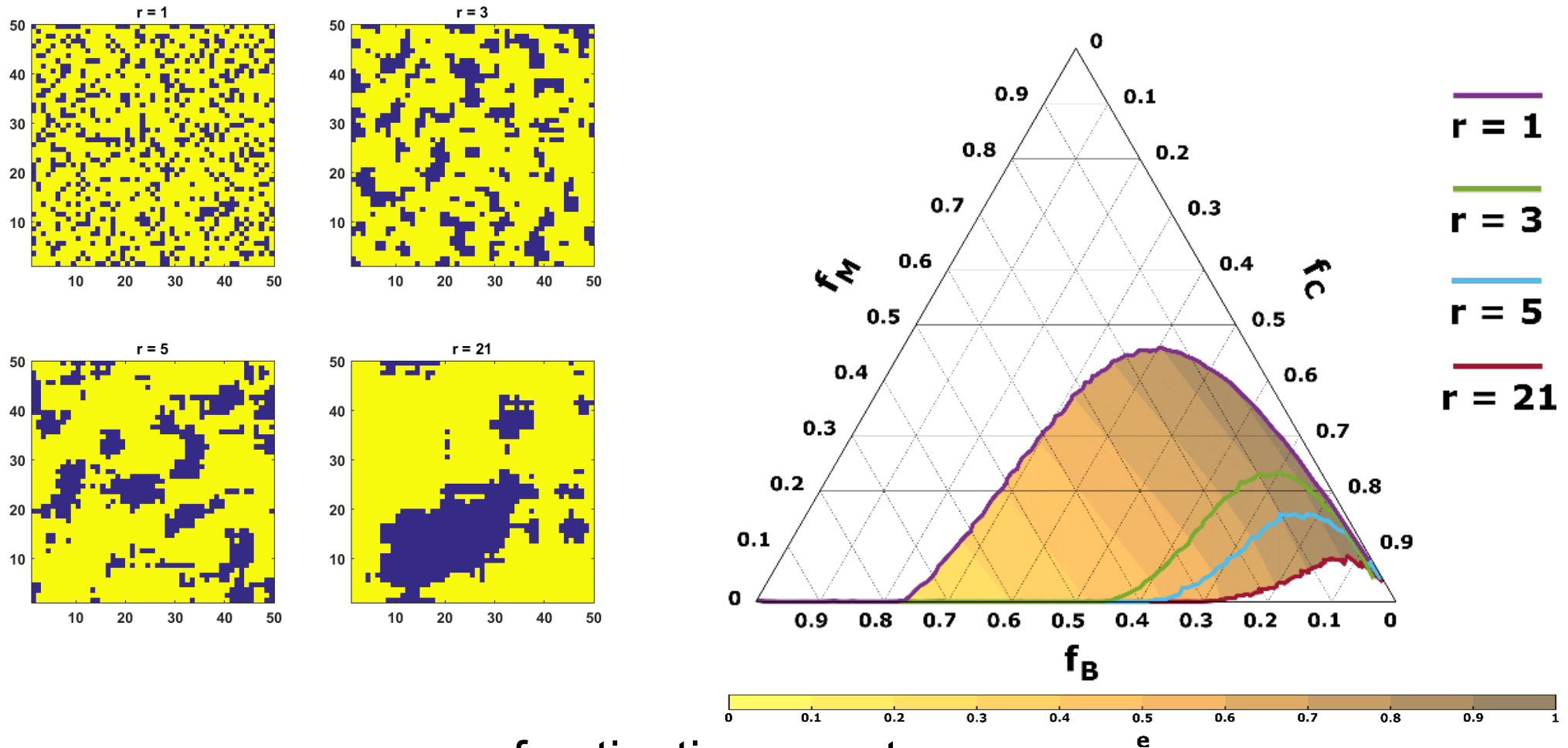
# Evolutionary stable strategy



# Evolutionary stable strategy



# Spatially correlated extinctions



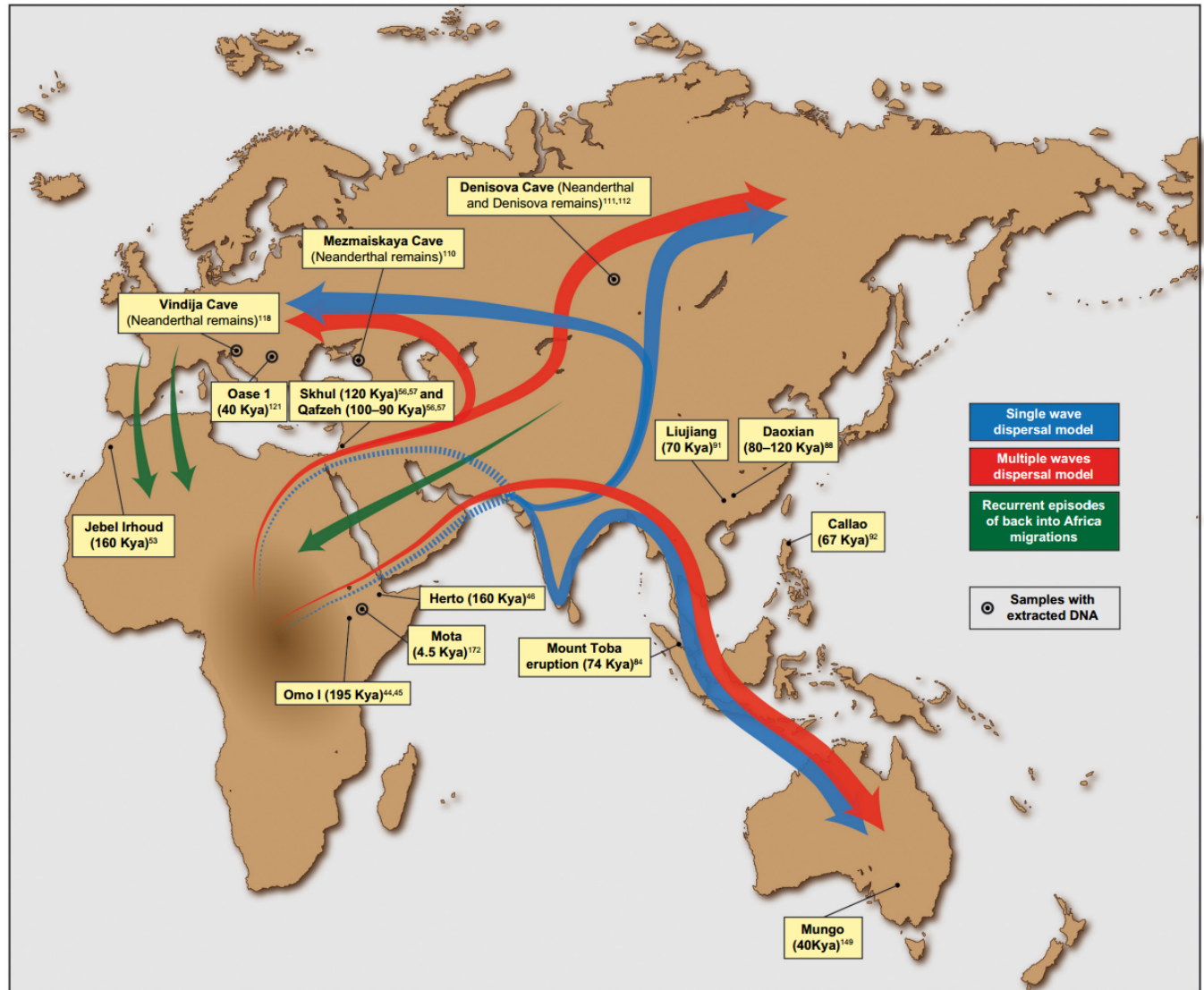
$r$  = average range of extinction events

N. Azaña, SP, P. Mariani, American Naturalist (2018)

# Conclusions

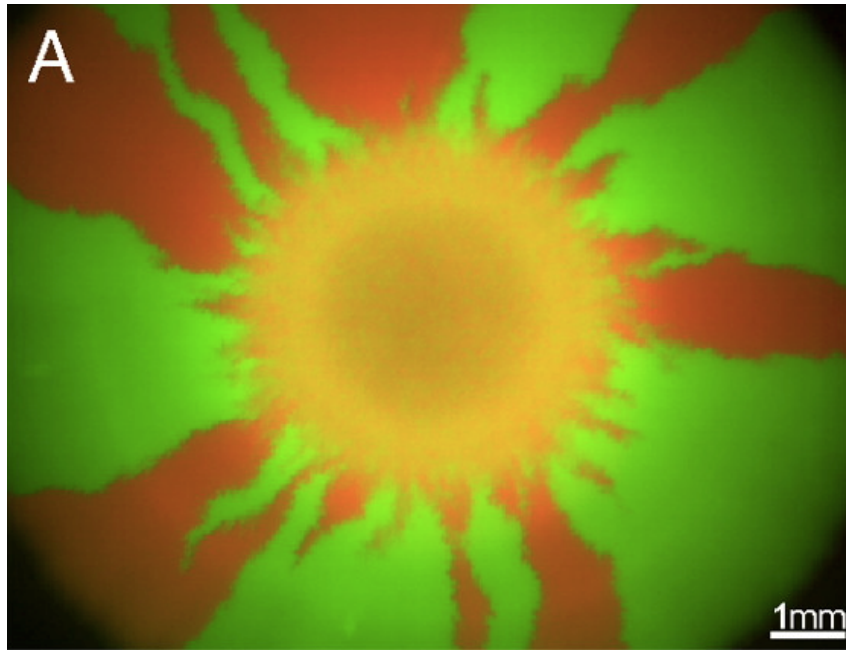
- Coexistence of multiple asexual strategies is possible ✓
- No species employ only local budding in the wild (but they do in the lab in food-rich conditions) ✓
- More common and generalist species typically employ all three modes ✓
- Cyst allocation increases in response to starvation/predation ✓
- Tradeoff between cysts and motile buds depends on level of environmental risk and spatial correlations -> “Escape in space vs time” ?

# Range expansion



López et al. 2015

# Neutral competition



growth of a colony of two neutral  
E.Coli strains

Hallatscheck and Nelson (2007)

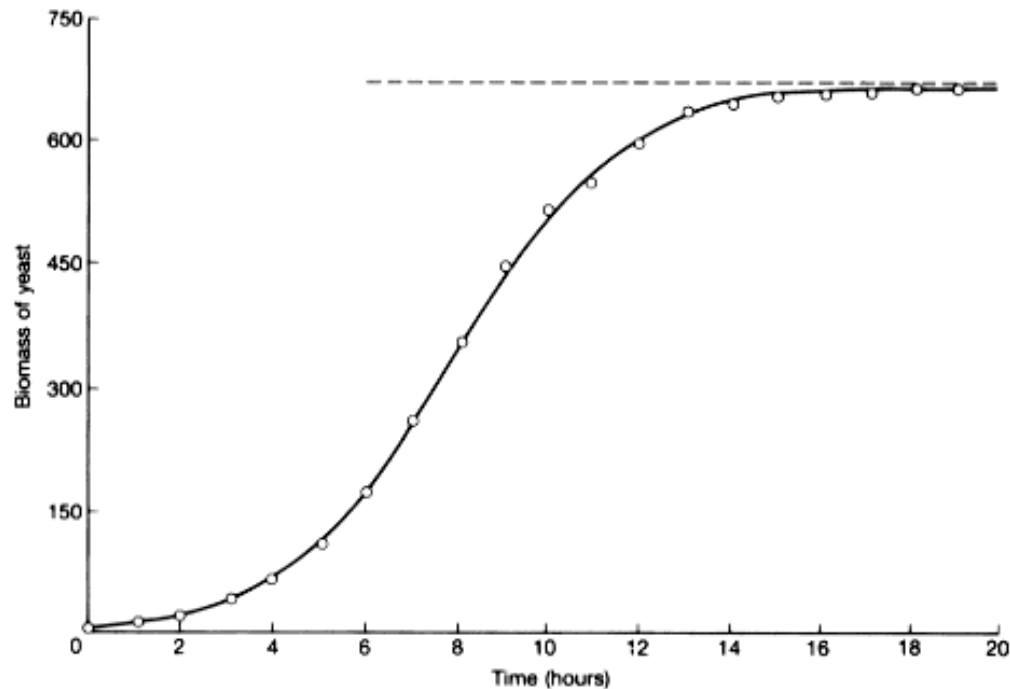
# Logistic growth

$$\frac{d}{dt}c = ac - bc^2$$

- exponential growth at small density
- saturation at higher density (finite resources)

interpretation: growth of a population

OR spread in a population of an advantageous mutation



from J. Maynard Smith, "Evolutionary Genetics", 1998

# Fisher equation

$$\partial_t c = D \partial_x^2 c + sc(1 - c)$$

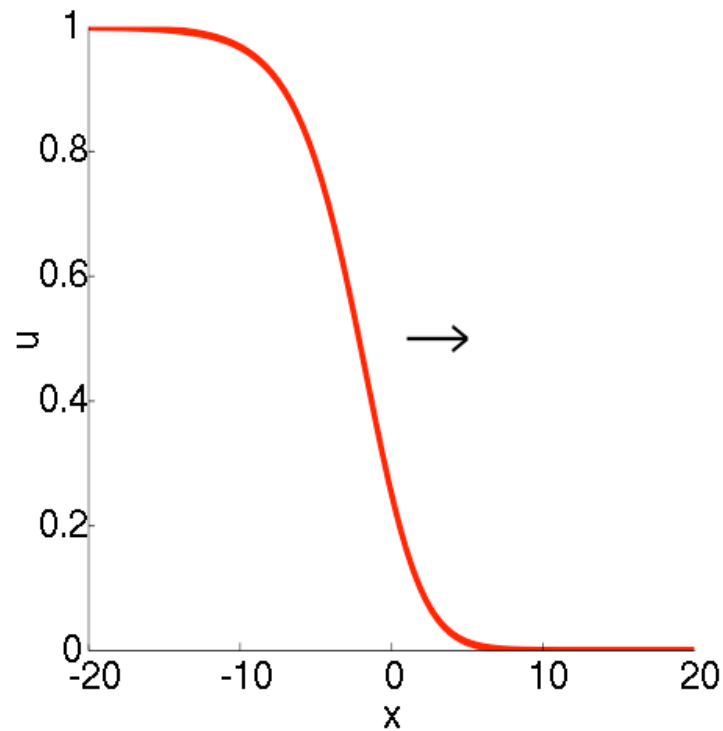
Spread of a population (or advantageous mutation) in space

Fisher (1937)

# Fisher equation

$$\partial_t c = D \partial_x^2 c + s c (1 - c)$$

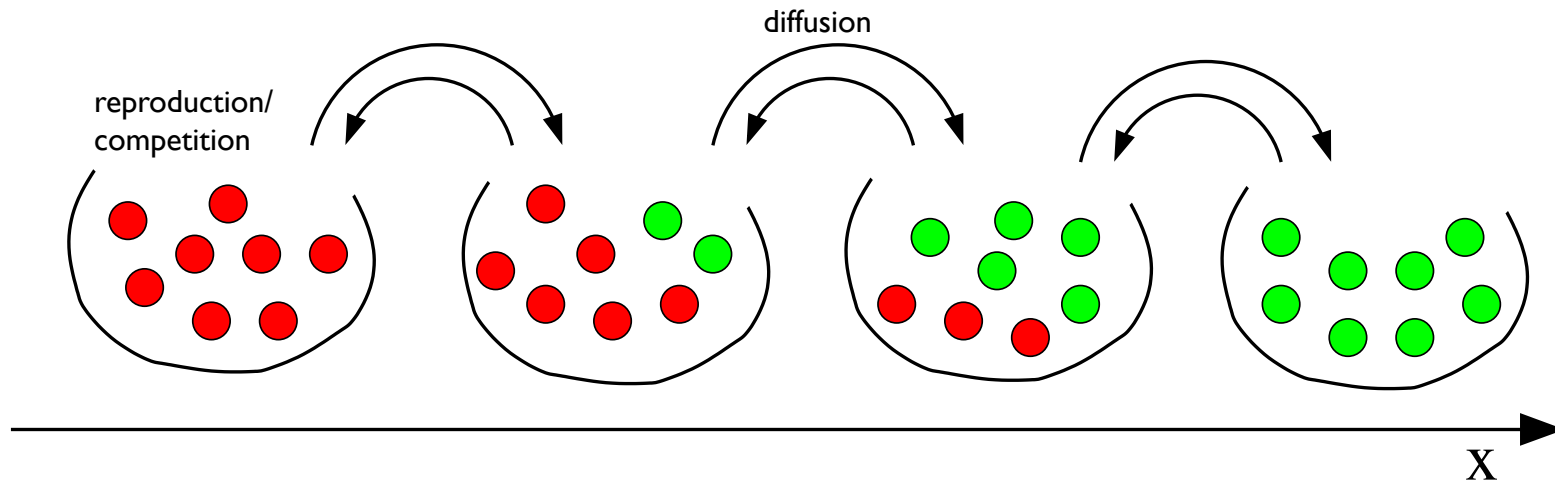
Spread of a population (or advantageous mutation) in space



Basic result: propagating front of velocity

$$v = 2\sqrt{Ds}$$

# Individual-based models and stochasticity



continuum limit: stochastic Fisher equation

$$\partial_t c(x, t) = D \nabla^2 c + s c(1 - c) + \sqrt{2\mu c(1 - c)/N} \xi(x, t)$$

where:

$c(x, t)$  = fraction of one of the two species

$\mu$  = reproduction rate

$s$  = selective advantage

$N$  = local population size

$D$  = diffusion constant

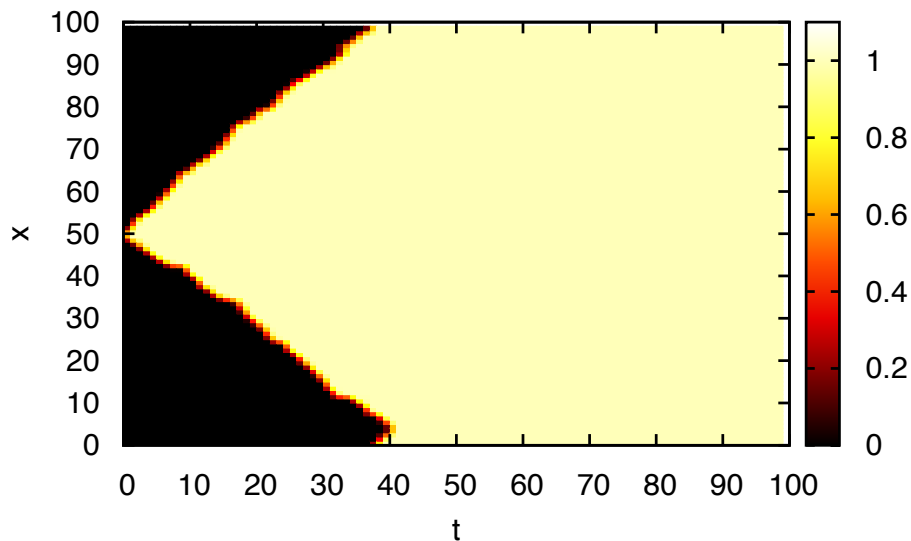
Kimura et al (1964)

# Two different fixation mechanisms

continuum limit: stochastic Fisher equation

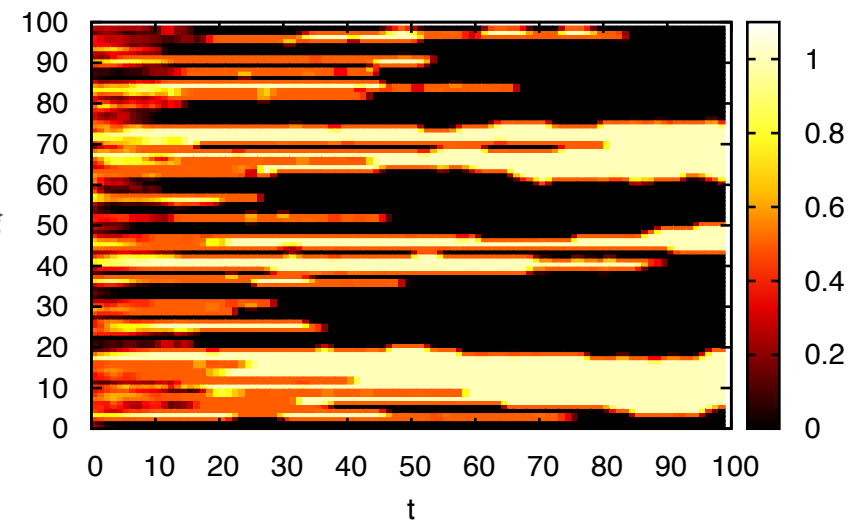
$$\partial_t c(x, t) = D \nabla^2 c + s c(1 - c) + \sqrt{2\mu c(1 - c)/N} \xi(x, t)$$

$s \gg 1/N$



Fisher wave, speed  $v = 2\sqrt{Ds}$

$s \ll 1/N$



Stochastic fixation

# Bet-hedging in expanding populations

$$\partial_t f(x, t) = D \nabla^2 f + \sigma(x, t) f(1 - f)$$

$$\sigma(x, t) = \sigma_{i(x, t)} = \sum_j s_{ij} \alpha_j \quad \text{with} \quad \sum_j \alpha_j = 1$$

Environmental states

Frequencies of strategies

P. Villa-Martín, M.A. Muñoz, SP, Plos Comp. Biol (2019)

# Well-mixed limit

$$\frac{d}{dt}f = \sigma(t)f \quad \text{For long times:} \quad f(t) \sim e^{t\langle\sigma\rangle} f(0)$$

$$\sigma_i = \sum_j s_{ij} \alpha_j$$

- “Fitness” is a linear function of the frequencies
- Optimal strategy is a pure strategy
- Bet-hedging is never advantageous

# Simpler case

$$\partial_t f(x, t) = D \nabla^2 f + \sigma(x, t) f(1 - f)$$

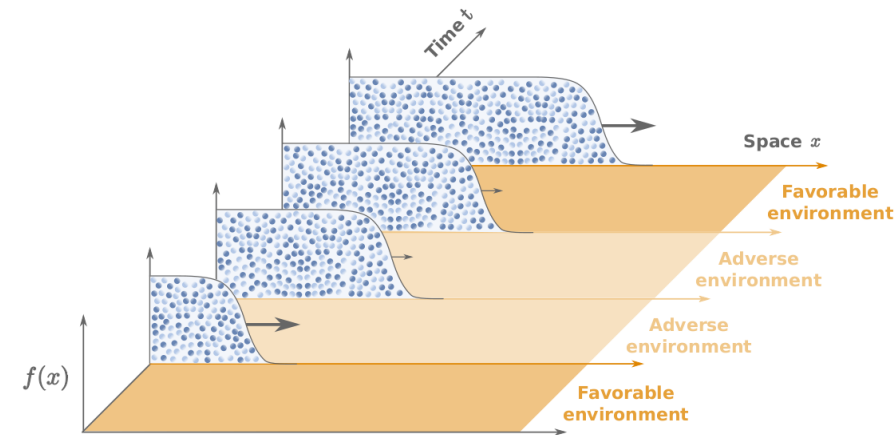
$$\sigma_i = \sum_j s_{ij} \alpha_j$$

Environment  
 $p_a$  Adverse  
 $1 - p_a$  Favorable

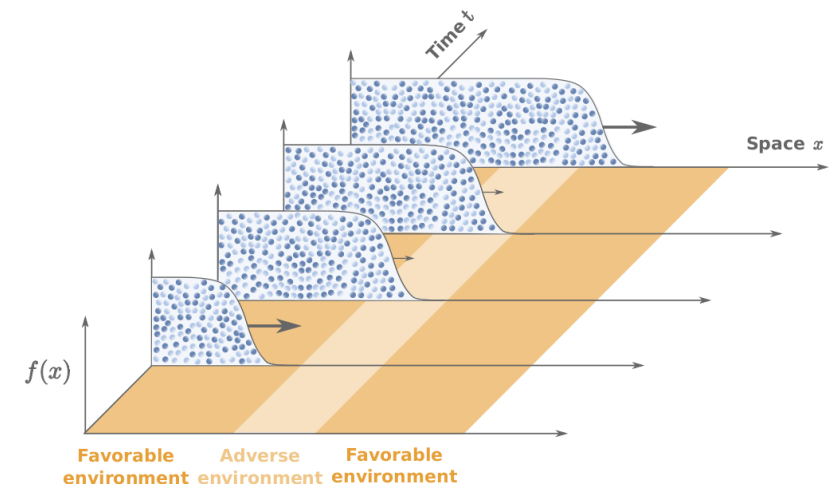
Phenotype  
 $\alpha$  Risky  
 $1 - \alpha$  Safe

$s_a$	$s_s$
$s_b$	$s_s$

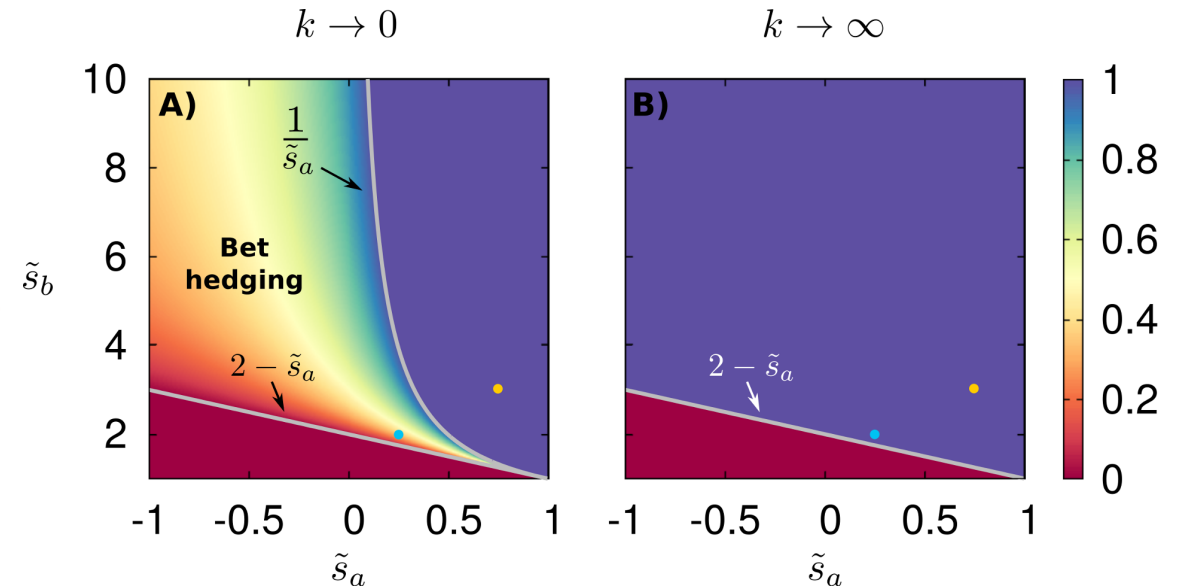
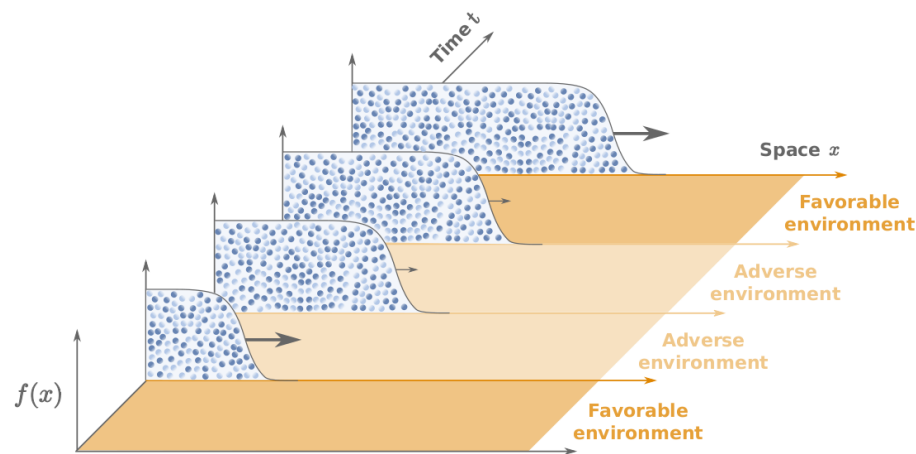
Temporal environmental variations, or



spatial environmental variations

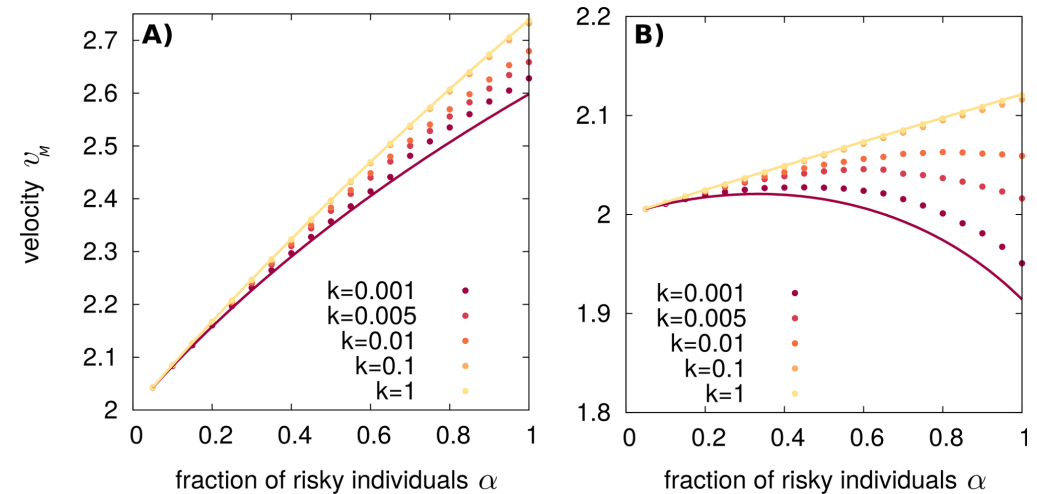


# Temporal fluctuations

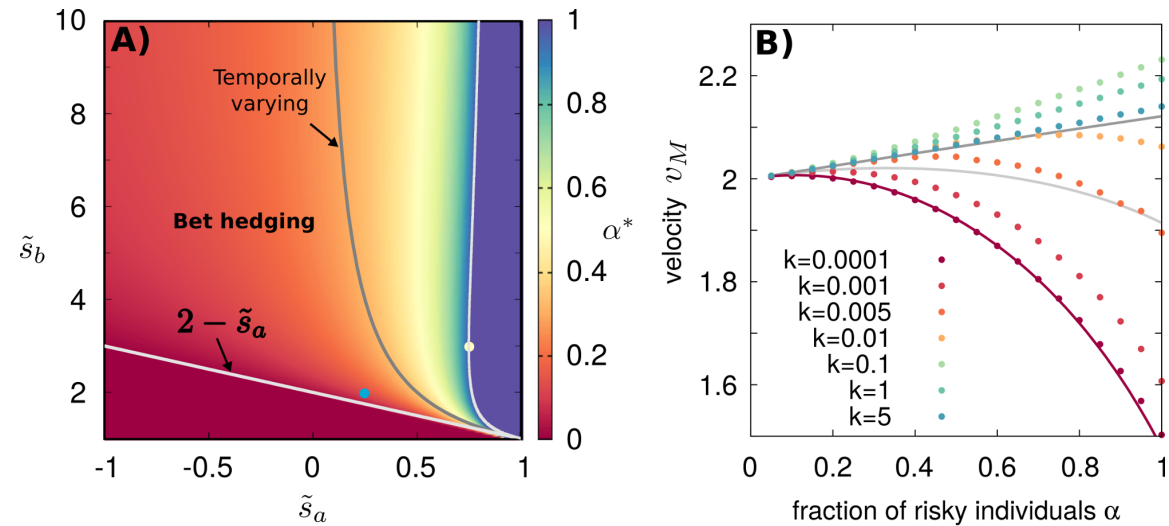
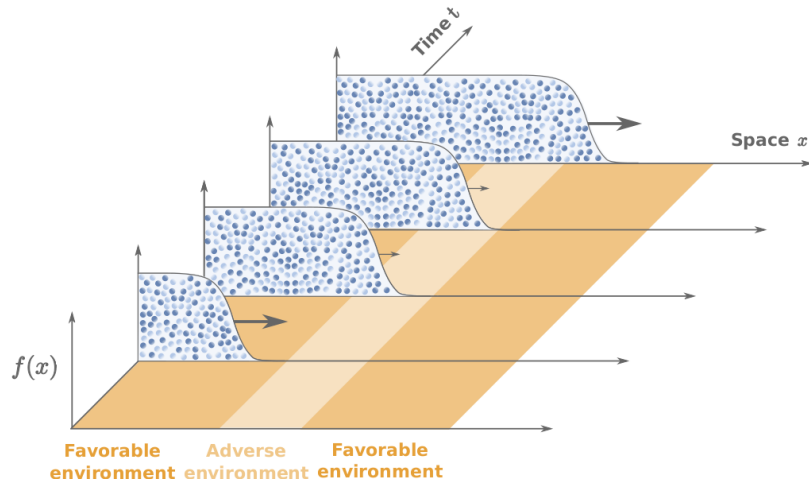


$$\langle v \rangle_{k \rightarrow \infty} = 2\sqrt{D\langle \sigma(\alpha) \rangle}$$

$$\langle v \rangle_{k \rightarrow 0} = \left\langle 2\sqrt{D\sigma(\alpha)} \right\rangle$$



# Spatial fluctuations



$$\langle v \rangle_{k_M \rightarrow \infty} = 2\sqrt{D\langle \sigma(\alpha) \rangle}$$

$$\frac{1}{\langle v \rangle_{k_M \rightarrow 0}} = \left\langle \frac{1}{2\sqrt{D\sigma(\alpha)}} \right\rangle$$

- The wave front spends less time in the advantageous environment
- Bet-hedging region is broader than for temporal fluctuations

# General case

$$\partial_t f(x, t) = D \nabla^2 f + \sigma(x, t) f(1 - f)$$

$$\sigma(x, t) = \sigma_{i(x, t)} = \sum_j s_{ij} \alpha_j$$

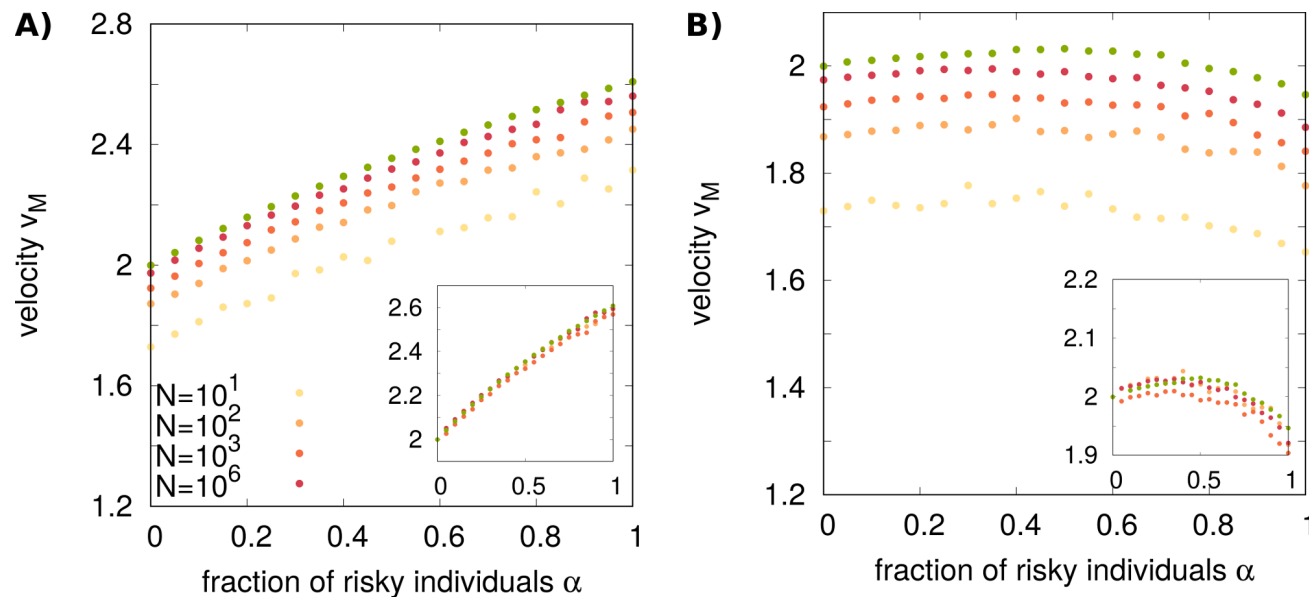
with  $i = 1 \dots M$ ,  $j = 1 \dots N$  and arbitrary  $M, N, s_{ij} > 0$

- Frequent environmental change rate: no bet-hedging
- Slow environmental change rate: bet-hedging is favored for spatial fluctuations

# Role of finite population size

Stochastic Fisher equation:

$$\partial_t f(x, t) = D \nabla^2 f + \sigma(t) f(1 - f) + \sqrt{\frac{2}{N} f(1 - f)} \xi(x, t)$$



Slightly reduced velocity, otherwise similar physics

# Conclusions

Bet-hedging is:

- favored in range expansions compared to well-mixed populations
- favored at low rather than high frequency of environmental change
- favored for spatially rather than temporally varying environments
- not much dependent on demographic stochasticity

Lots of possible generalization: finite switching rates, pushed waves etc.

P. Villa-Martín, M.A. Muñoz, SP, Plos Comp. Biol (2019)