

# Adaptive Diversification

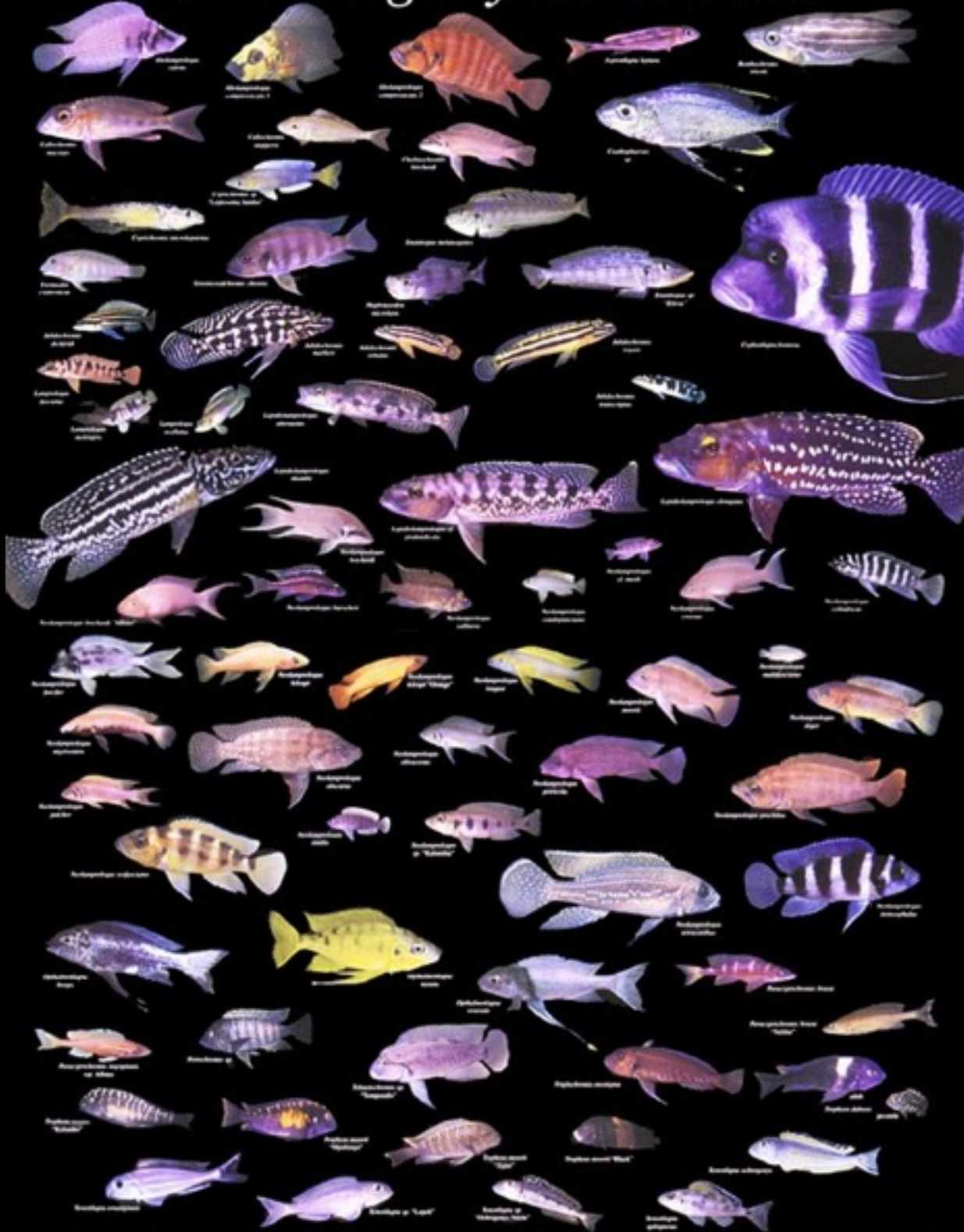
Michael Doebeli  
University of British Columbia

KITP  
March 15, 2011

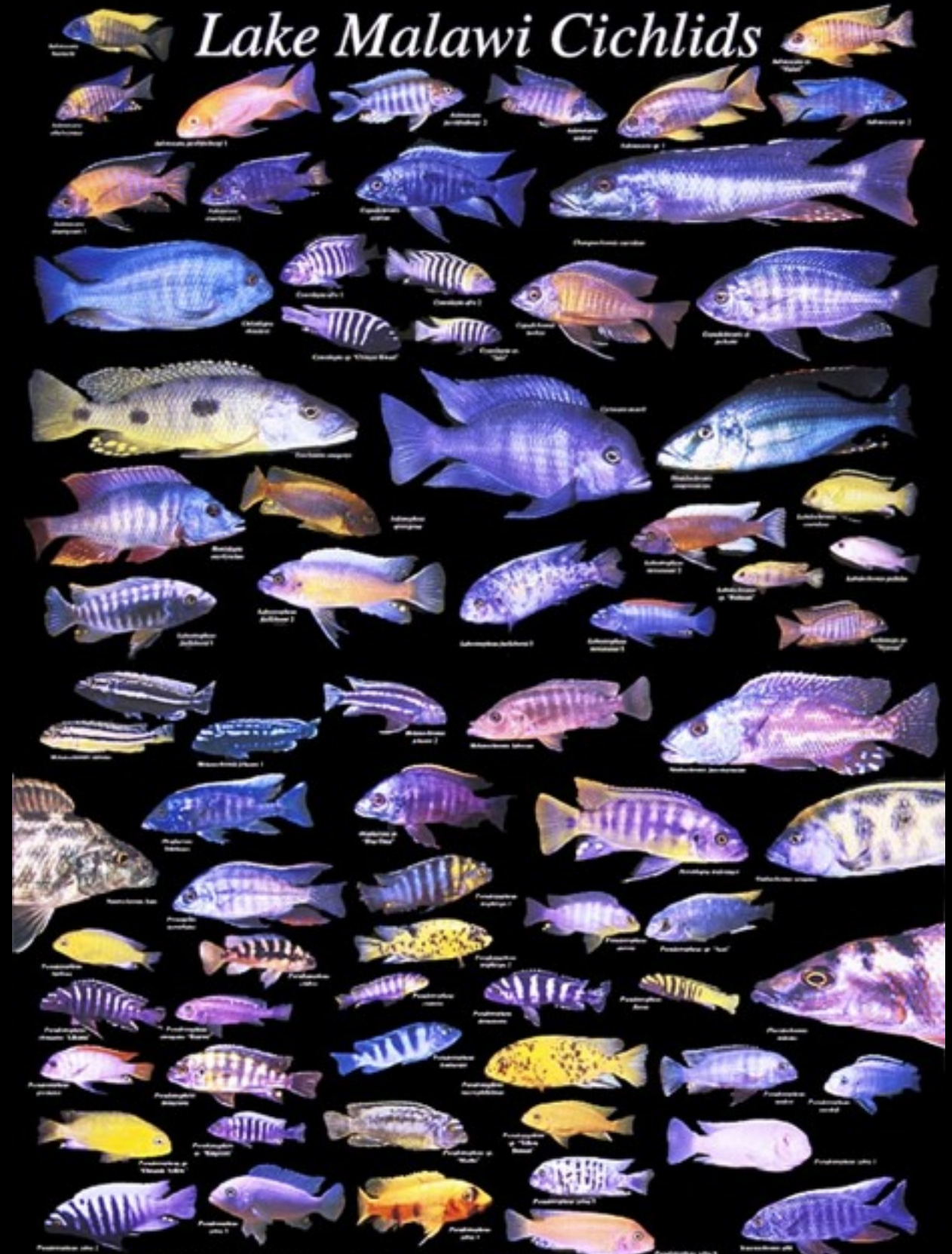


# Adaptive radiation of Cichlid fishes in African rift lakes

## Lake Tanganyika Cichlids



## Lake Malawi Cichlids



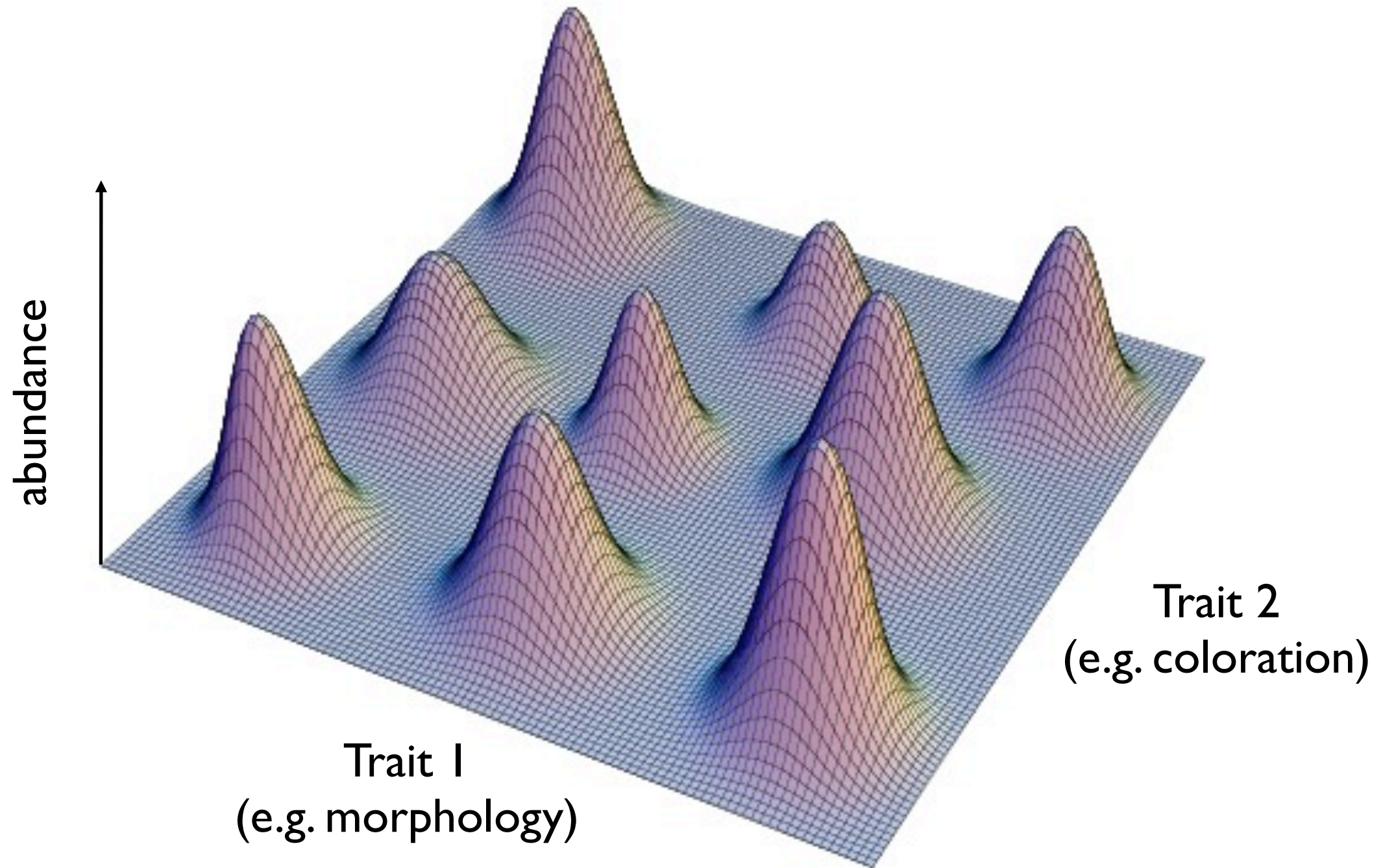


# Phenotypic diversity in morphology, behaviour, colour..



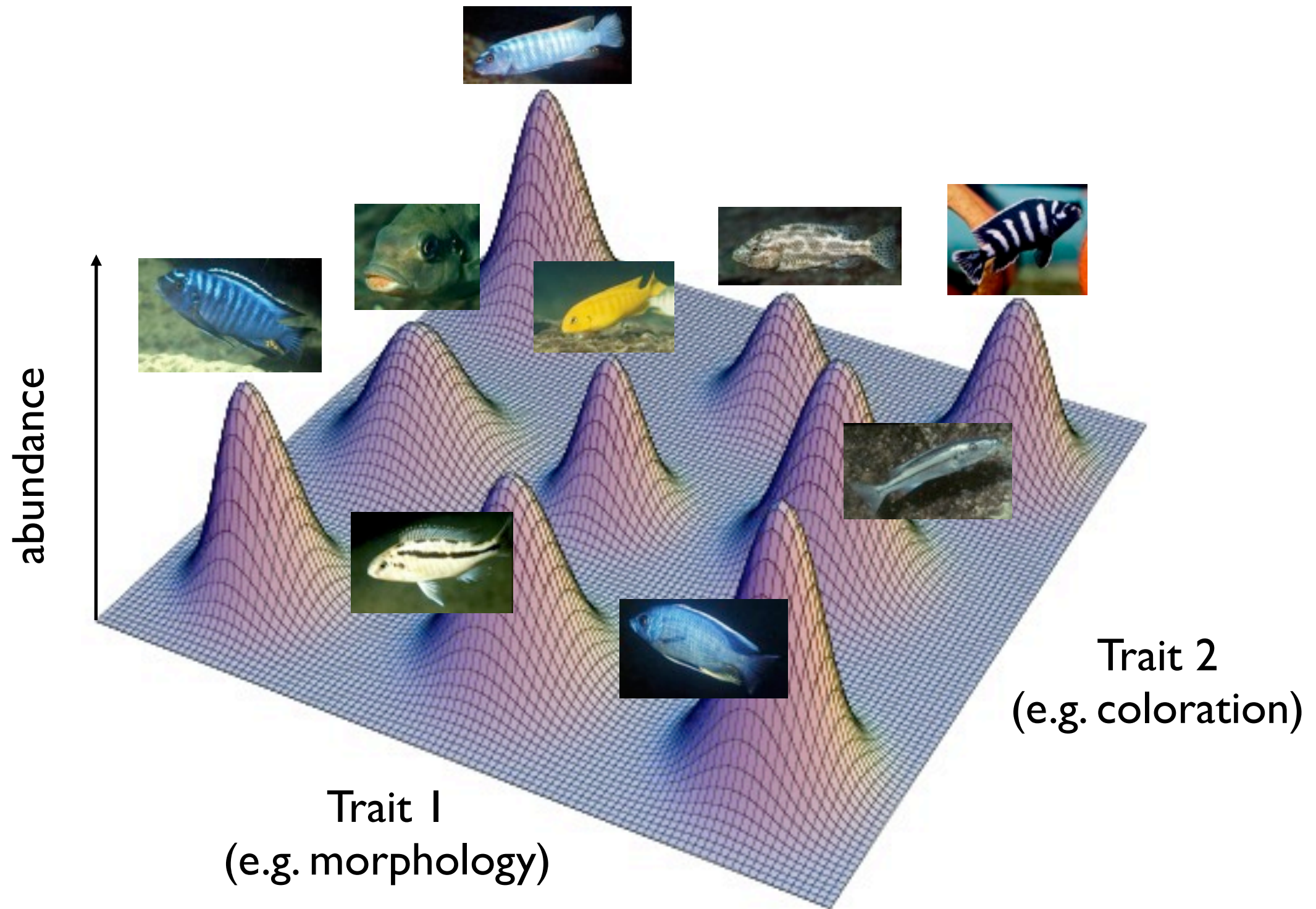


# Diversifity: multiple peaks in phenotype space



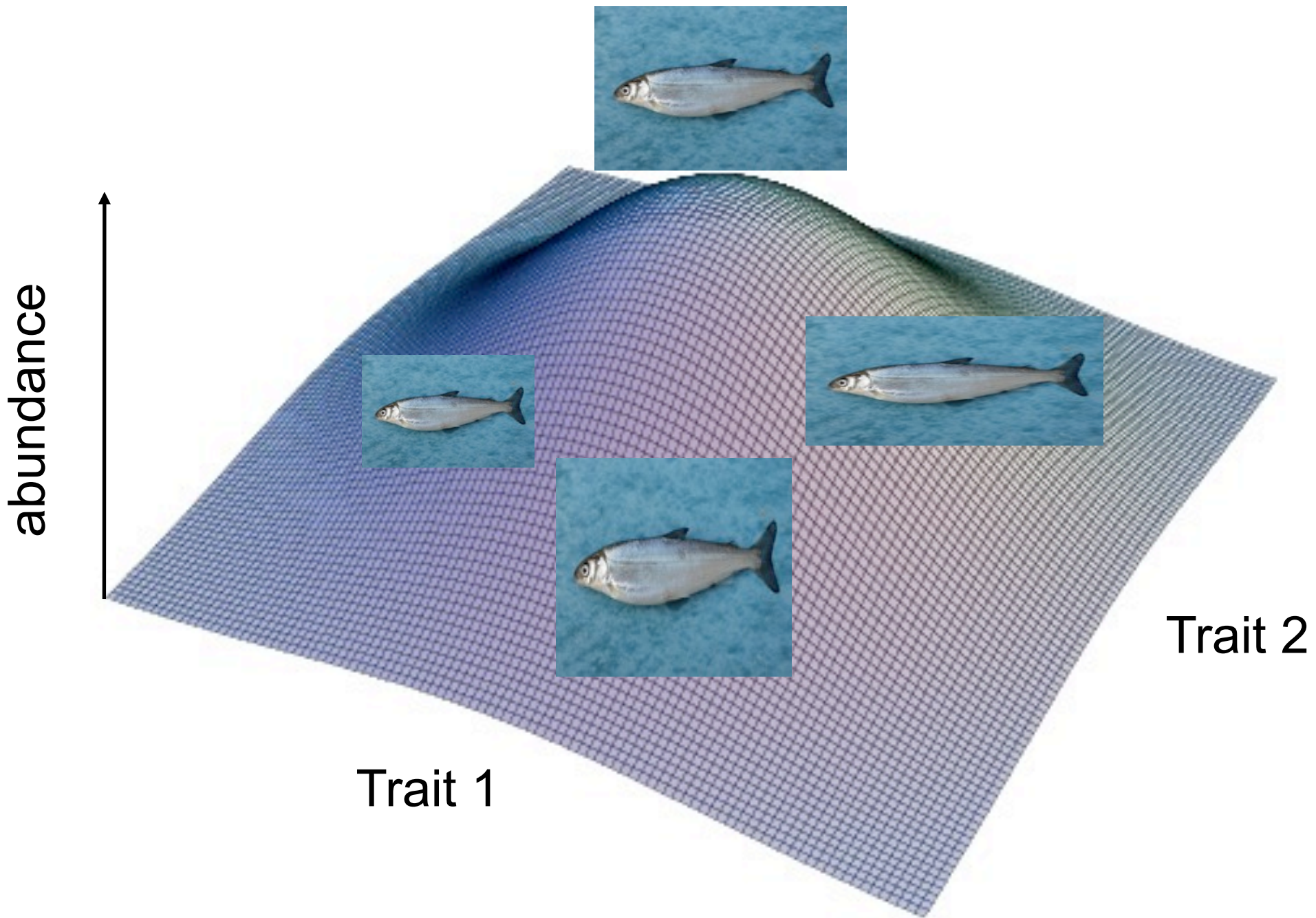


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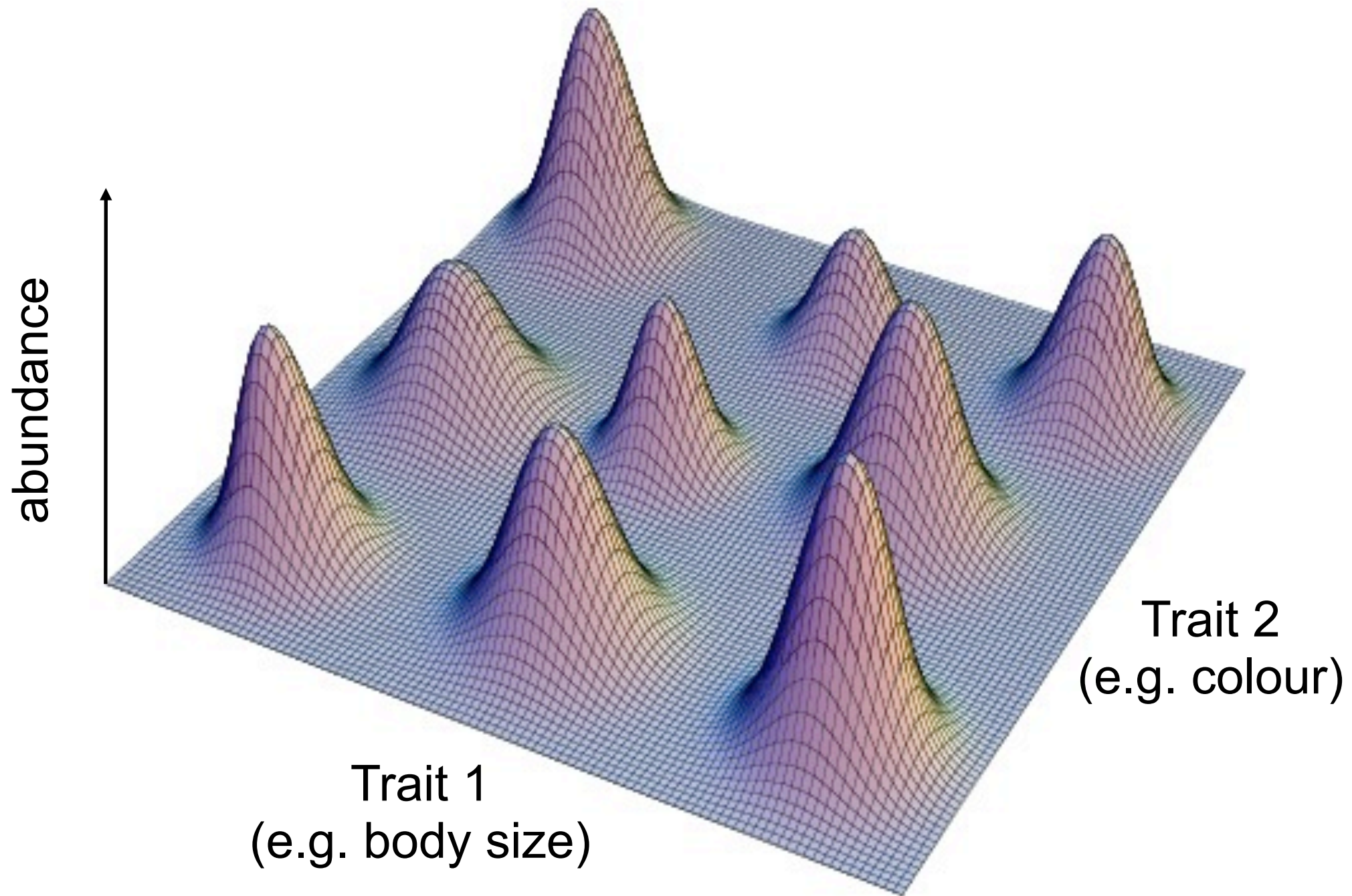


# No pattern in phenotype space: no diversity





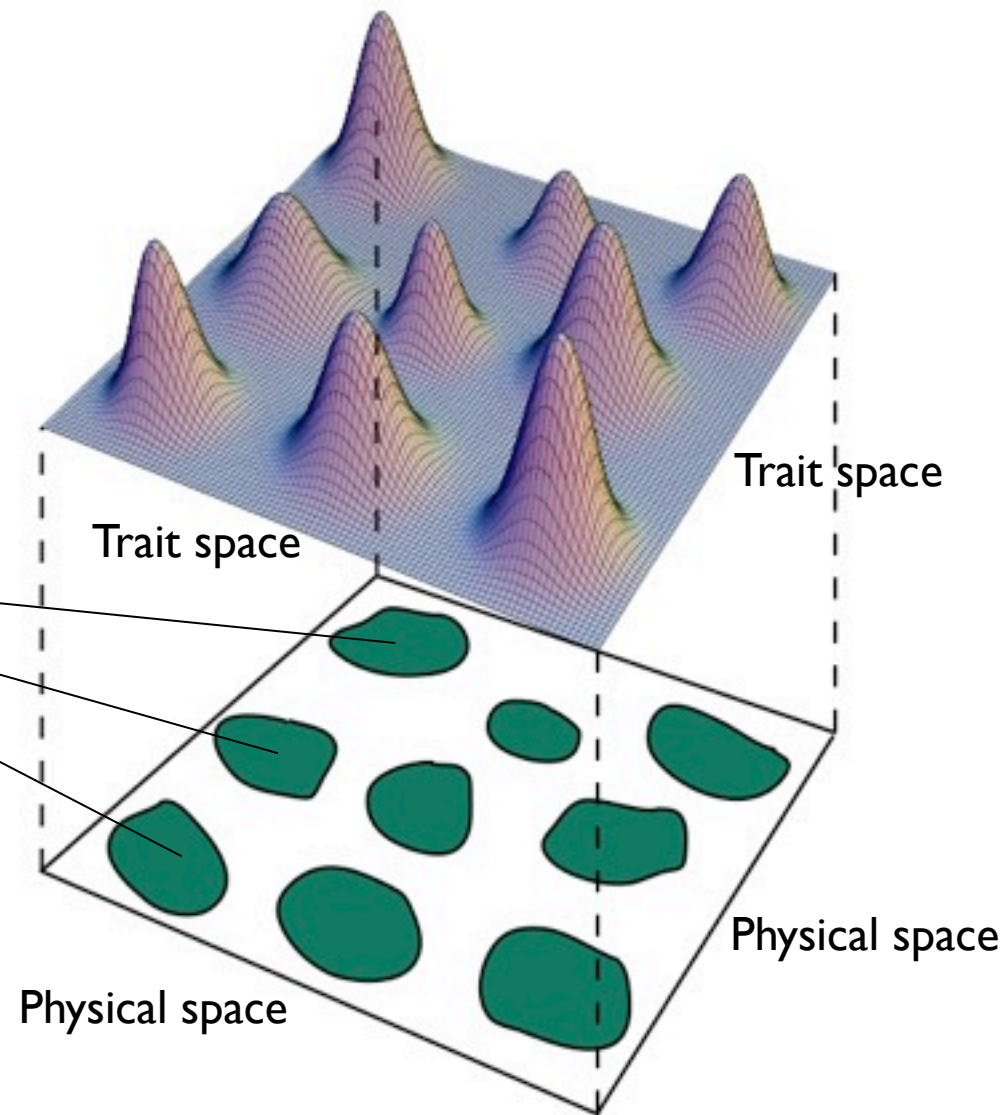
Diversification = Pattern formation in phenotype space





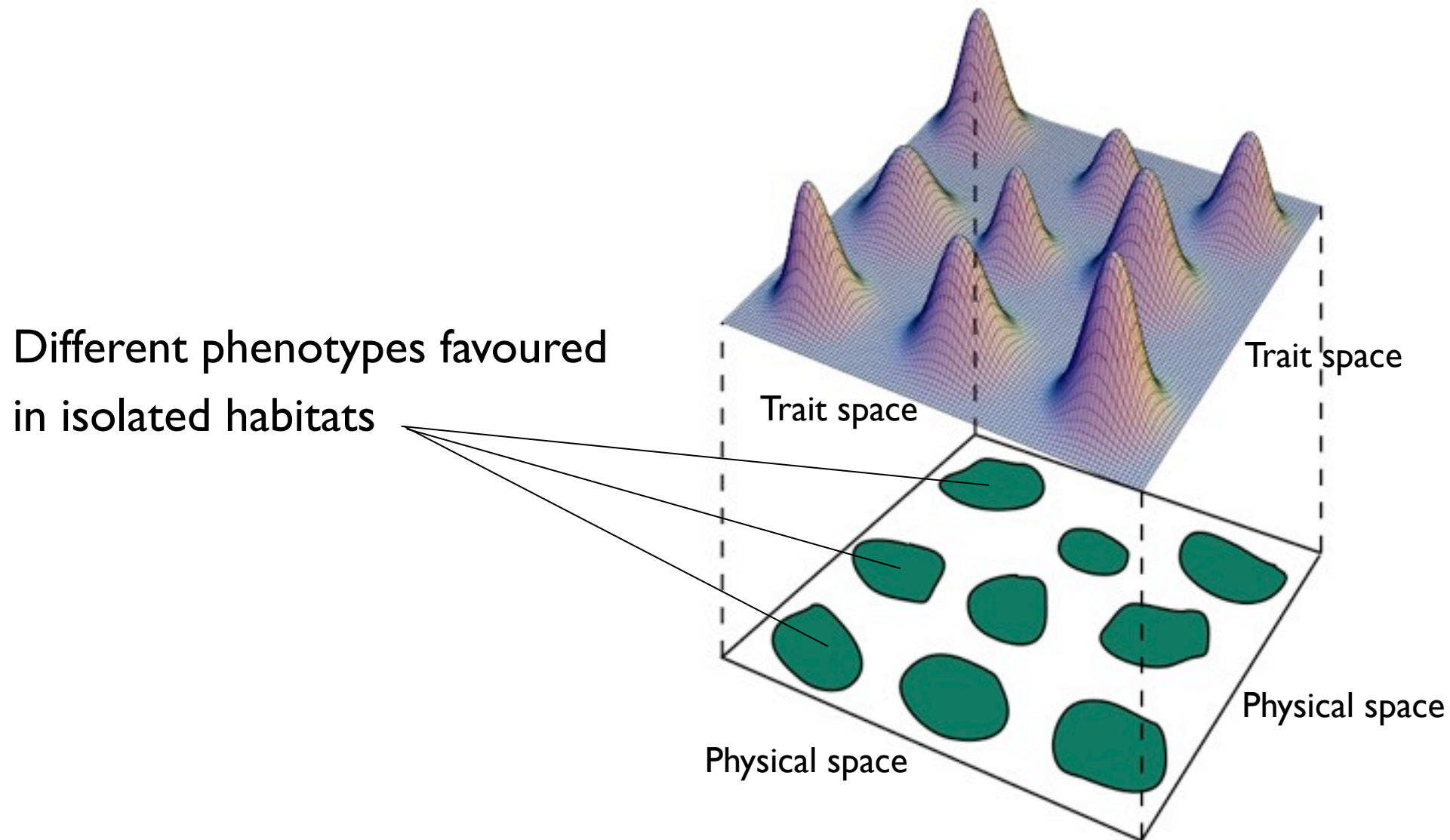
# *Diversification in geographic isolation*

Different phenotypes favoured  
in isolated habitats



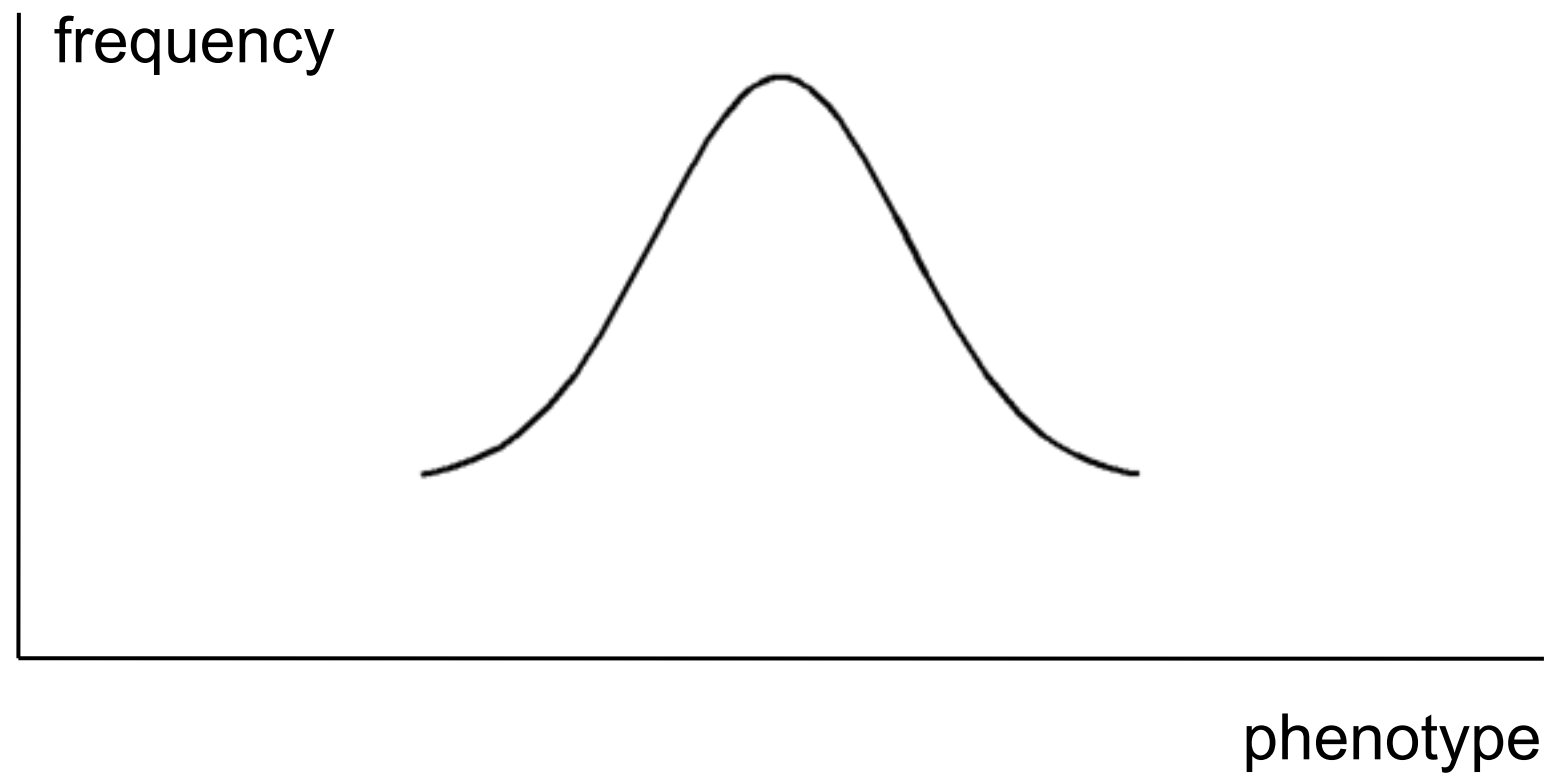


## *Diversification in geographic isolation*



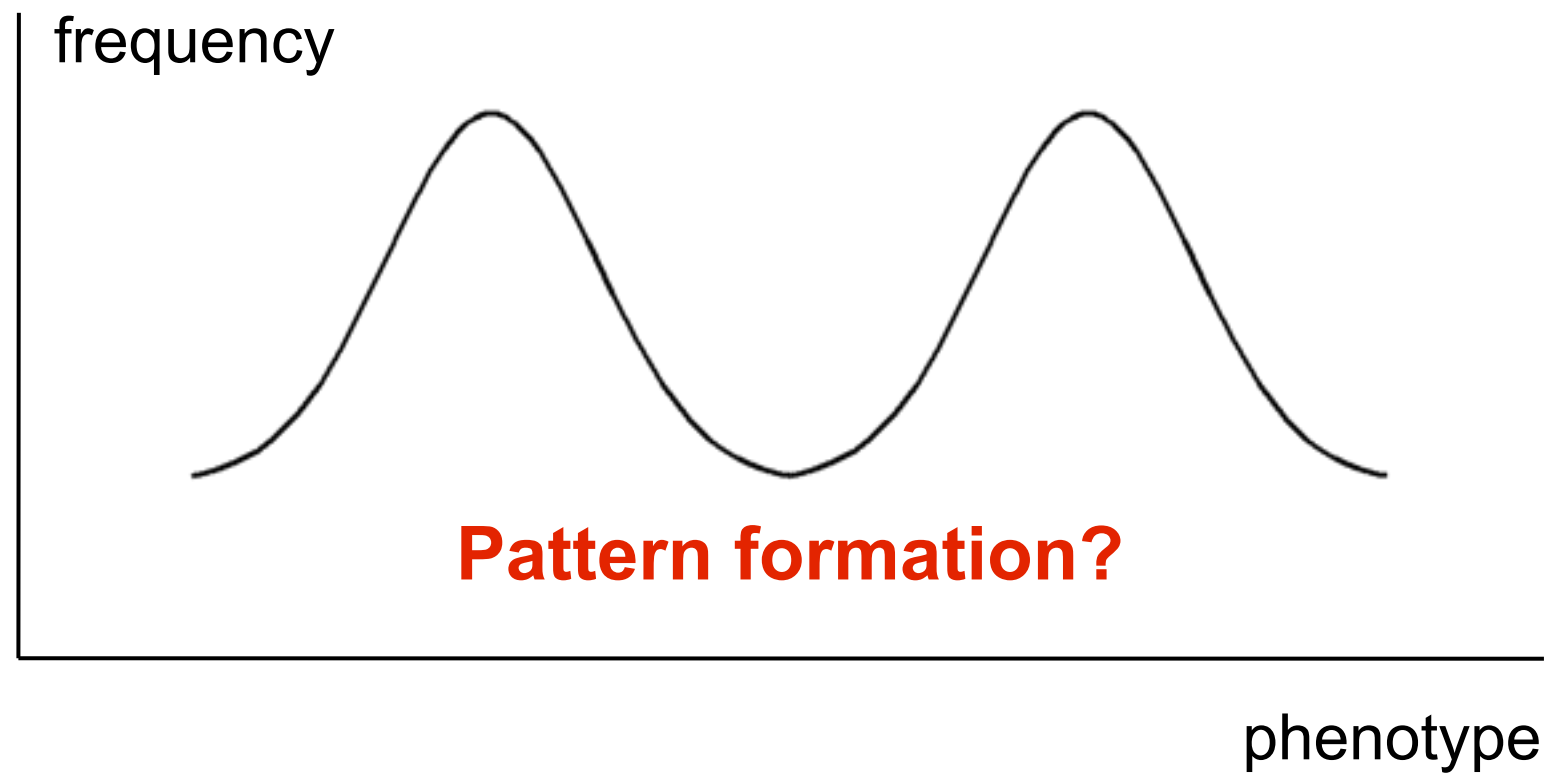
“[ ]The theory of selection among variations can explain the slow transformation of a single species in time, but it cannot, in itself, explain the splitting of species into diverse lines.” (Levins and Lewontin, 1985)

**Adaptive speciation** due to  
ecological interactions in single (well-mixed) habitat:





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ecological interactions in single (well-mixed) habitat:



# Adaptive Diversification

1. An empirical example
2. Two different theoretical approaches
3. Adaptive diversification in high-dimensional phenotype spaces

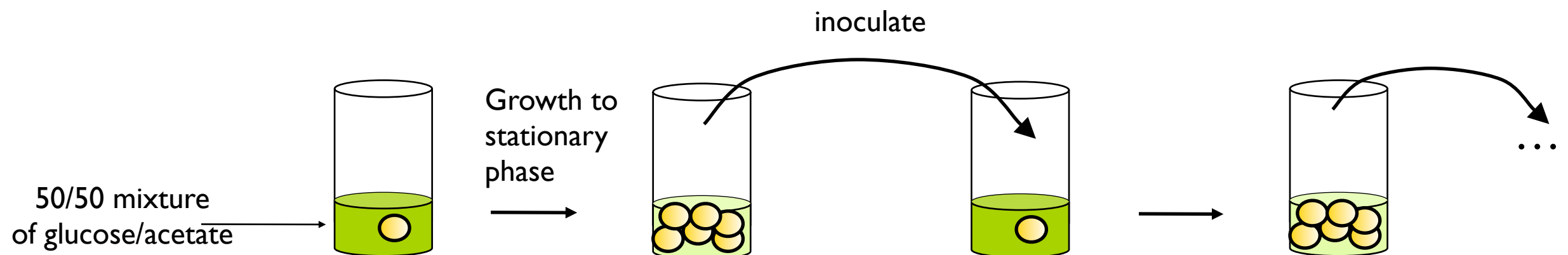




Example: Adaptive diversification in *Escherichia coli*

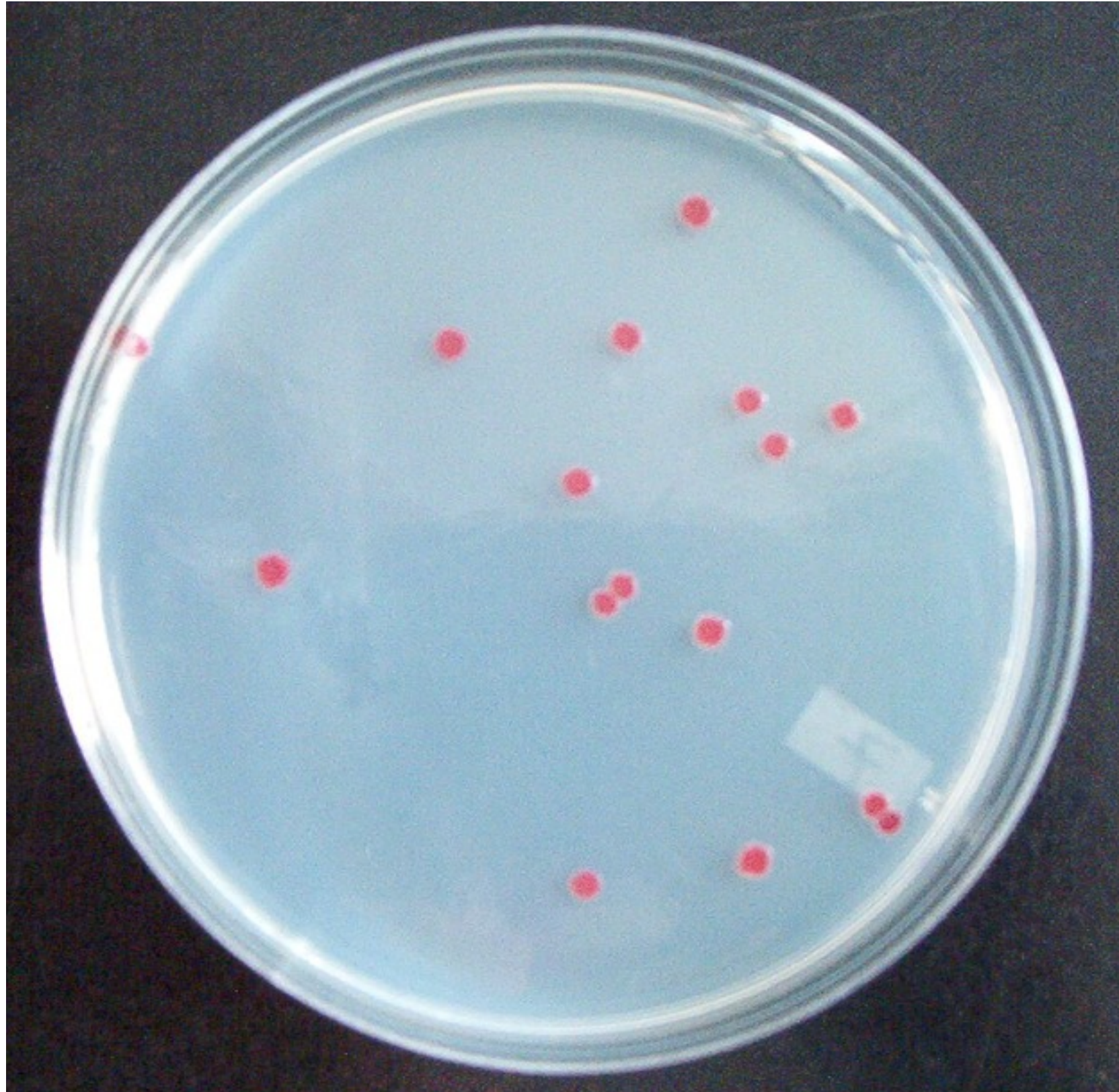
## Long-term evolution experiments with *E. Coli*

- Environment: two limiting carbon sources (50% glucose, 50% acetate), well-mixed populations
- Replicate experimental lines propagated in serial batch cultures for ~1,000 generations:



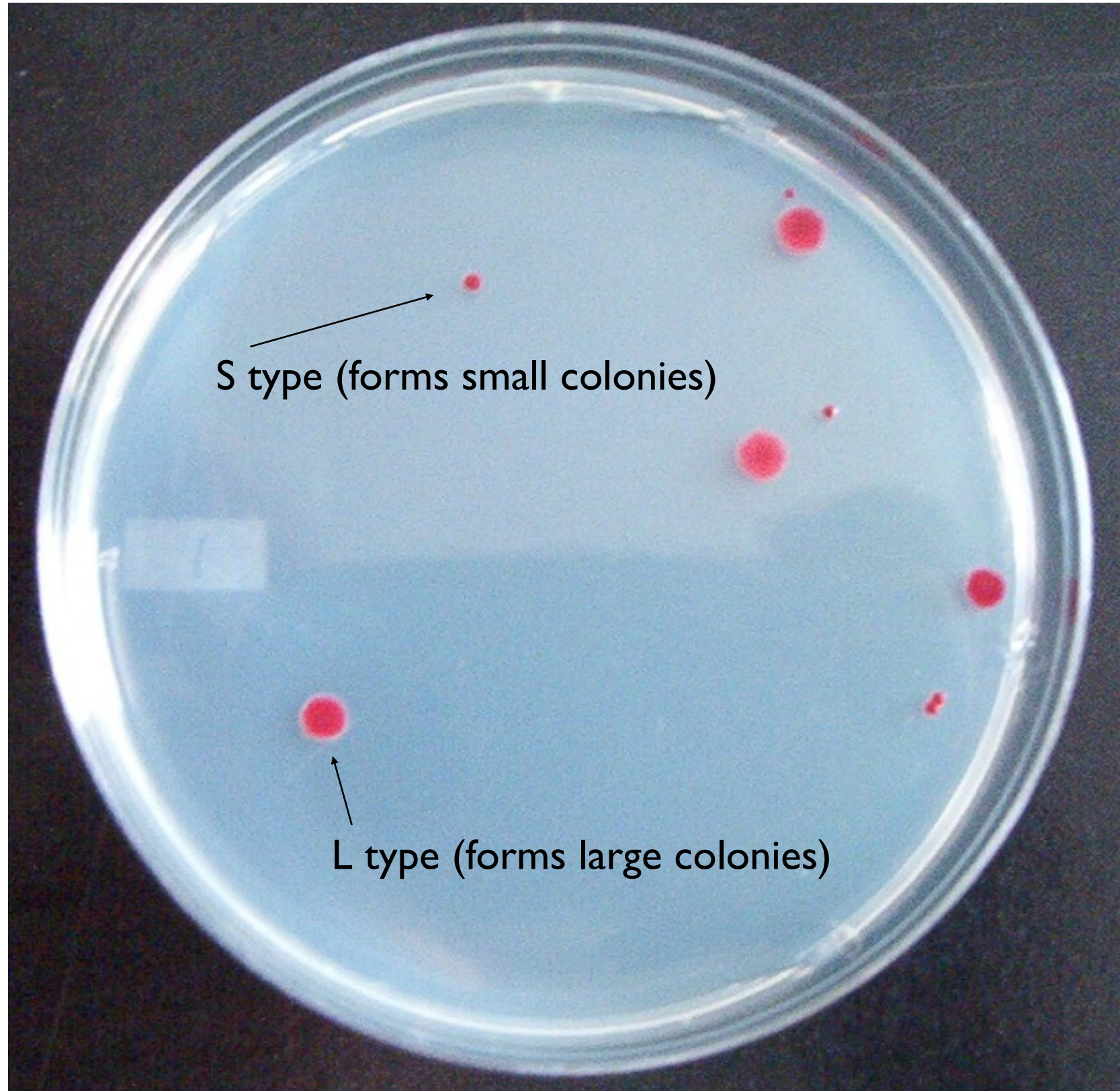


Diversification in colony morphology  
in 10 out of 10 replicate populations:



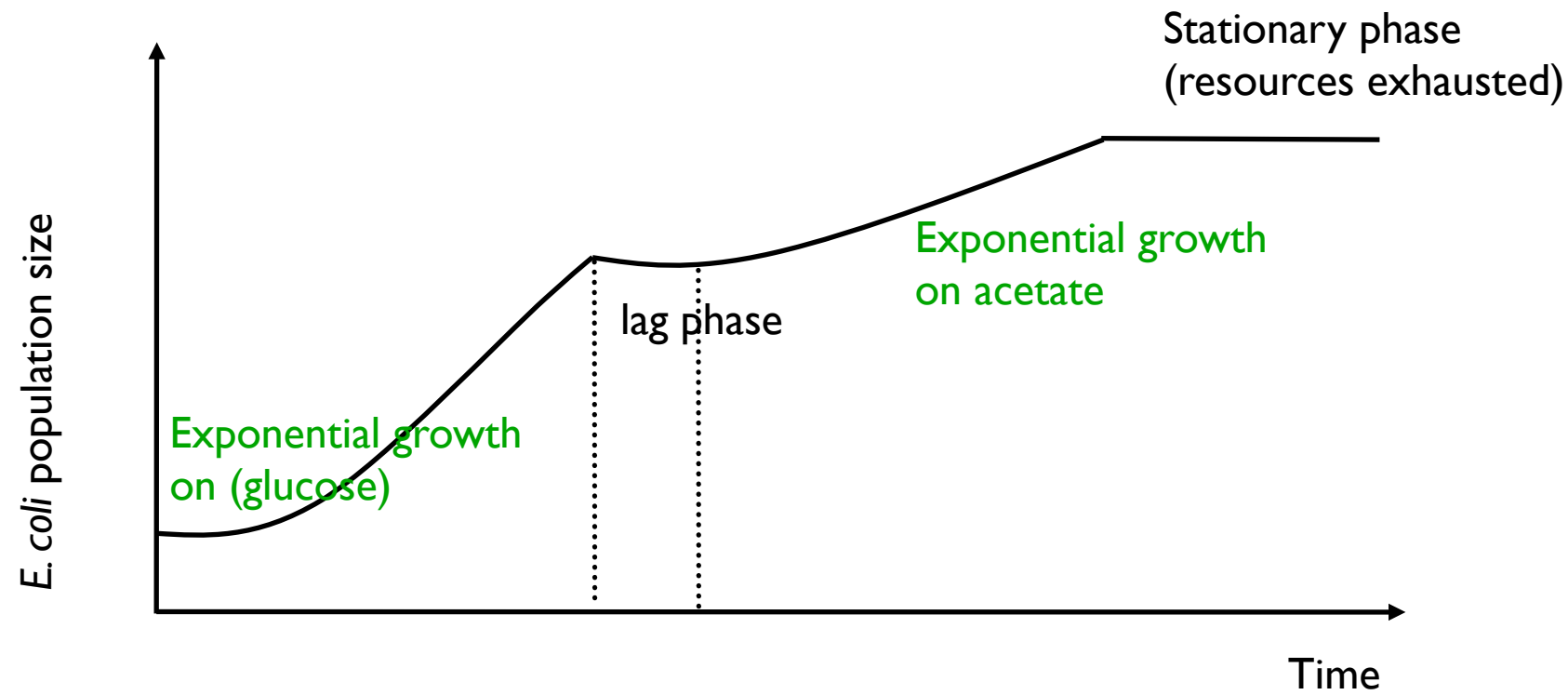


Diversification in colony morphology  
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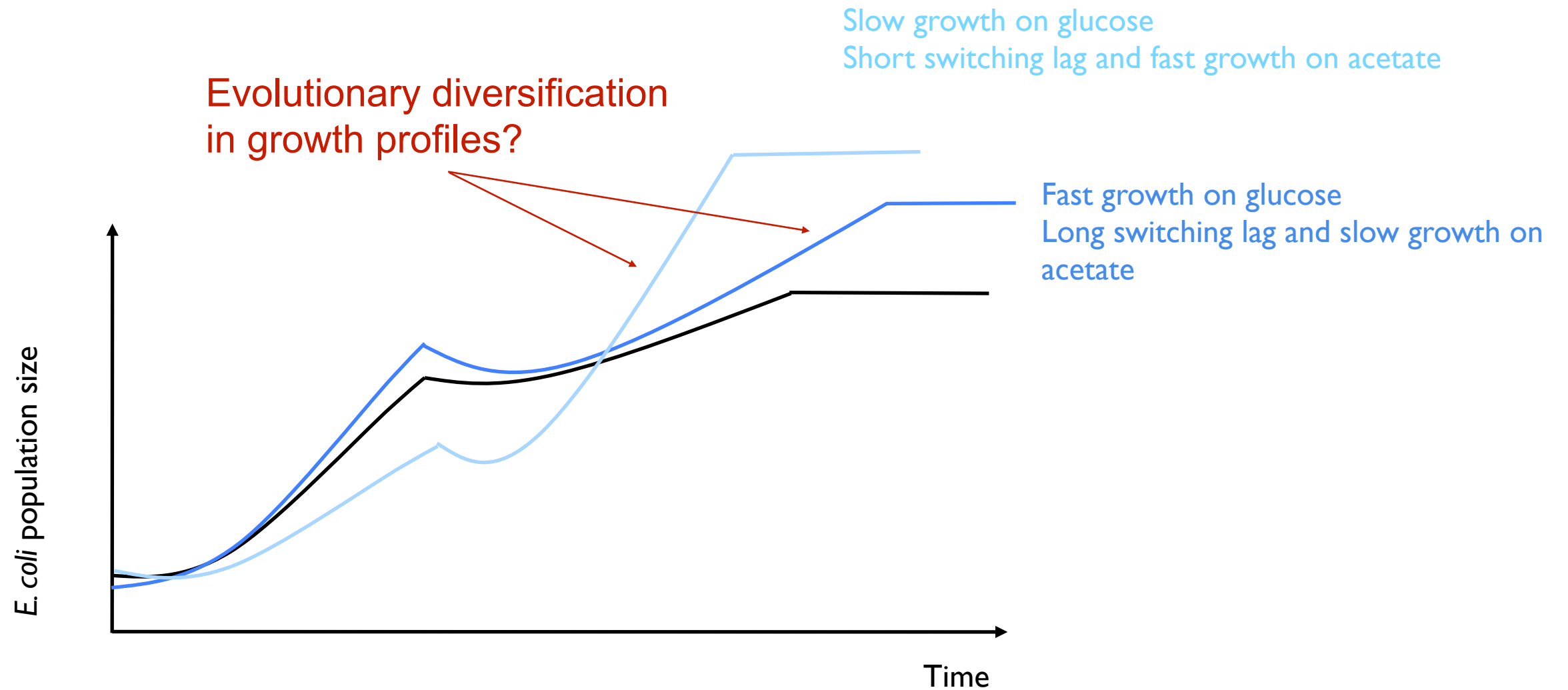




*Diauxy*: sequential use of two different resources in batch culture  
(phenotypic plasticity in seasonal environment)

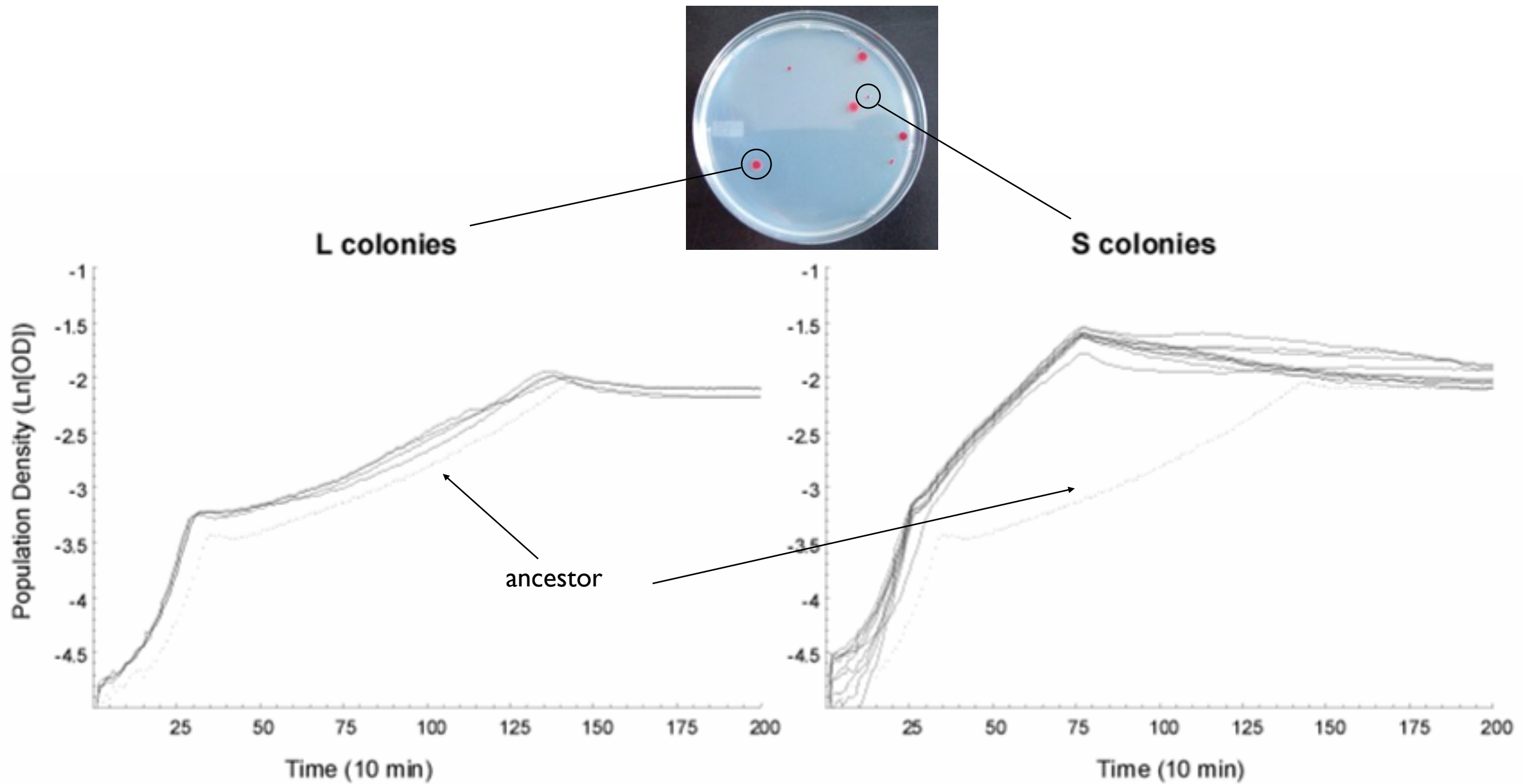


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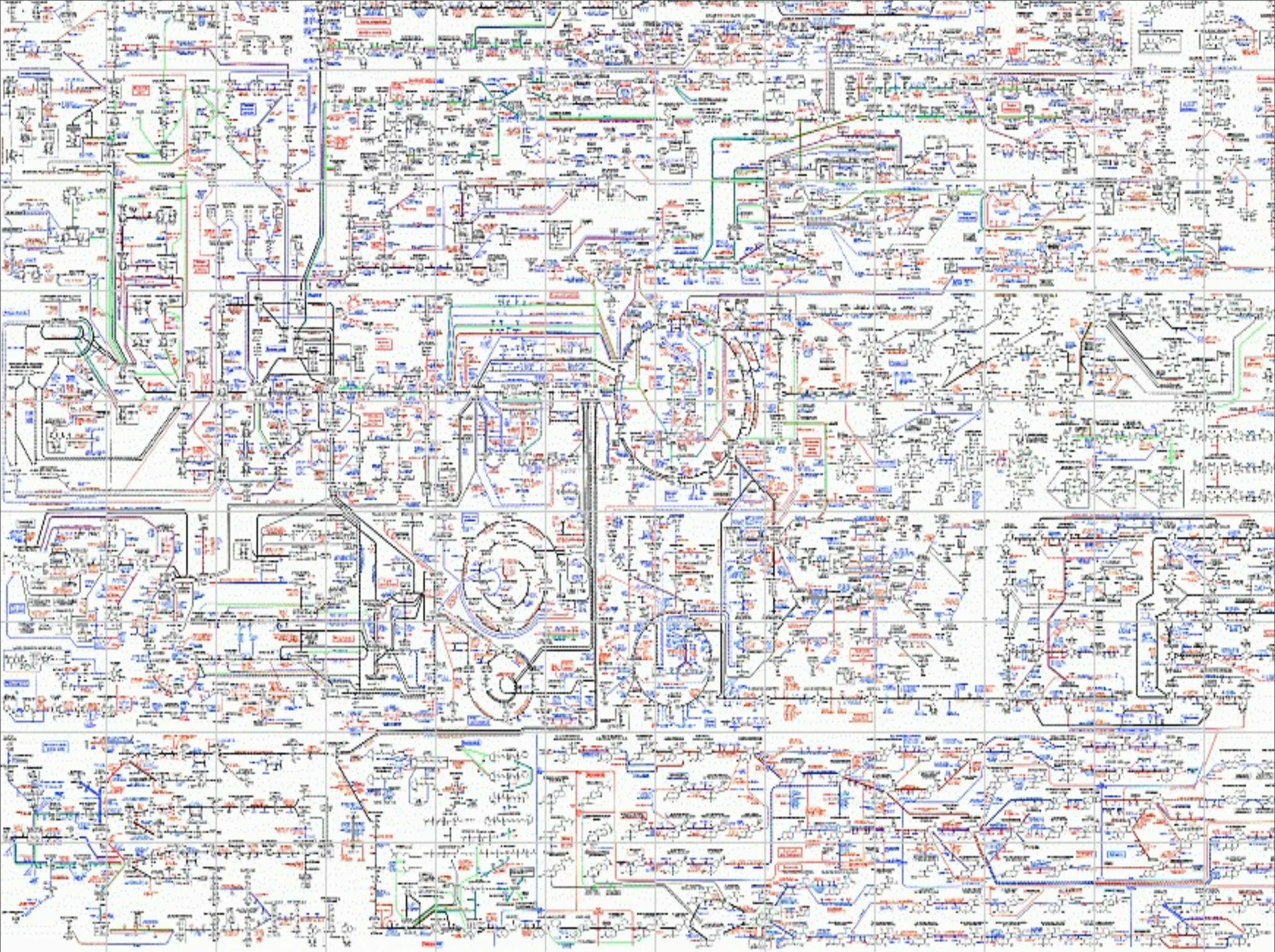




# Large (L) and Small (S) colonies exhibit different diauxy behavior:

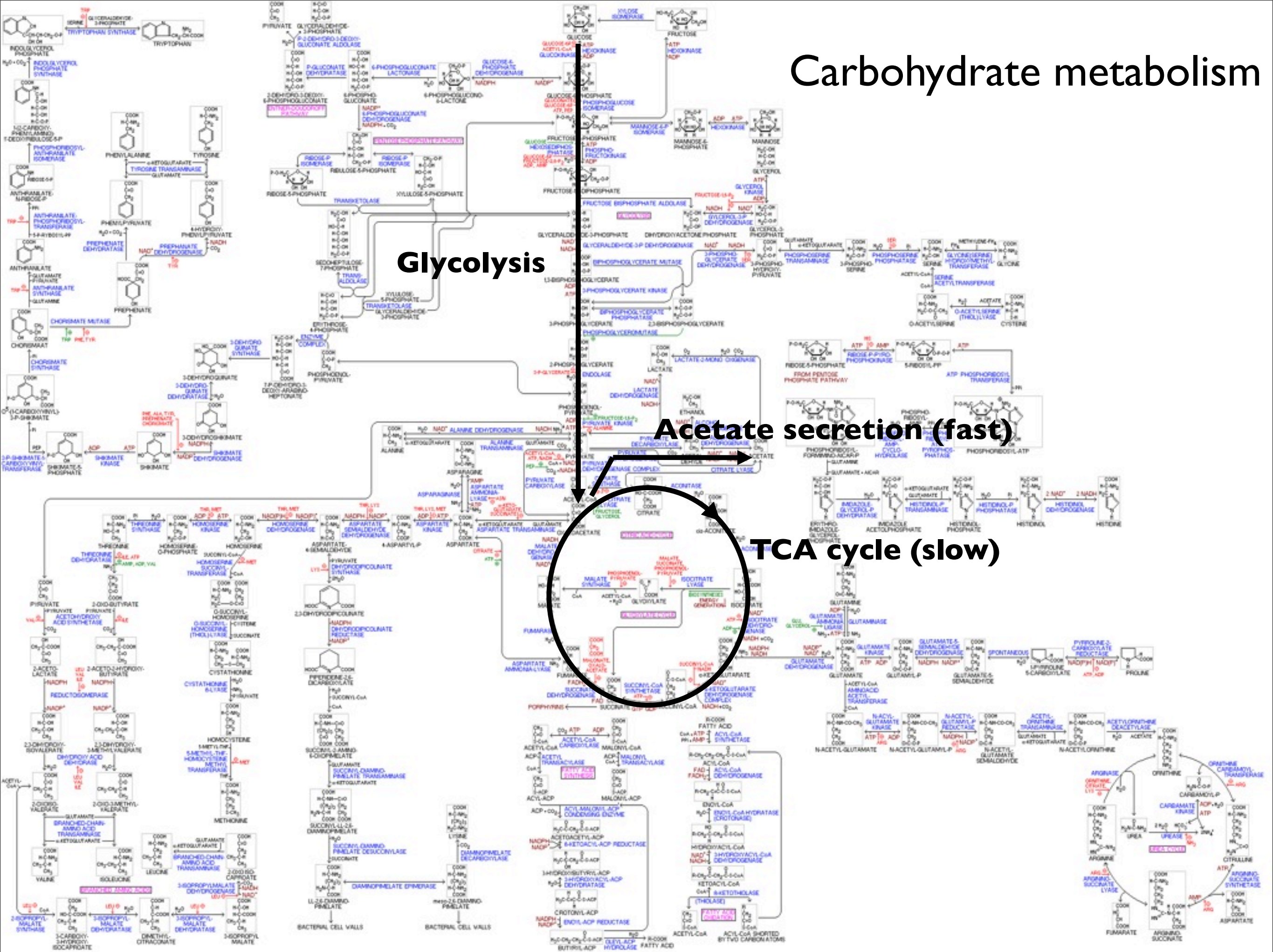








# Carbohydrate metabolism



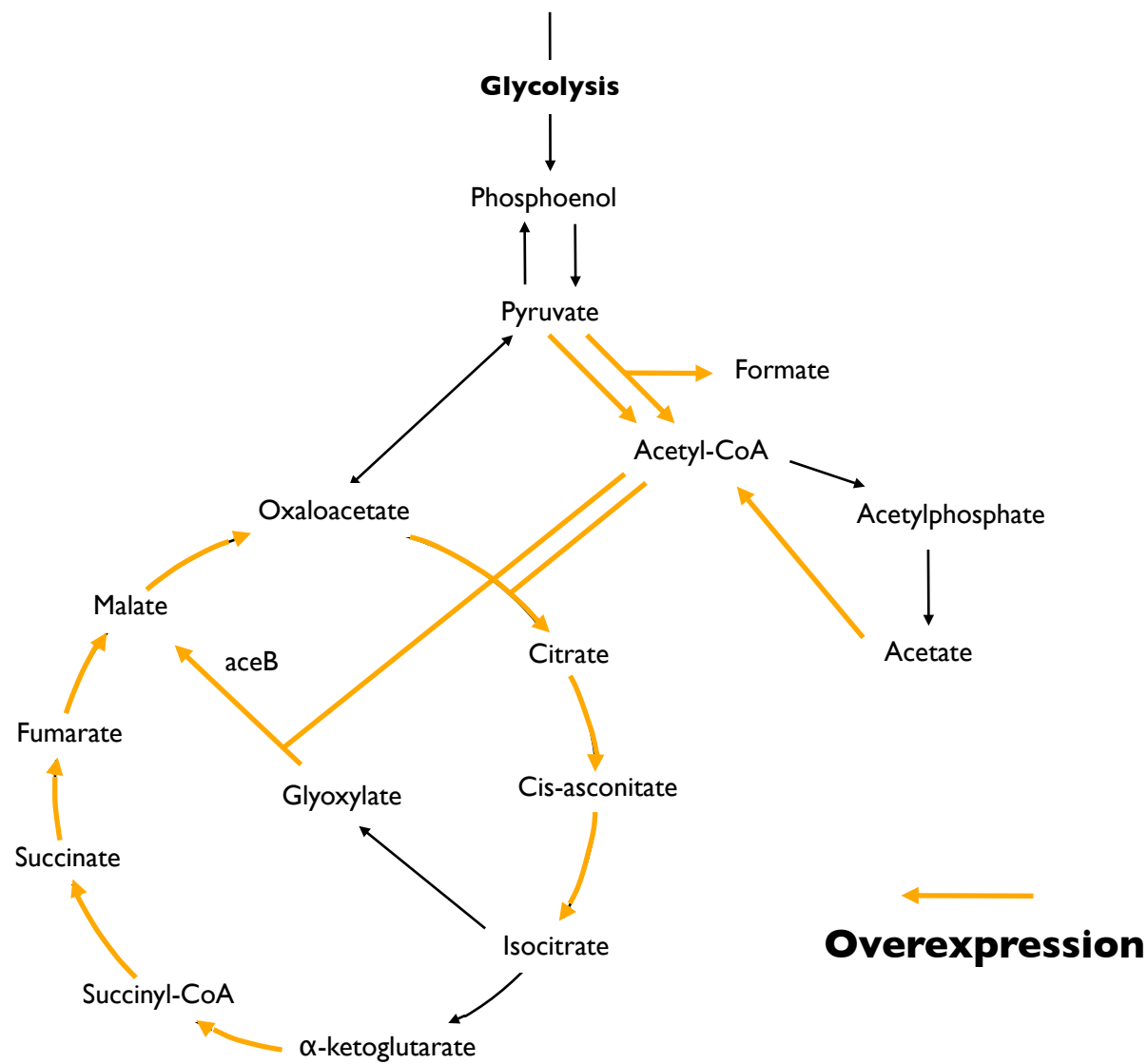
**Glycolysis**

**Acetate secretion (fast)**

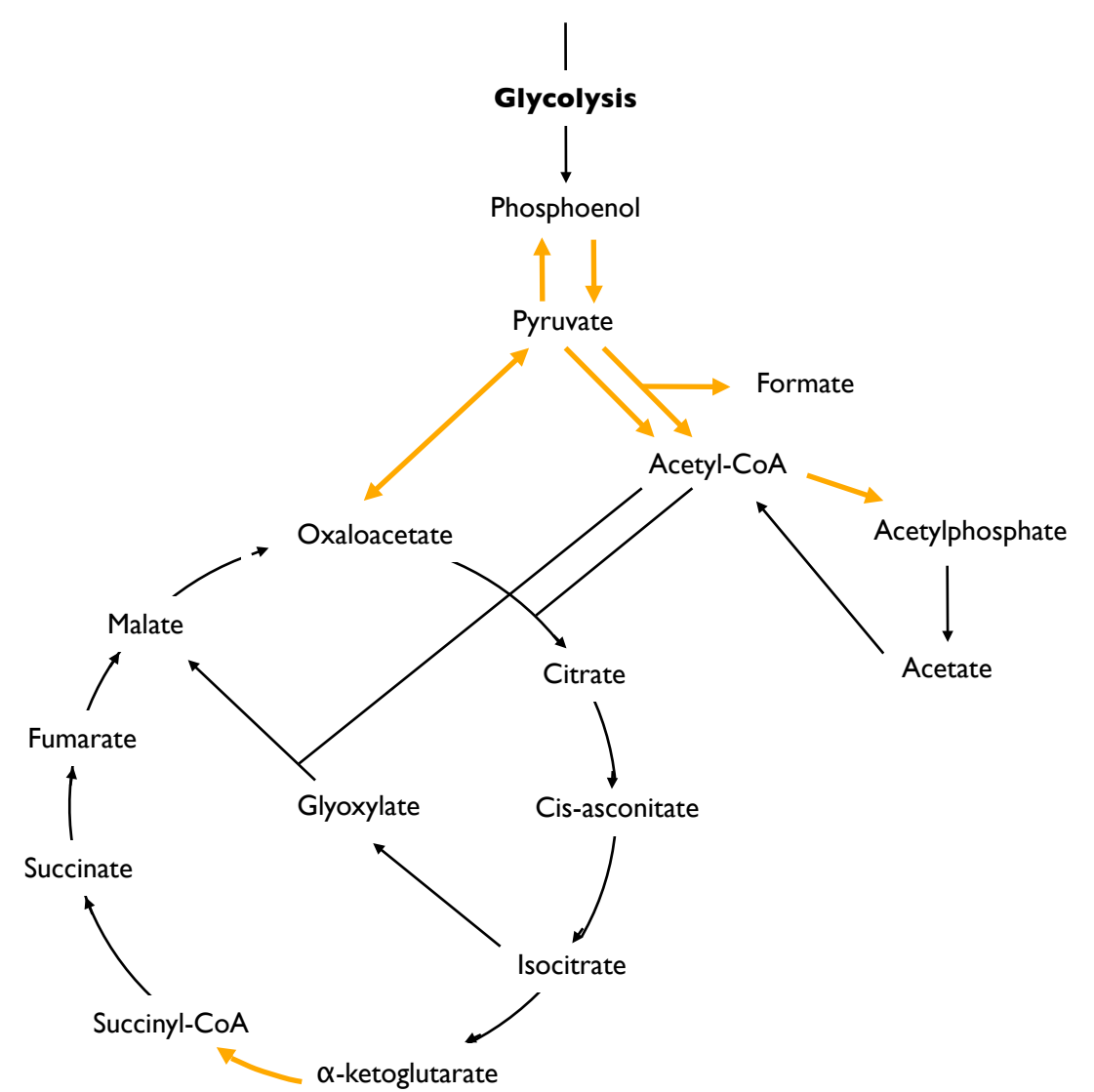
**TCA cycle (slow)**

# Difference in global gene expression: Increased TCA cycle activity in Smalls

**Small** vs. ancestor:

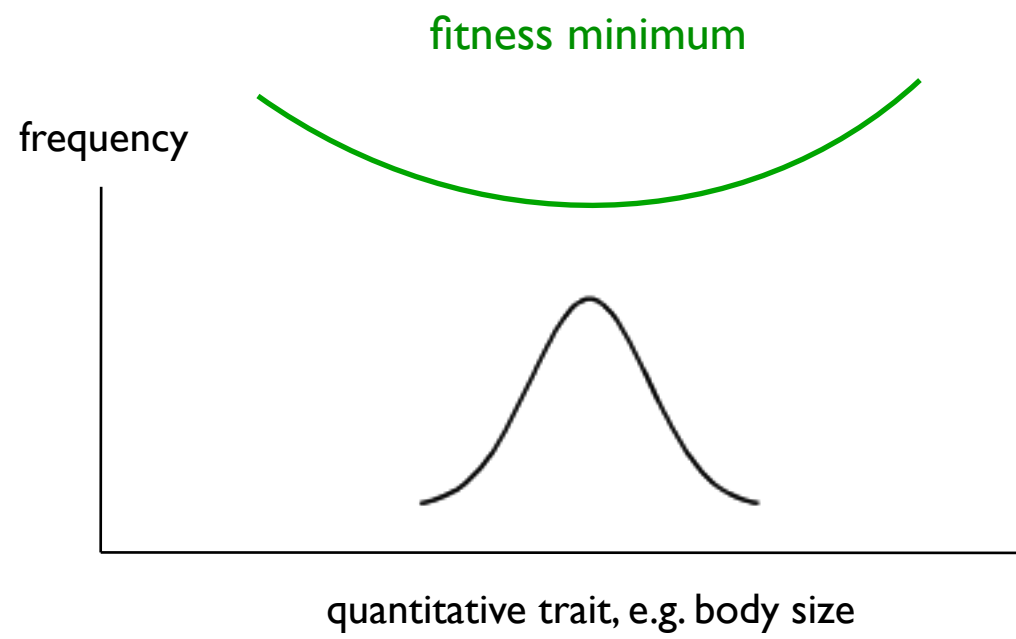


**Large** vs. ancestor:

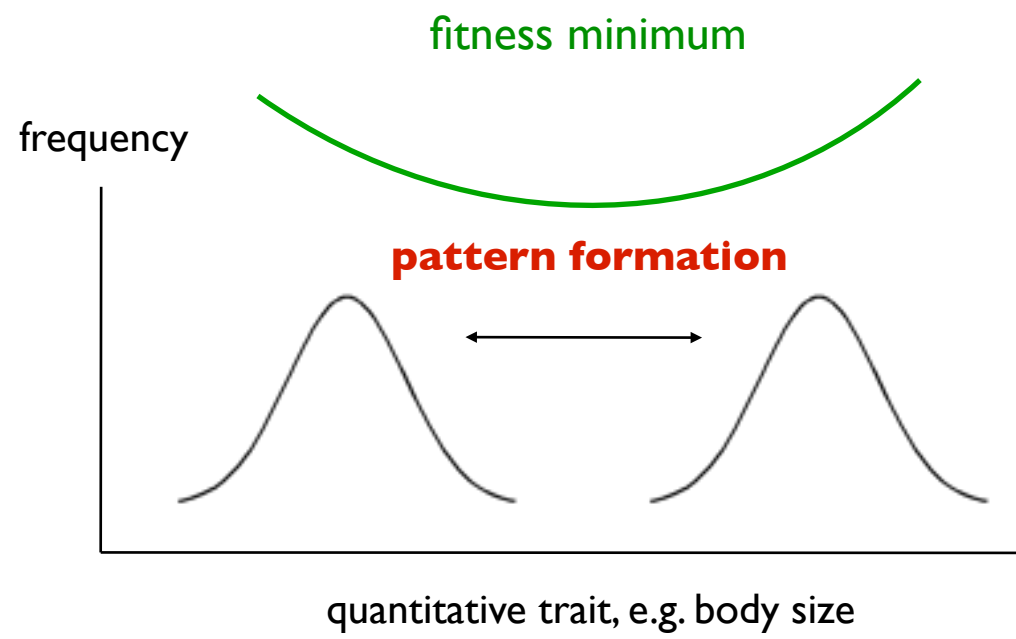




# Adaptive Diversification

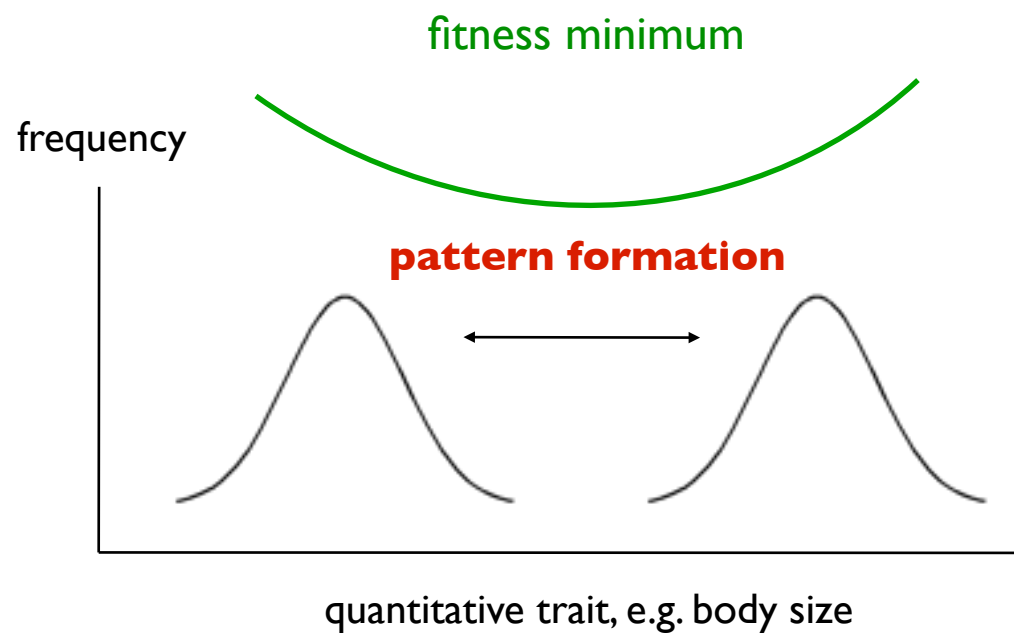


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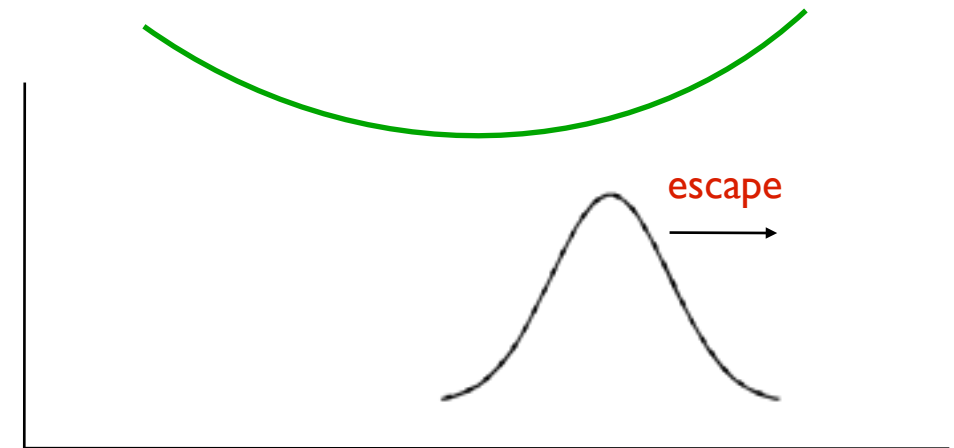


# Theoretical Problems

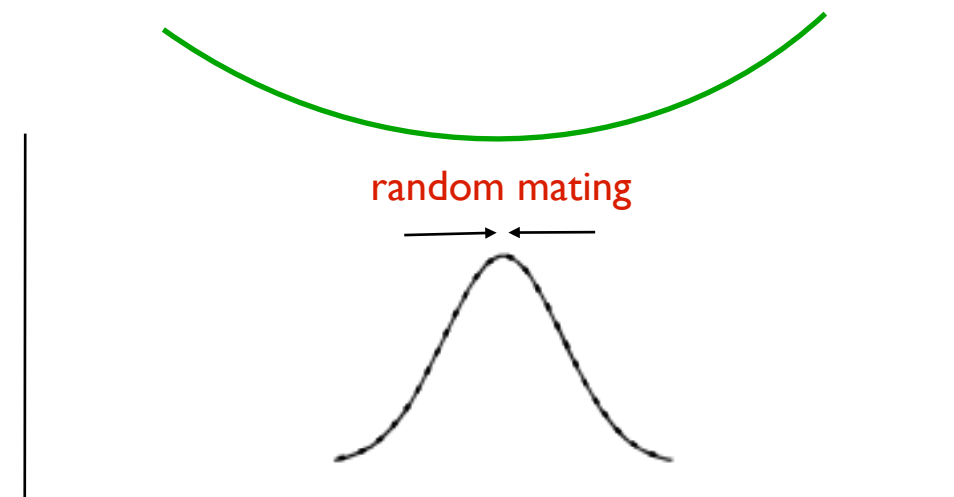
## Adaptive Diversification



Ecology: fitness minima are unstable

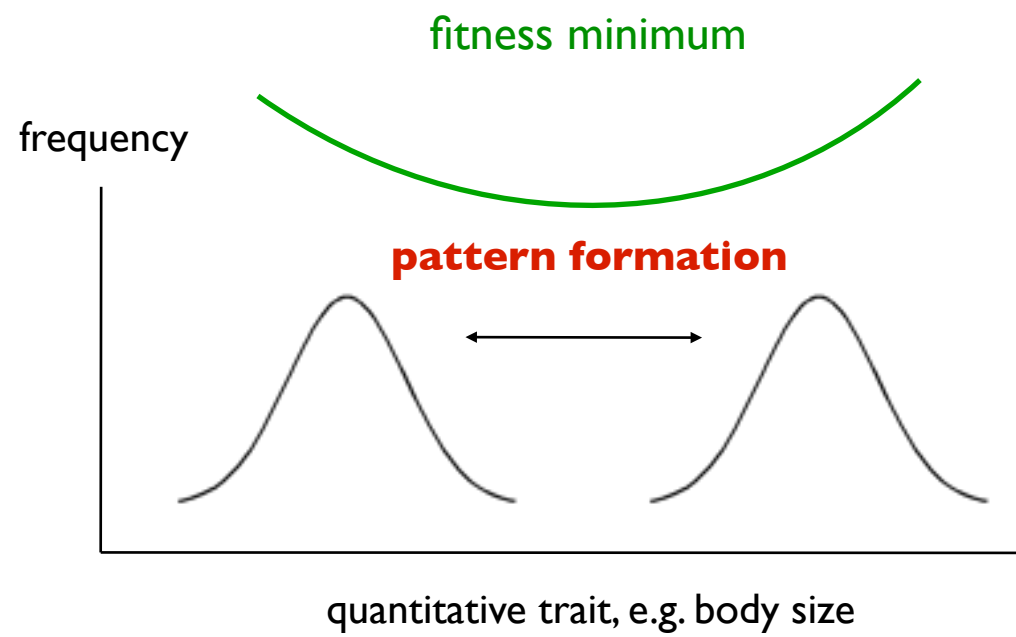


Population genetics: recombination prevents divergence



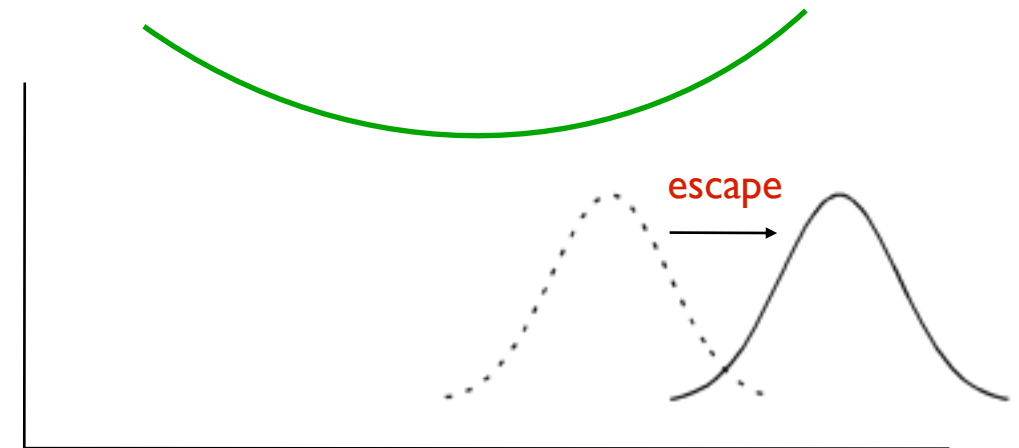


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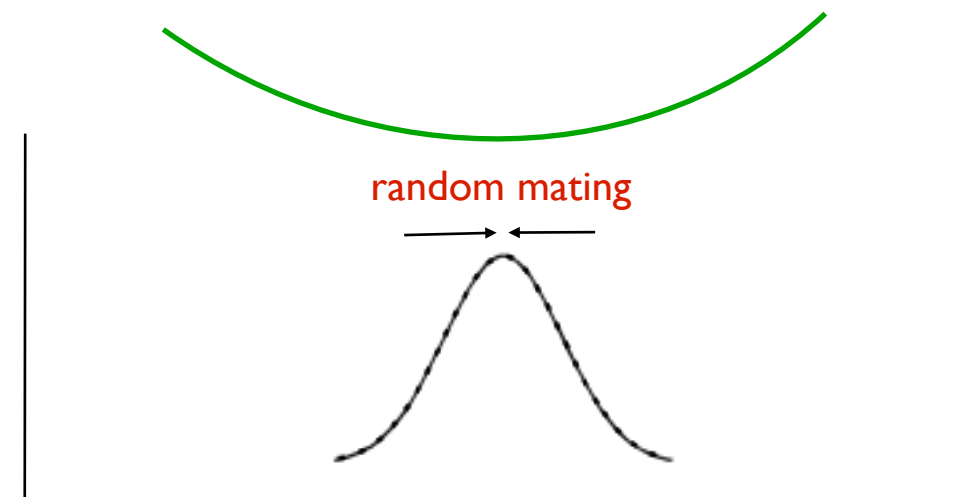


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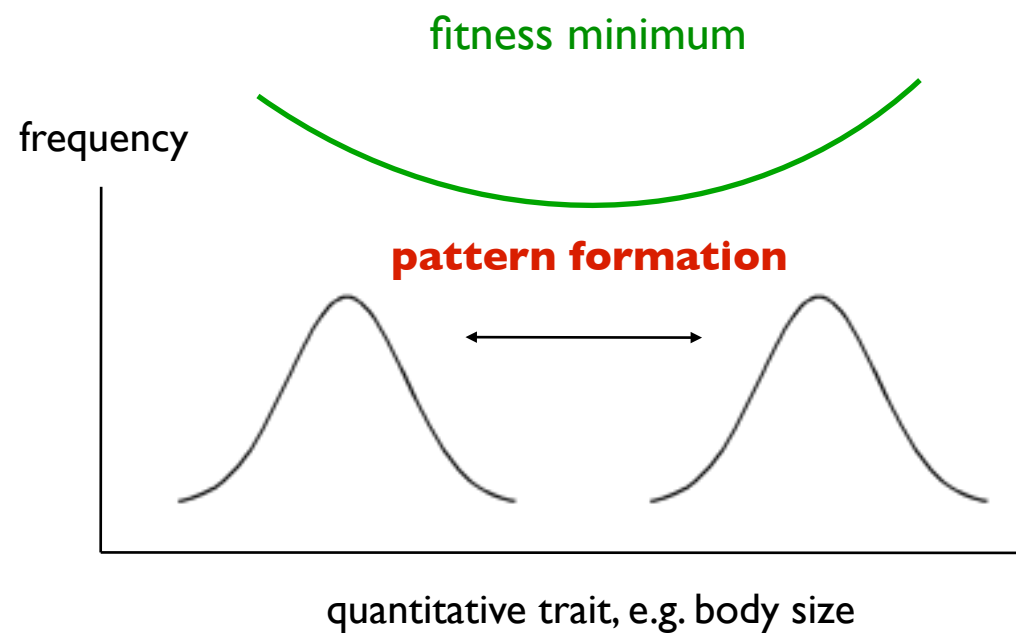
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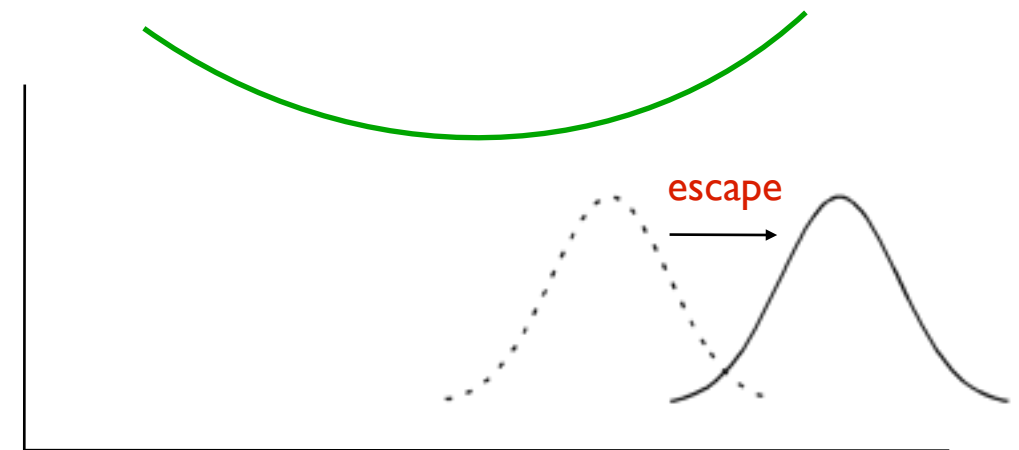


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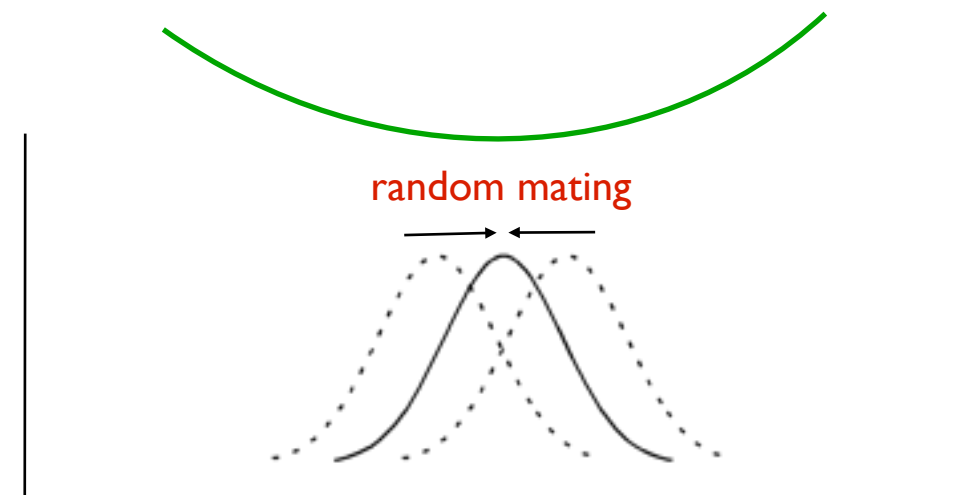


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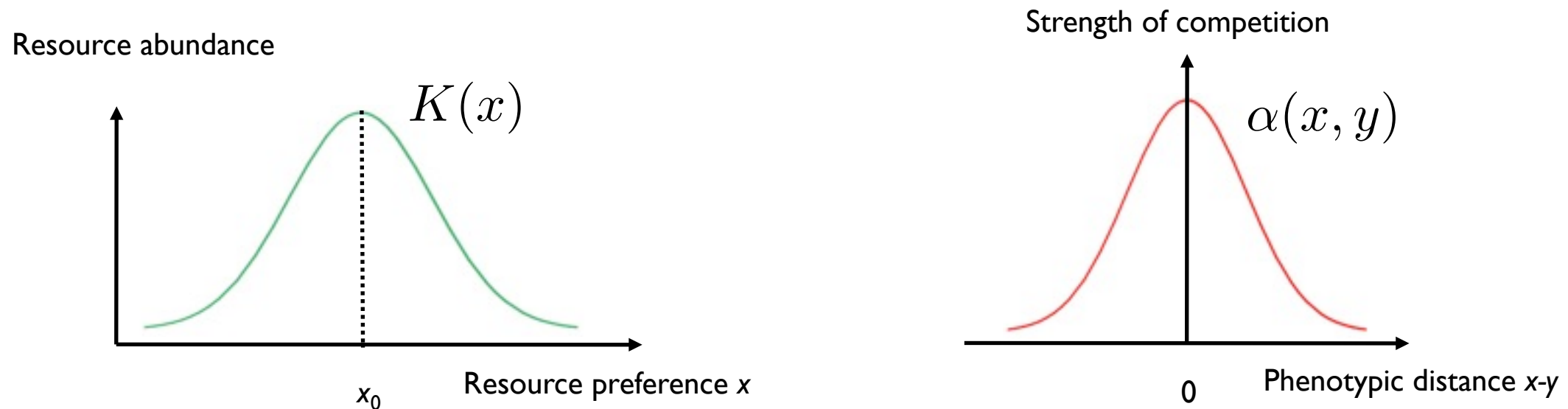
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# Adaptive diversification due to resource competition



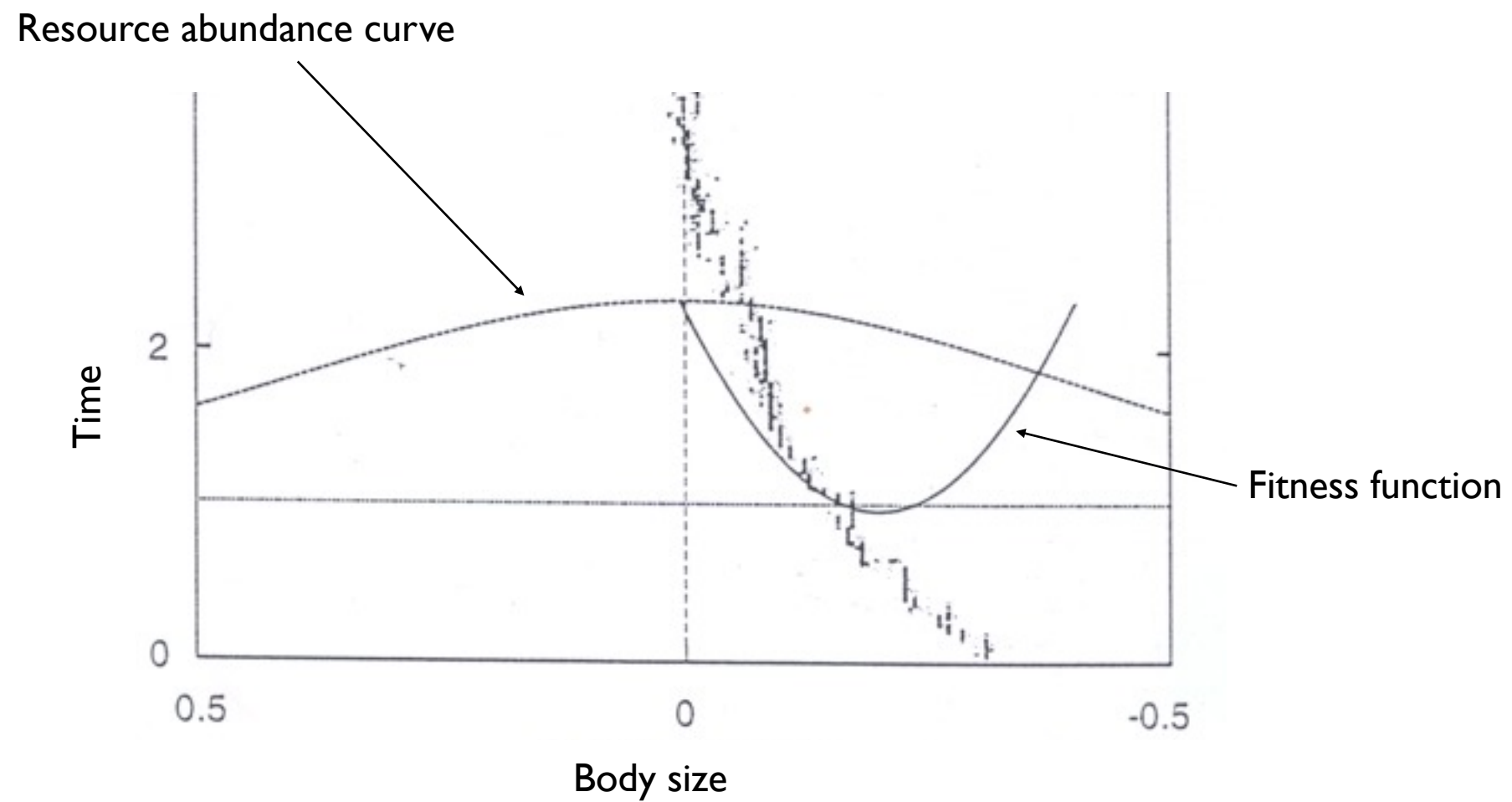
## individuals with phenotype $x$

- per capita birth rate:  $b = 1$  (constant), asexual reproduction with small mutations

- per capita death rate: 
$$\frac{b}{K(x)} \sum_y \alpha(x - y)$$

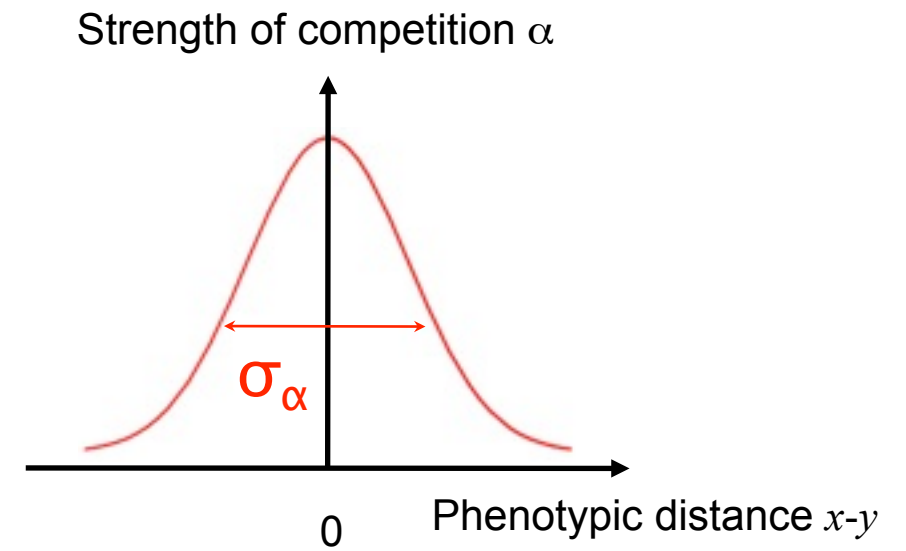
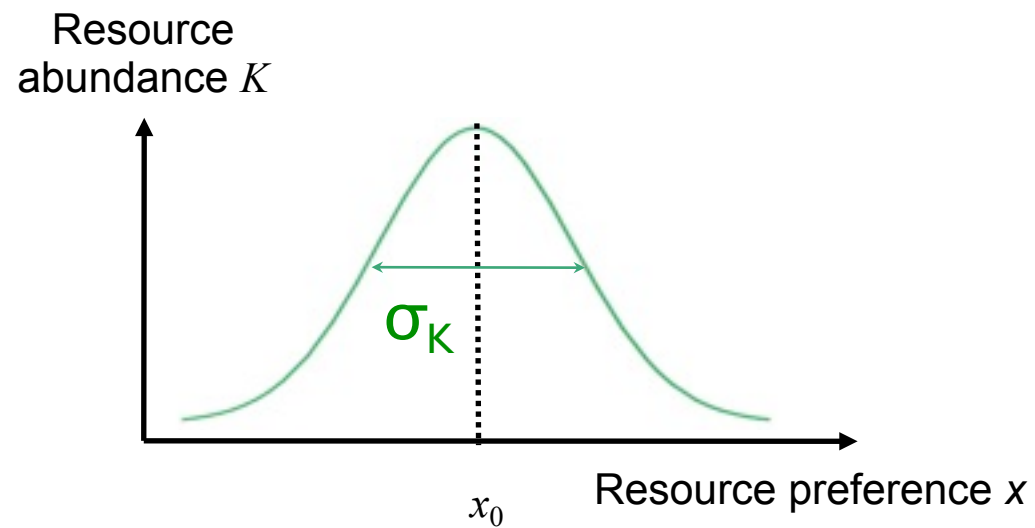
depends on phenotype and on the phenotypes of the other individual in the population (rare phenotypes have lower death rates than common phenotypes)

First, mean phenotype evolves to maximum of resource curve...

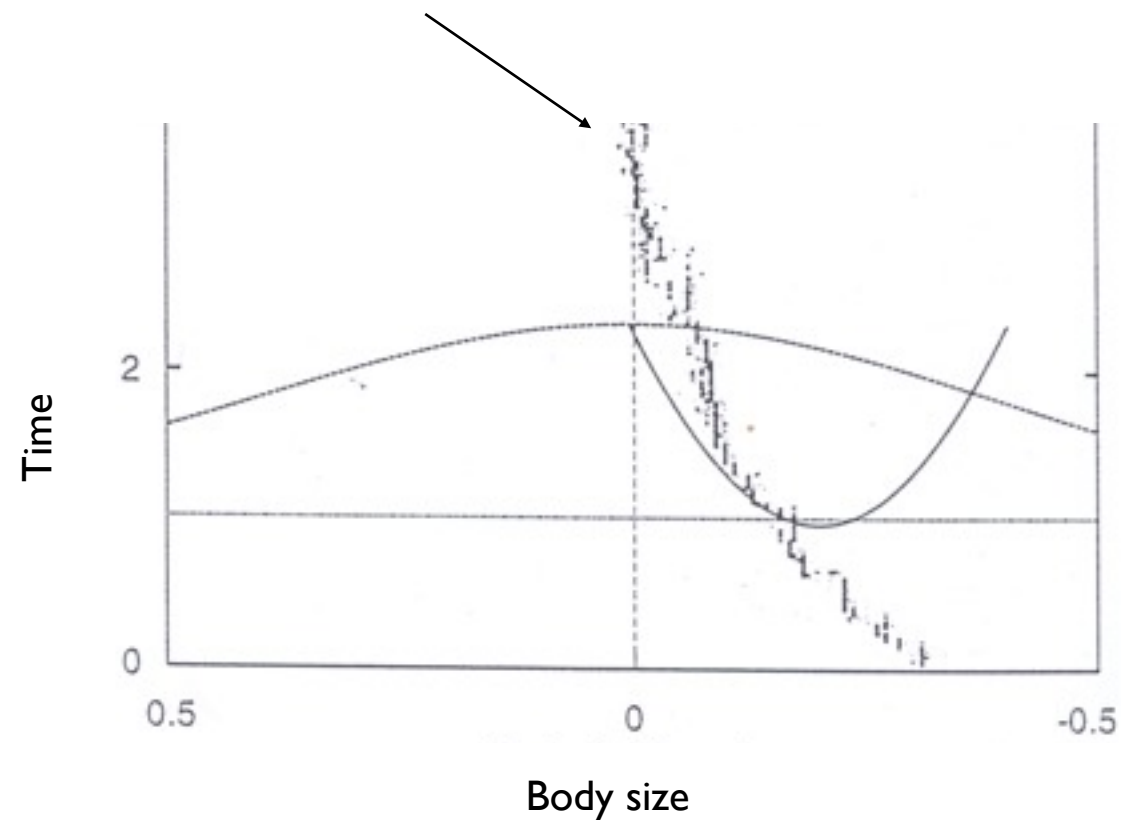




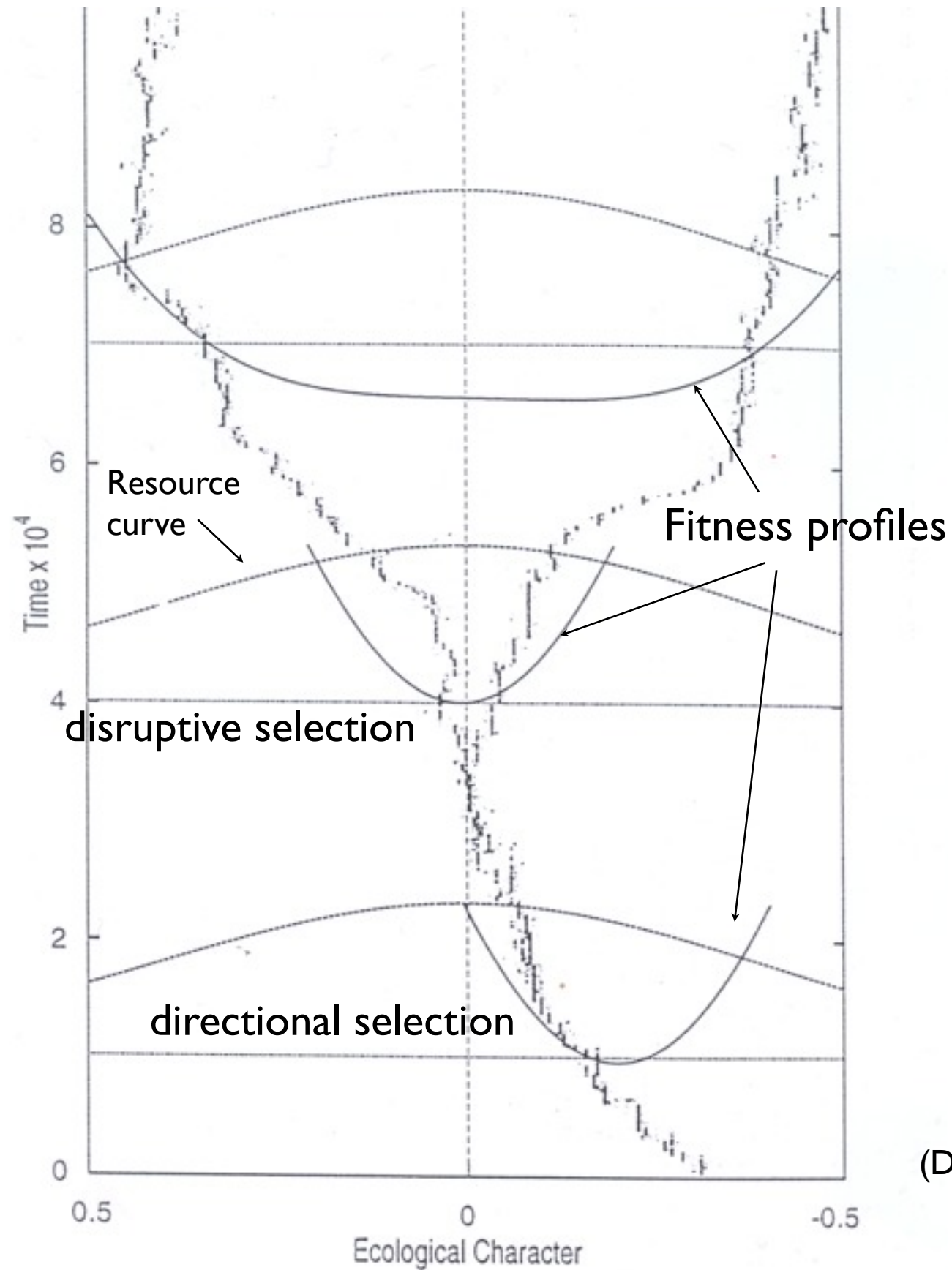
# Dependence on ecological parameters



$\sigma_K < \sigma_\alpha$  : the population remains at the maximum of the resource abundance curve



$\sigma_K > \sigma_\alpha$  : **Evolutionary branching**



(Dieckmann & Doebeli, *Nature*, 1999)

# Adaptive Dynamics (Hans Metz)





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Logistic dynamics of monomorphic resident  $x$ :

$$\frac{dN(x)}{dt} = N(x) \left( 1 - \frac{N(x)}{K(x)} \right)$$

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Per capita growth rate of rare mutant  $y$  in monomorphic resident  $x$

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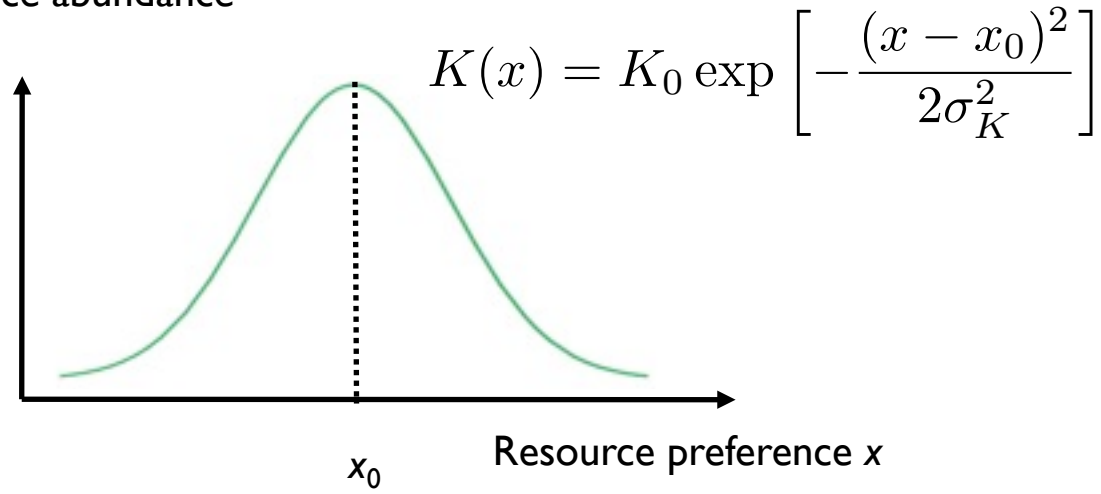
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## Evolutionary stability:

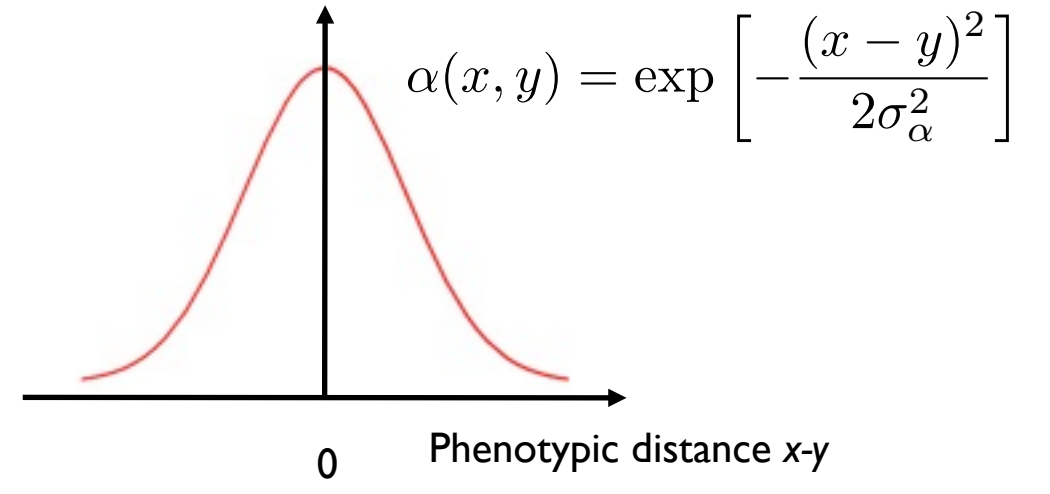
$$\left. \frac{\partial^2 f}{\partial y^2}(x^*, y) \right|_{y=x^*}$$

# Gaussian case:

Resource abundance



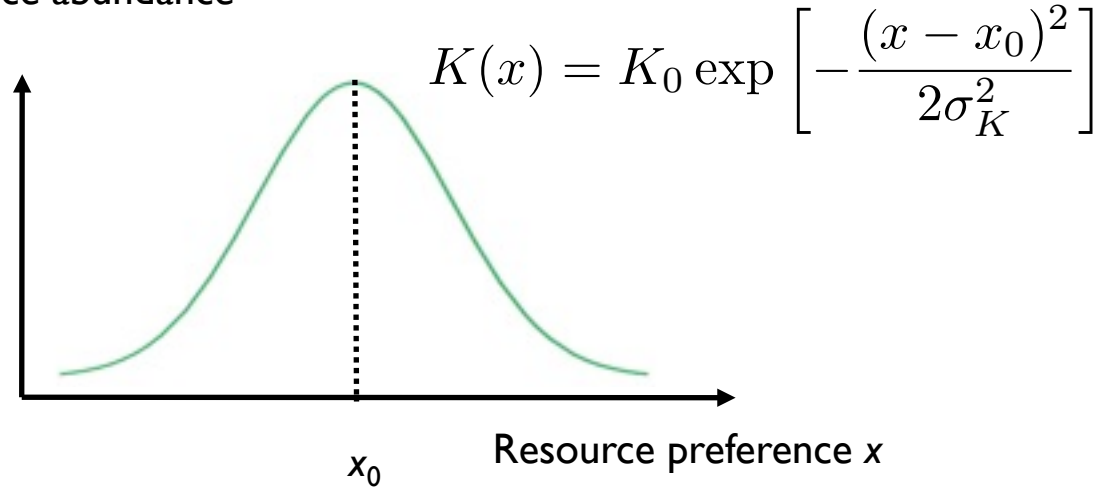
Strength of competition



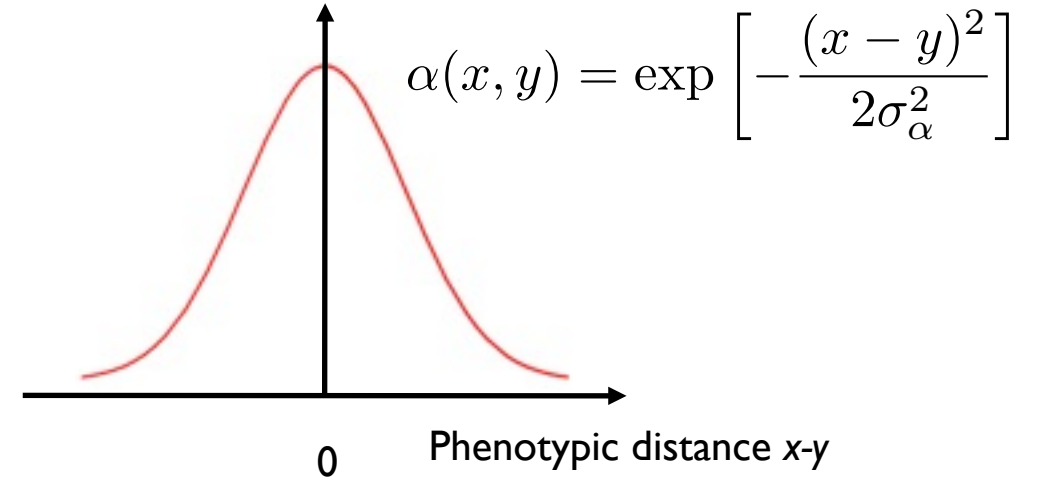


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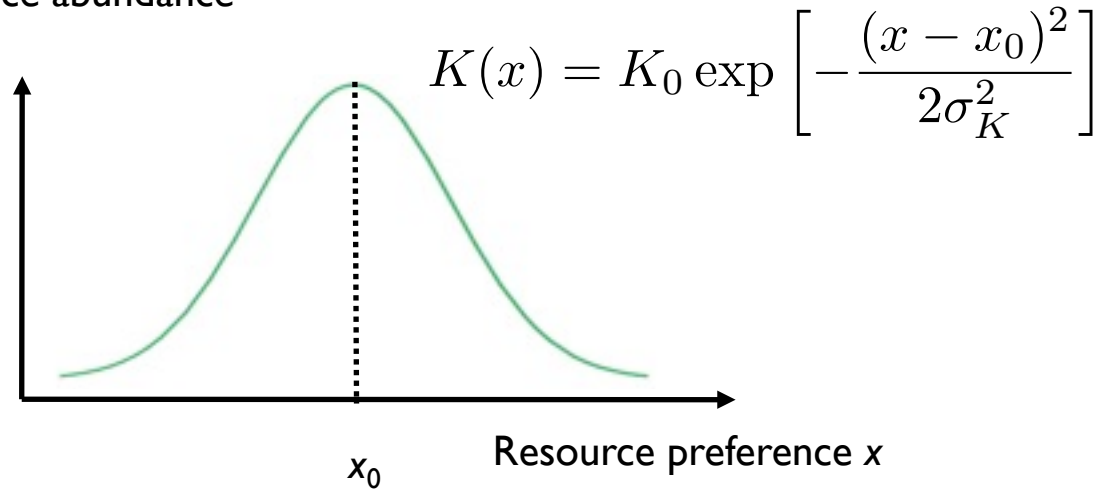


Evolutionary stability:

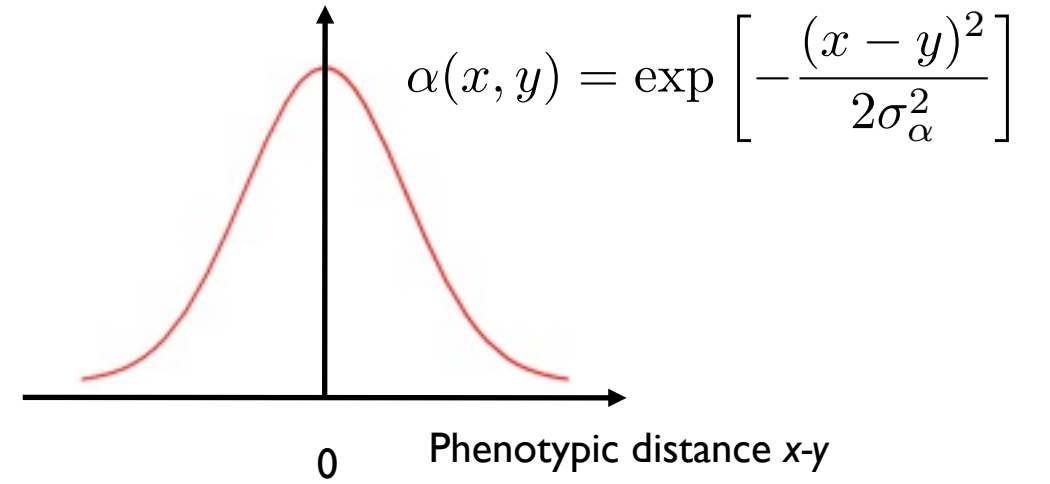
$$\begin{aligned}
 \left. \frac{\partial^2 f}{\partial y^2} (x^*, y) \right|_{y=x^*} &= - \left. \frac{\partial^2 \alpha(x^*, y)}{\partial y^2} \right|_{y=x^*} + \frac{K''(x^*)}{K(x)} \\
 &= \frac{1}{\sigma_\alpha^2} - \frac{1}{\sigma_K^2}
 \end{aligned}$$

# Gaussian case:

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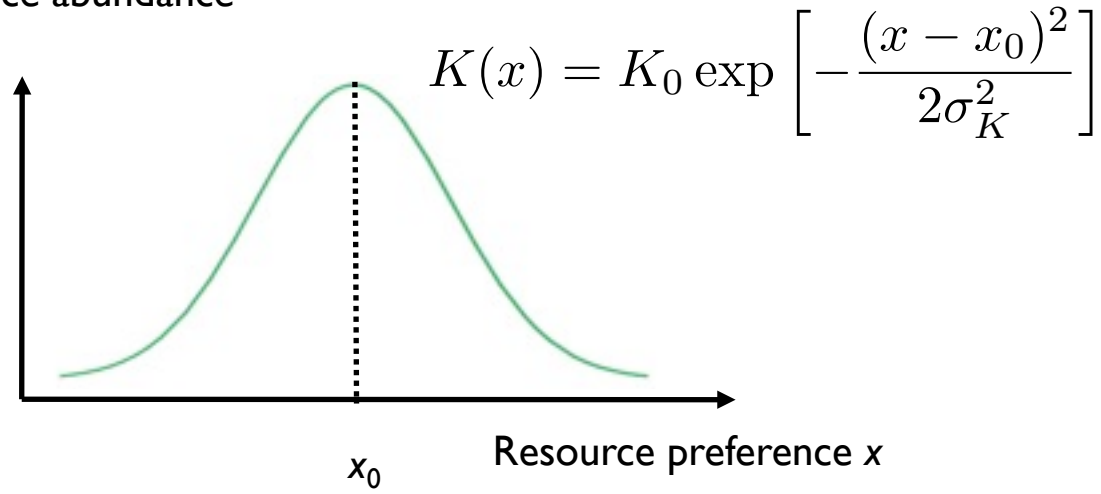
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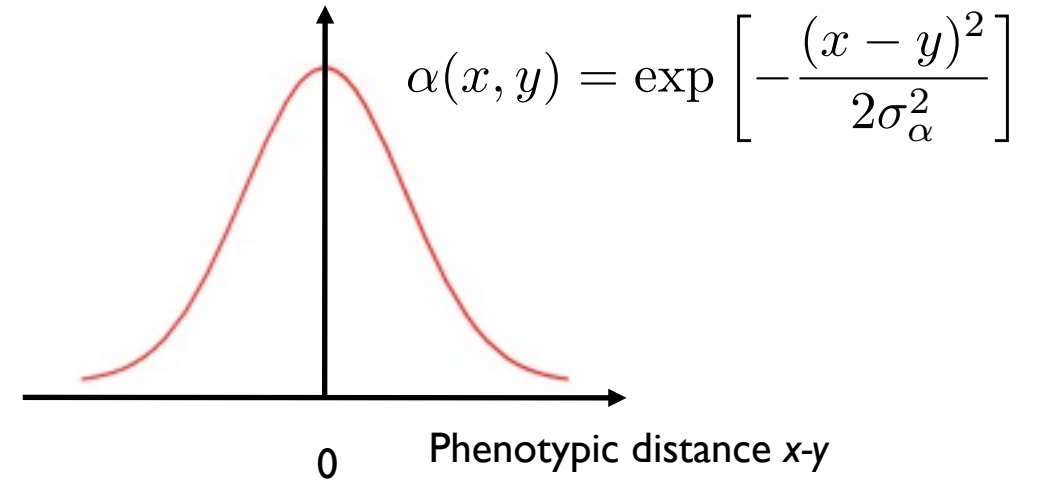
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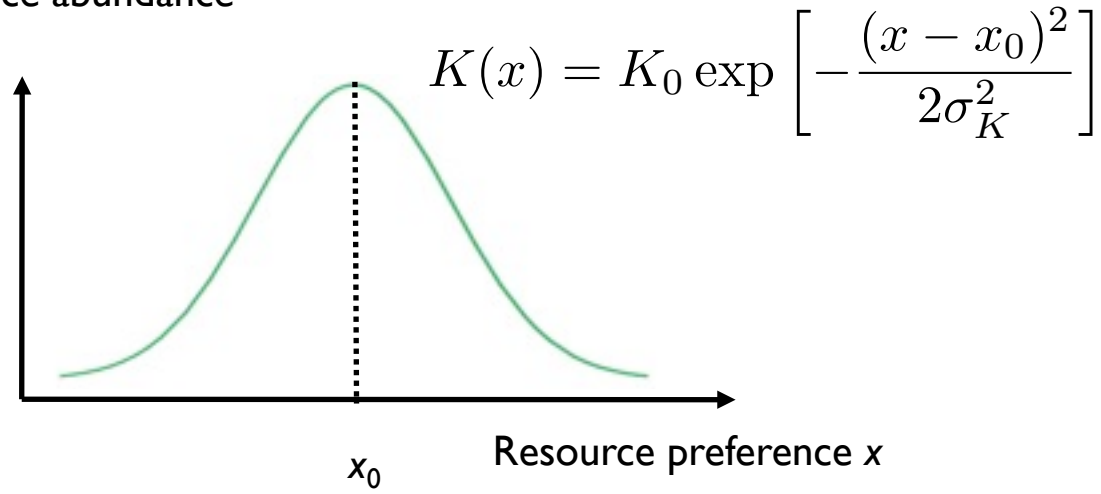


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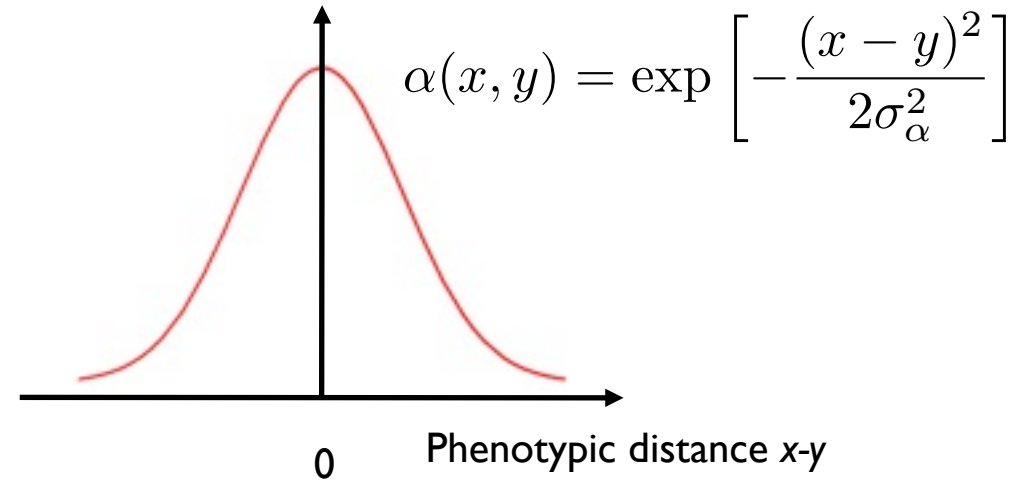
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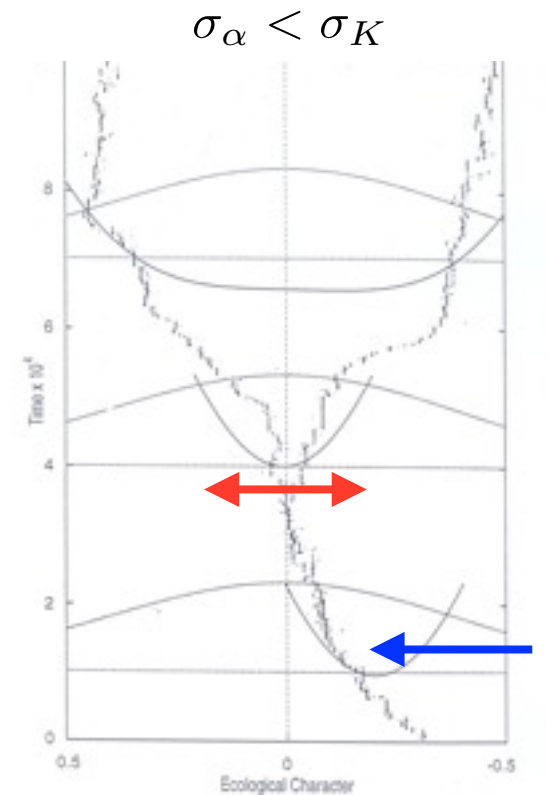
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$$= \frac{1}{\sigma_\alpha^2} - \frac{1}{\sigma_K^2}$$

$$\underline{> 0} \iff \sigma_\alpha < \sigma_K$$

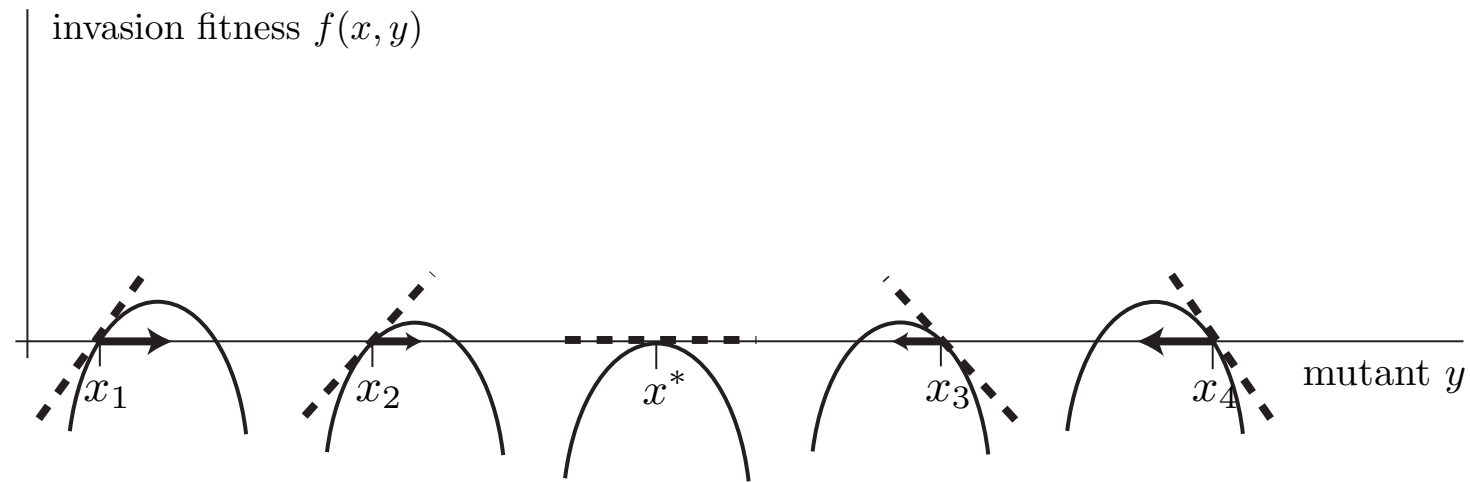
**Evolutionary branching occurs if an attractor of adaptive dynamics represents a fitness minimum**





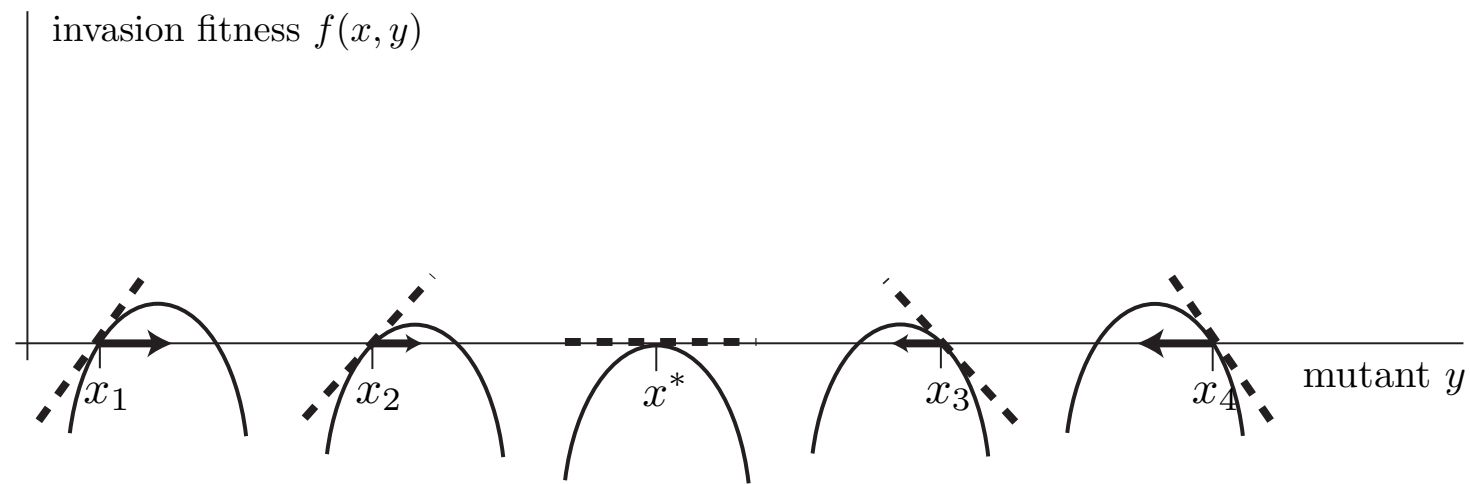
# Two generic evolutionary scenarios

Convergence stable and evolutionarily stable strategy

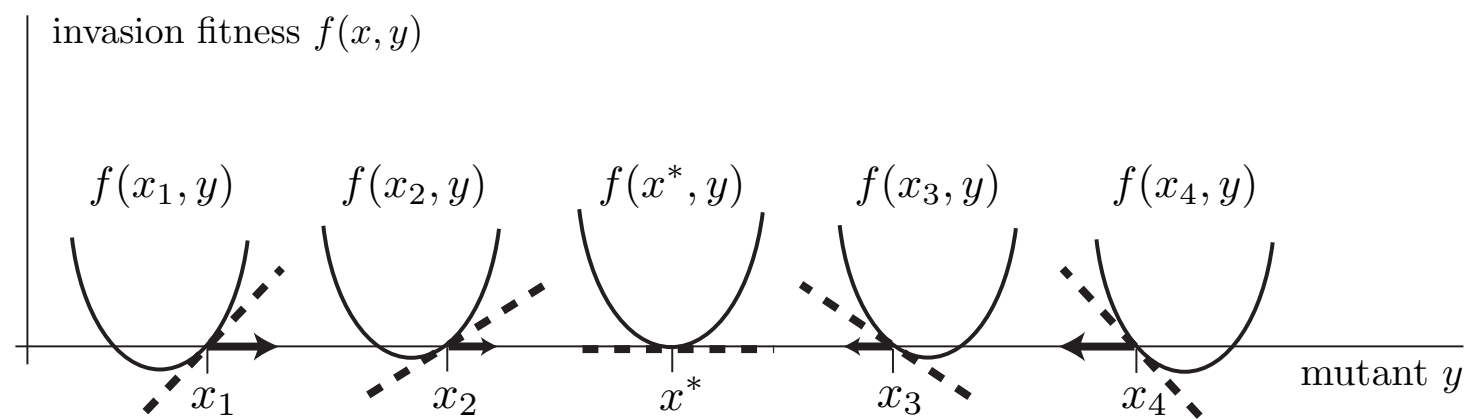


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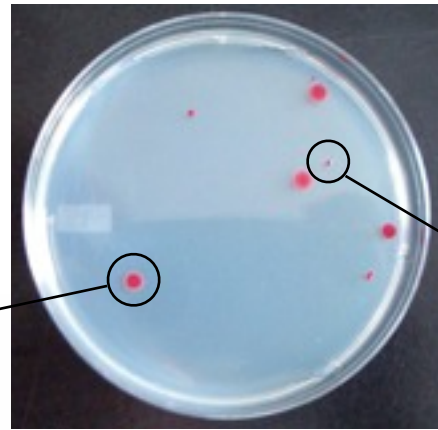
## Convergence stable and evolutionarily stable strategy



## Evolutionary branching point

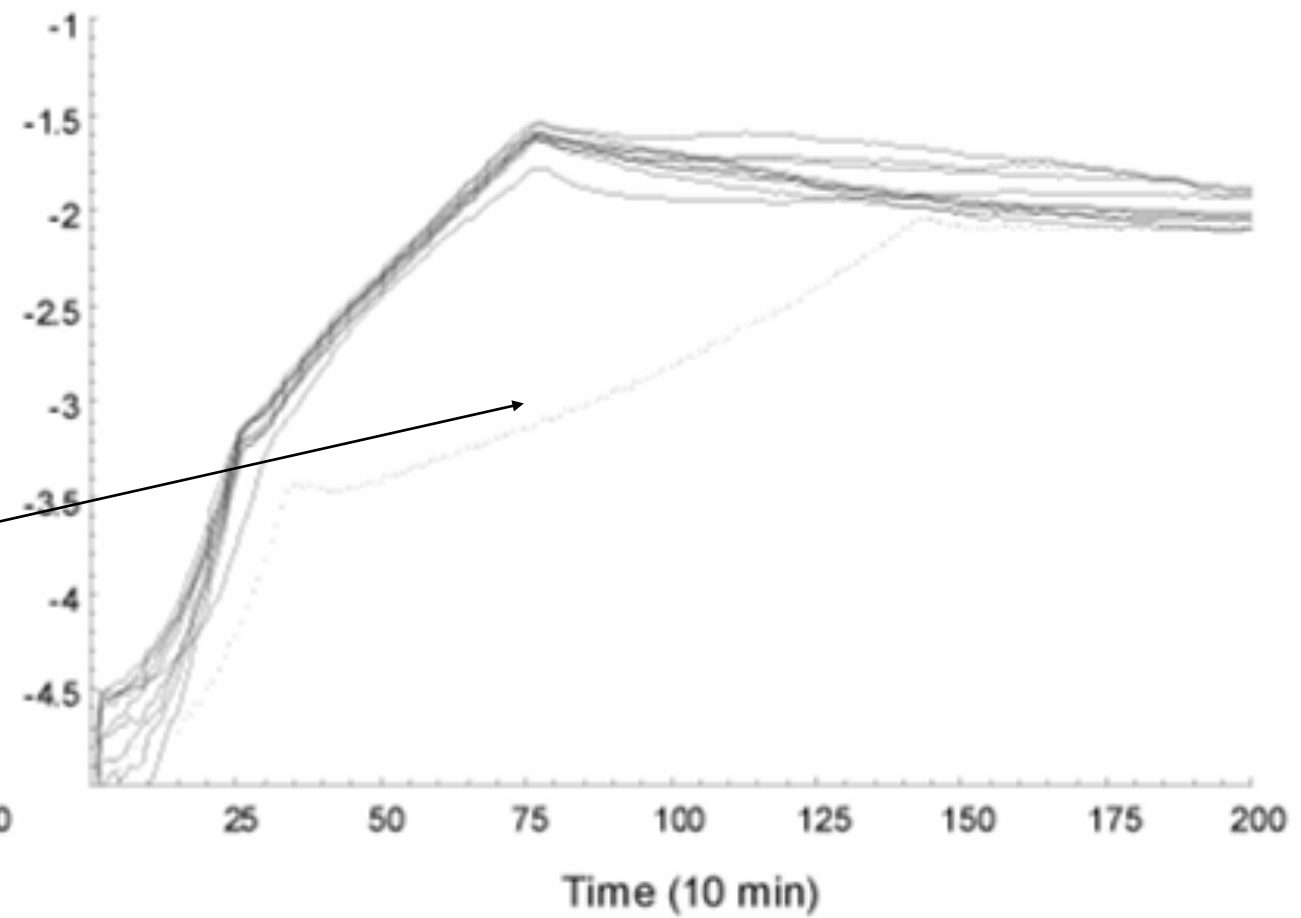
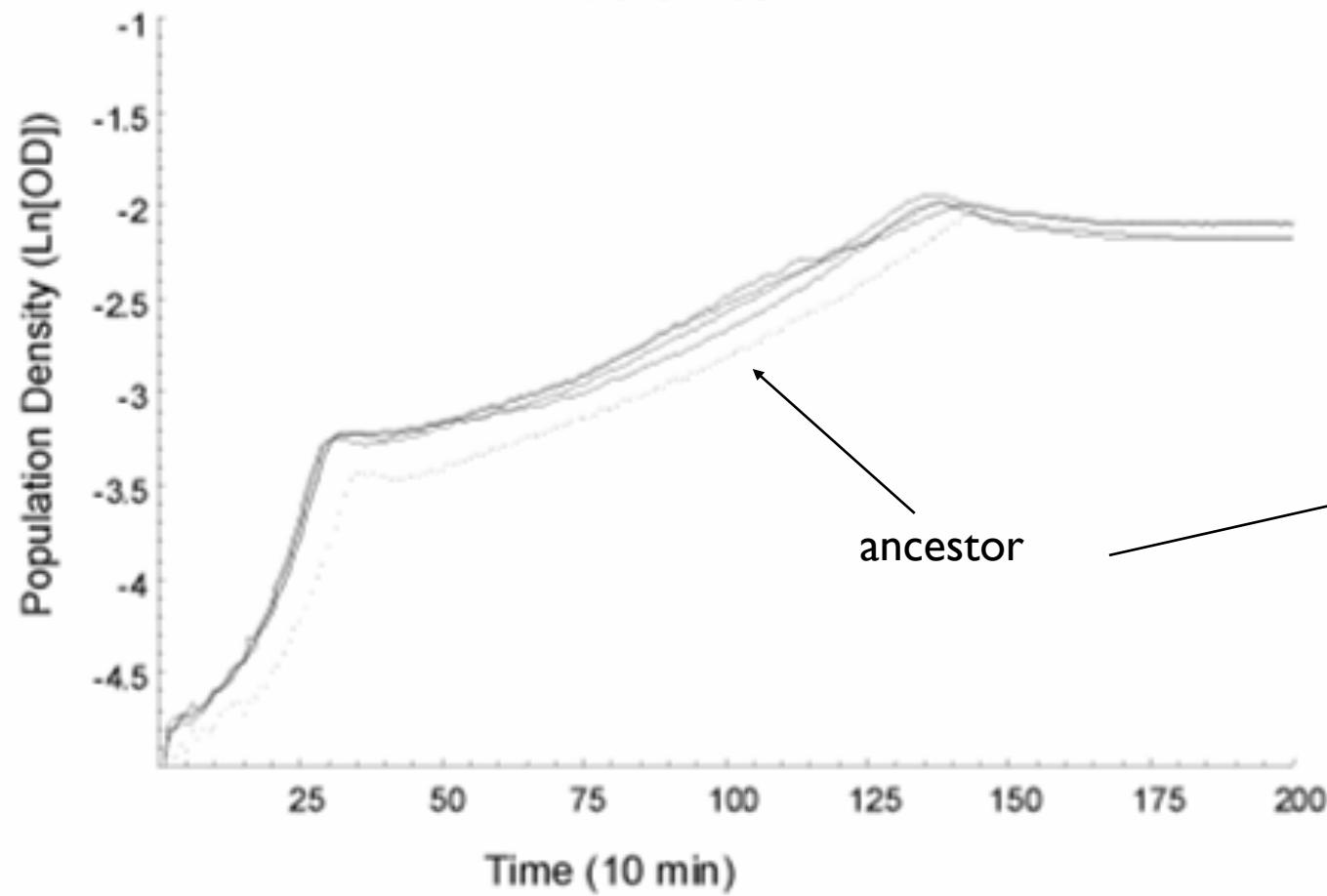


# Diversification in bacterial populations:



**L colonies**

**S colonies**



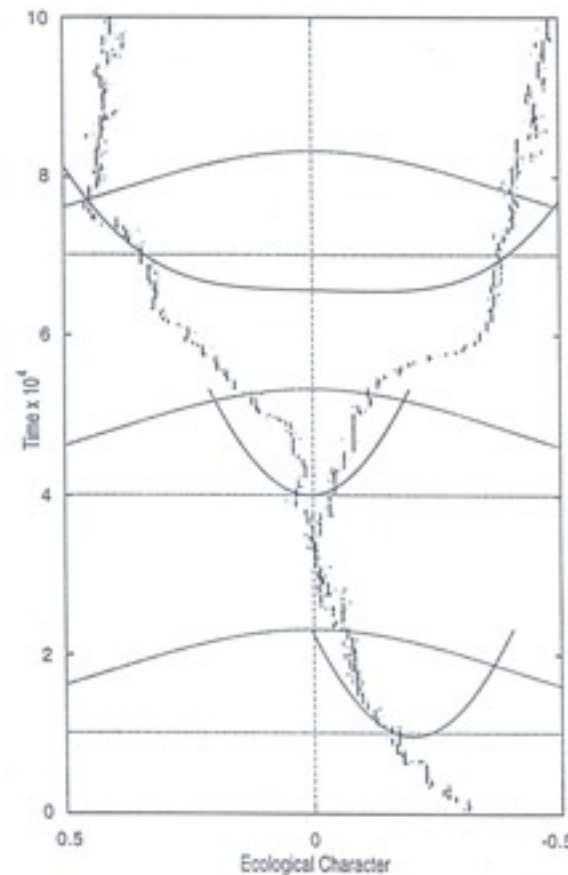
# Gene expression analysis reveals two types of changes:

1. Genes that are differentially expressed between Large and Small
  - growth in anaerobic conditions (low glucose concentration)
2. Genes that are differentially expressed between ancestor and both evolved strains
  - growth in aerobic conditions (high glucose concentration)
  - transport efficiency during stationary phase

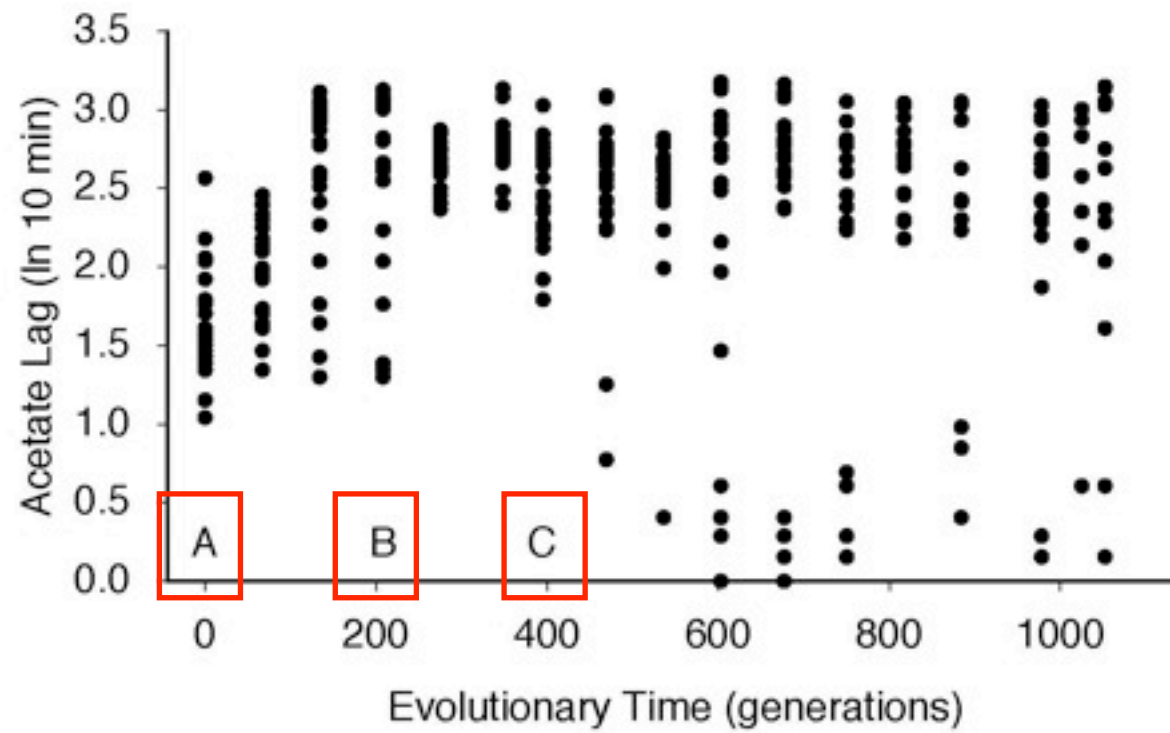


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## Evolutionary branching in switching lag:



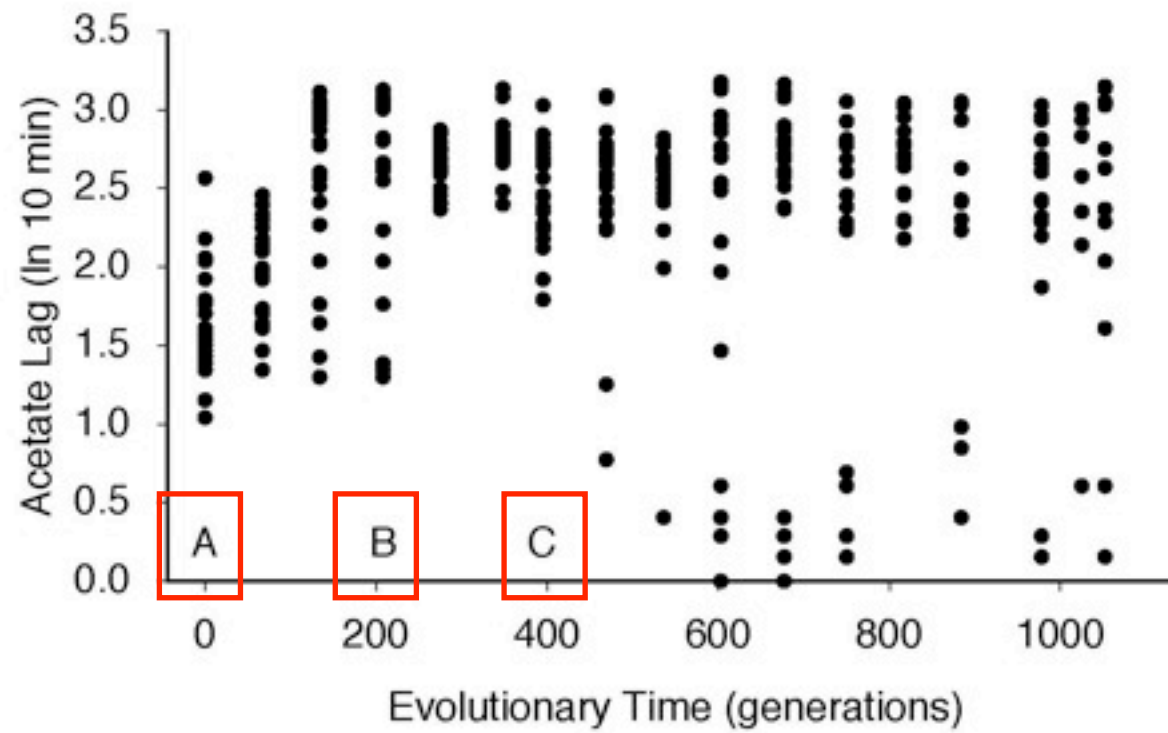
A: ancestral strain

B: midpoint

C: Most recent common ancestor (MRCA)

Evolutionary branching in switching lag:

Rediversification from different time points  
A, B, C in the “fossil record”:

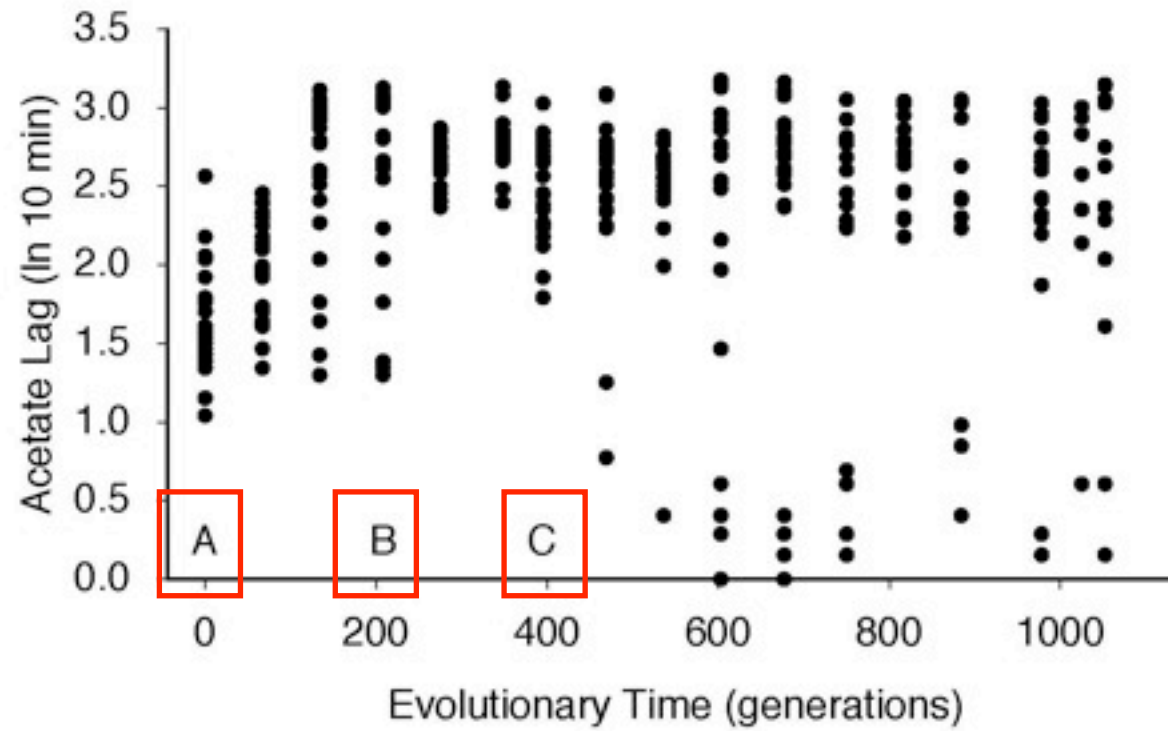


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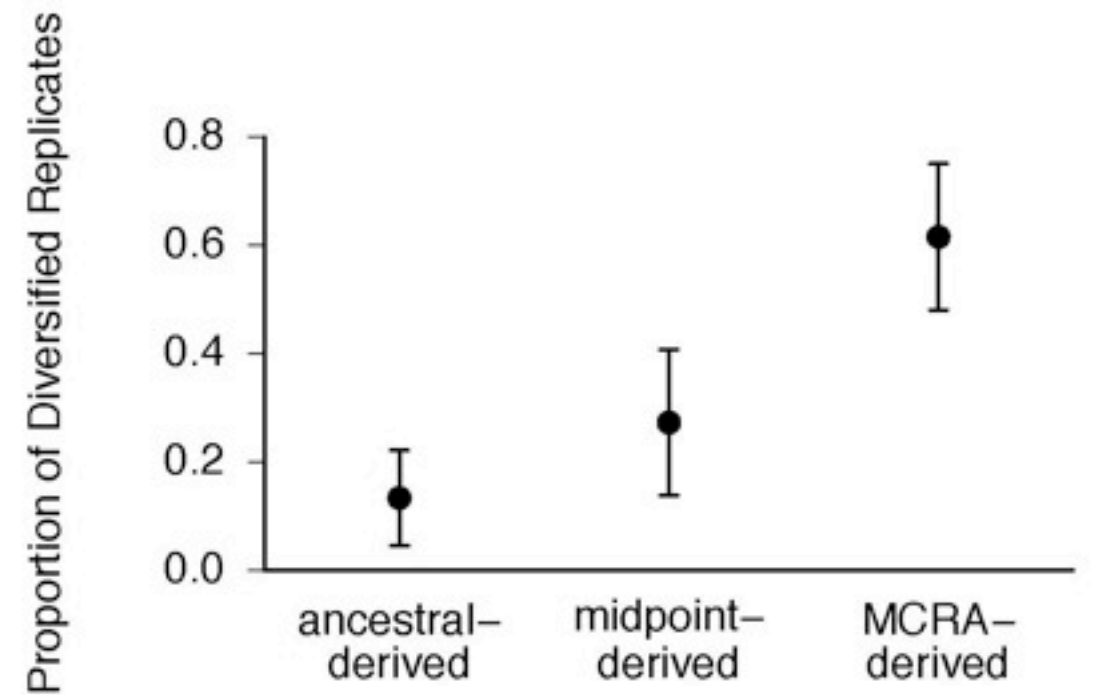


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C: Most recent common ancestor (MRCA)

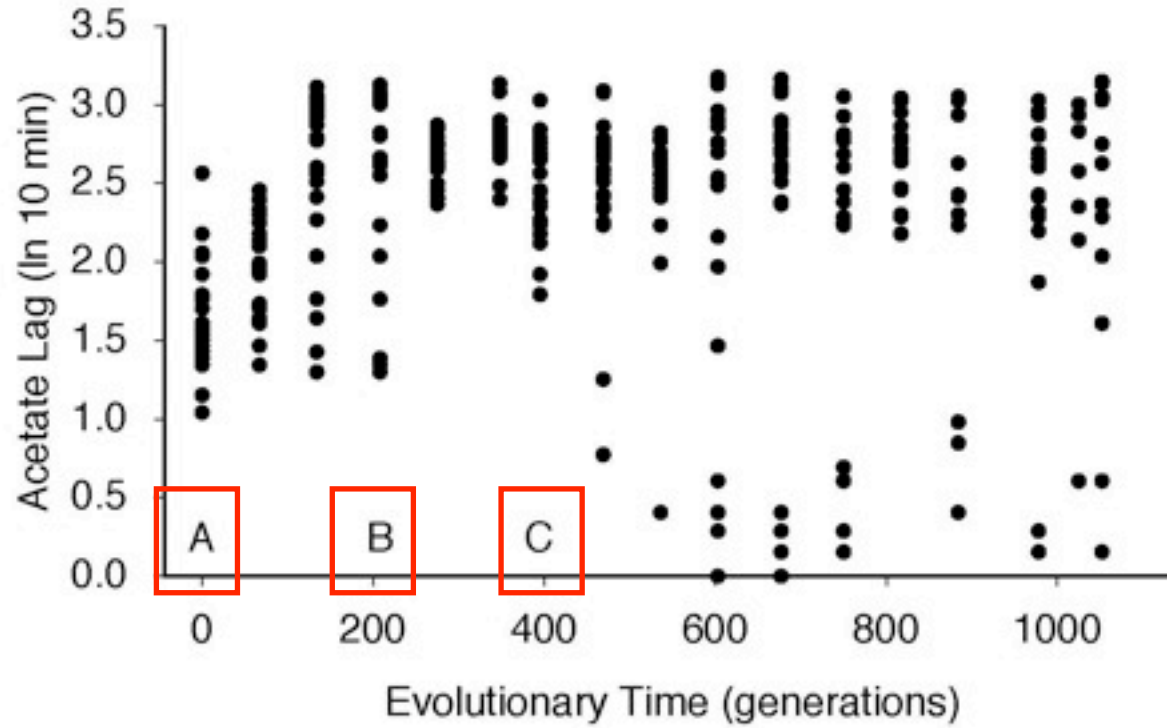
### Rediversification from different time points A, B, C in the “fossil record”:



Likelihood of diversification increases over time



Evolutionary branching in switching lag:

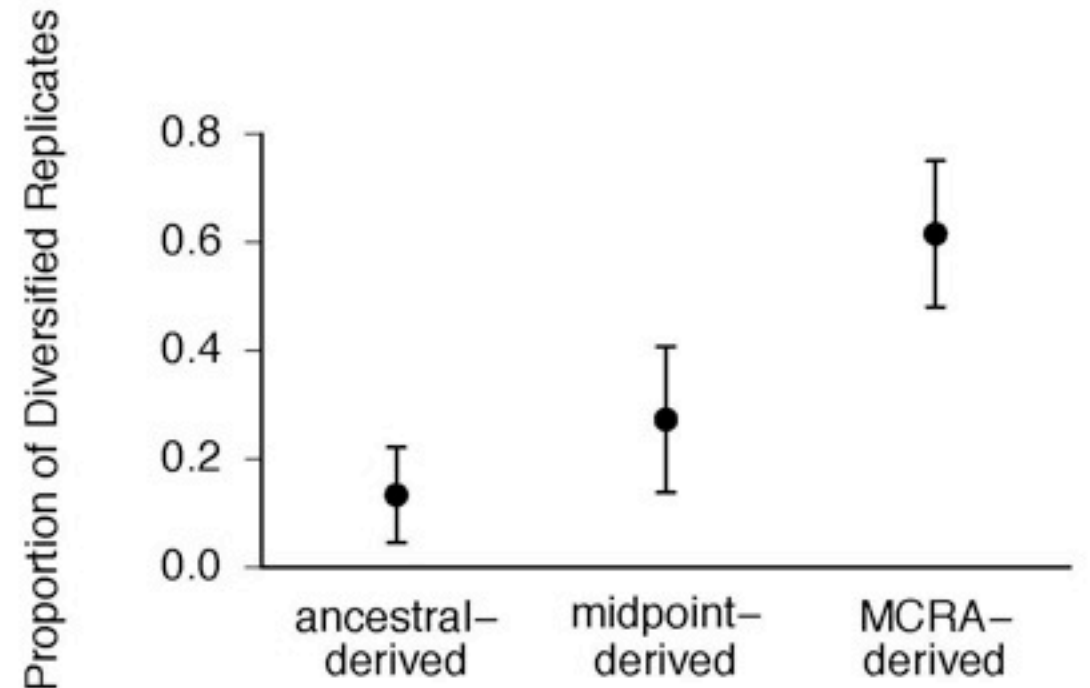


A: ancestral strain

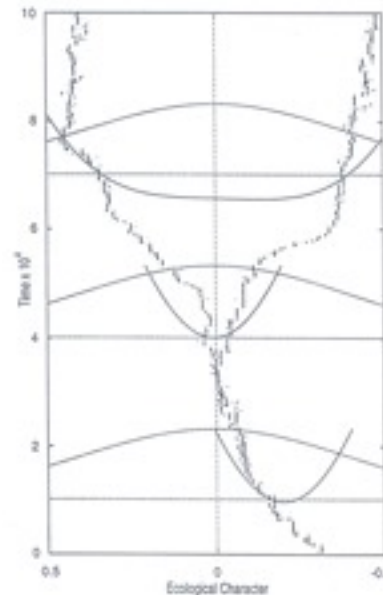
B: midpoint

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Rediversification from different time points A, B, C in the “fossil record”:



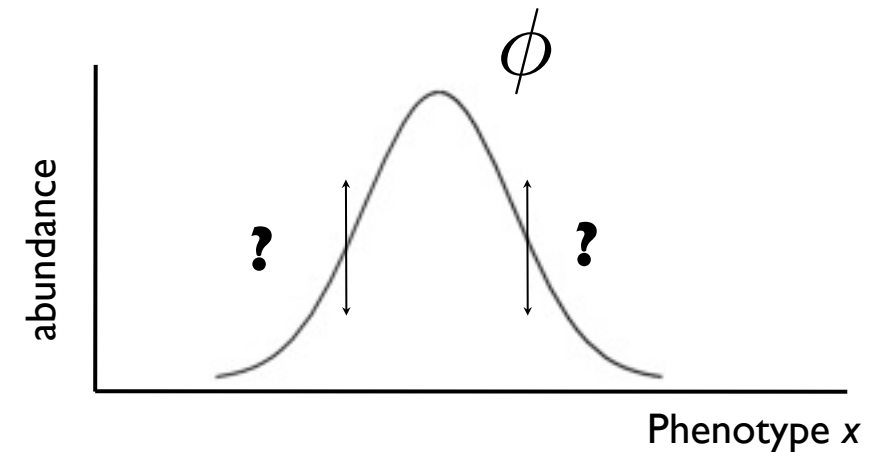
Likelihood of diversification increases over time



Adaptive dynamics assumption: mutations are rare and occur one at a time

PDE models: dynamics of continuous phenotype distributions  
(all types present at all a times)

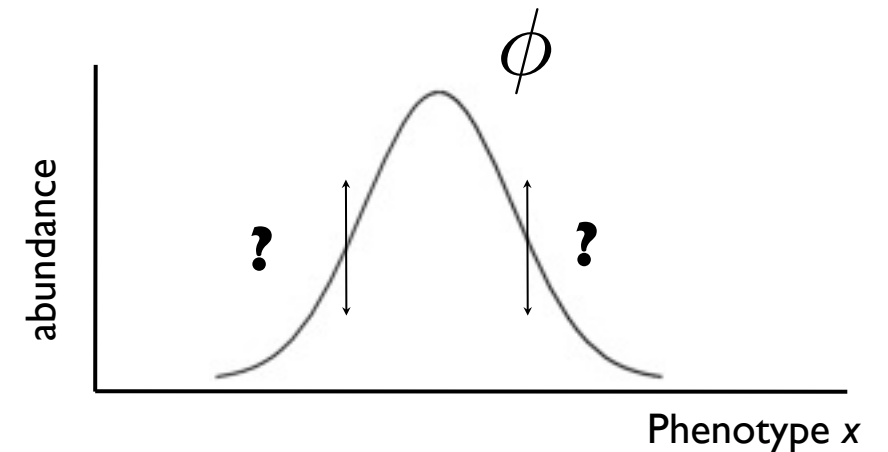
$\phi(x, t)$  : Phenotype distribution at time  $t$



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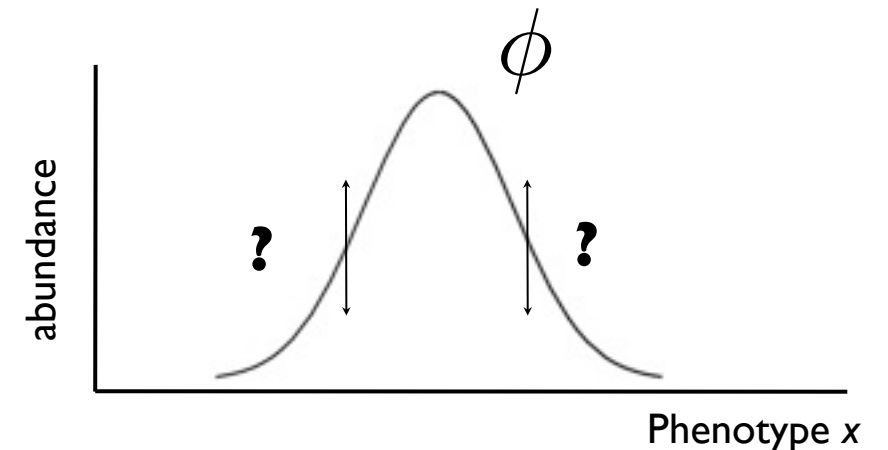
$$\frac{\partial \phi}{\partial t} = b\phi(x) \left( 1 - \frac{(\alpha * \phi)(x)}{K(x)} \right) \quad \text{where:} \quad (\alpha * \phi)(x) = \int \alpha(x, y)\phi(y)dy$$

effective density at  $x$

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effective density at  $x$

Equilibrium distribution  $\hat{\phi}$  :  $(\alpha * \hat{\phi})(x) = K(x)$

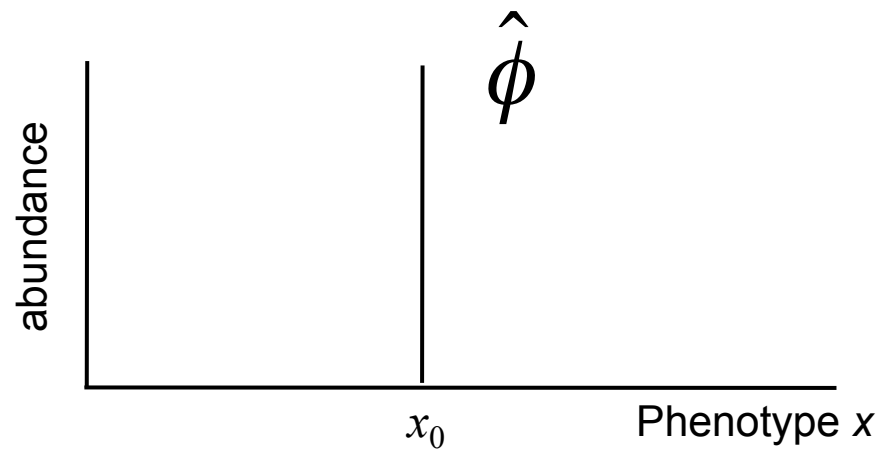


Gaussian case:

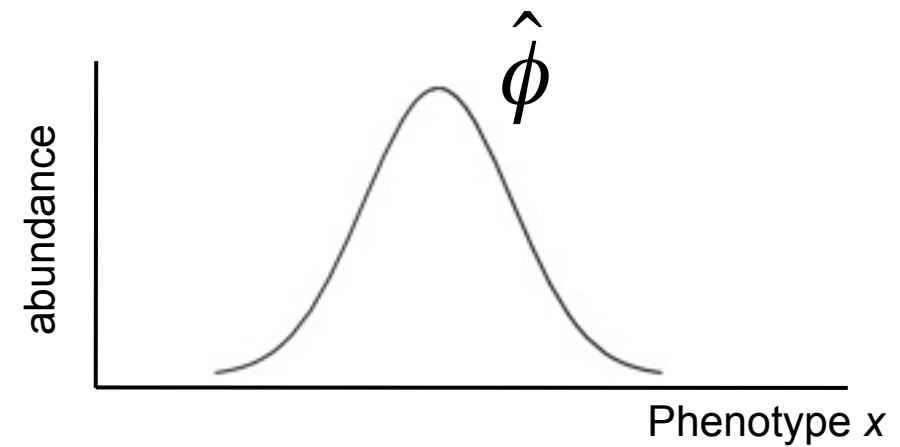
$$\alpha(x, y) = \exp\left[\frac{-(x - y)^2}{2\sigma_\alpha^2}\right] \quad K(x) = \exp\left[\frac{-(x - x_0)^2}{2\sigma_K^2}\right]$$

Gaussian solution  $\hat{\phi}$  with variance  $\sigma_K^2 - \sigma_\alpha^2$

$$\sigma_K^2 < \sigma_\alpha^2$$



$$\sigma_K^2 > \sigma_\alpha^2$$



Phase transition, but no pattern formation...

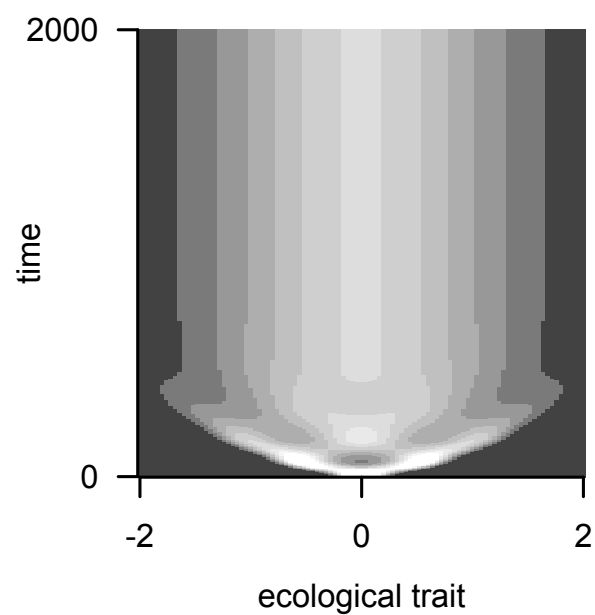
# Gaussian case is structurally unstable

$$\alpha(x, y) = \exp \left[ -\frac{(x - y)^{2+\epsilon}}{2\sigma_\alpha^{2+\epsilon}} \right]$$

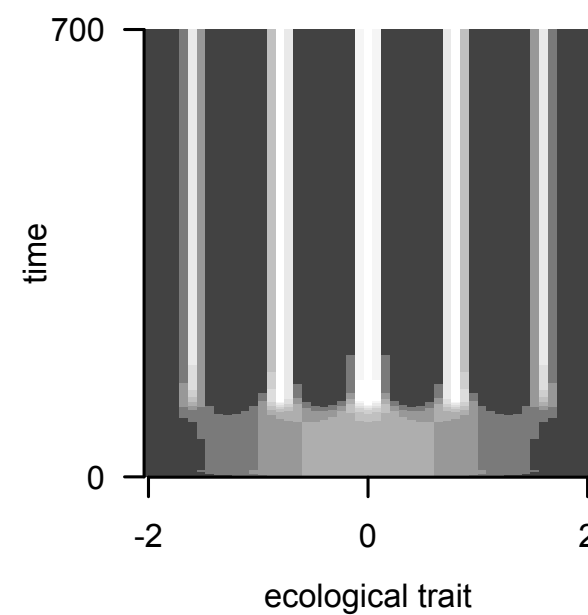
$$K(x) = \exp \left[ -\frac{(x)^{2+\delta}}{2\sigma_K^{2+\delta}} \right]$$

Gaussian case:  $\epsilon = \delta = 0$

Quartic case:  $\epsilon = \delta = 2$



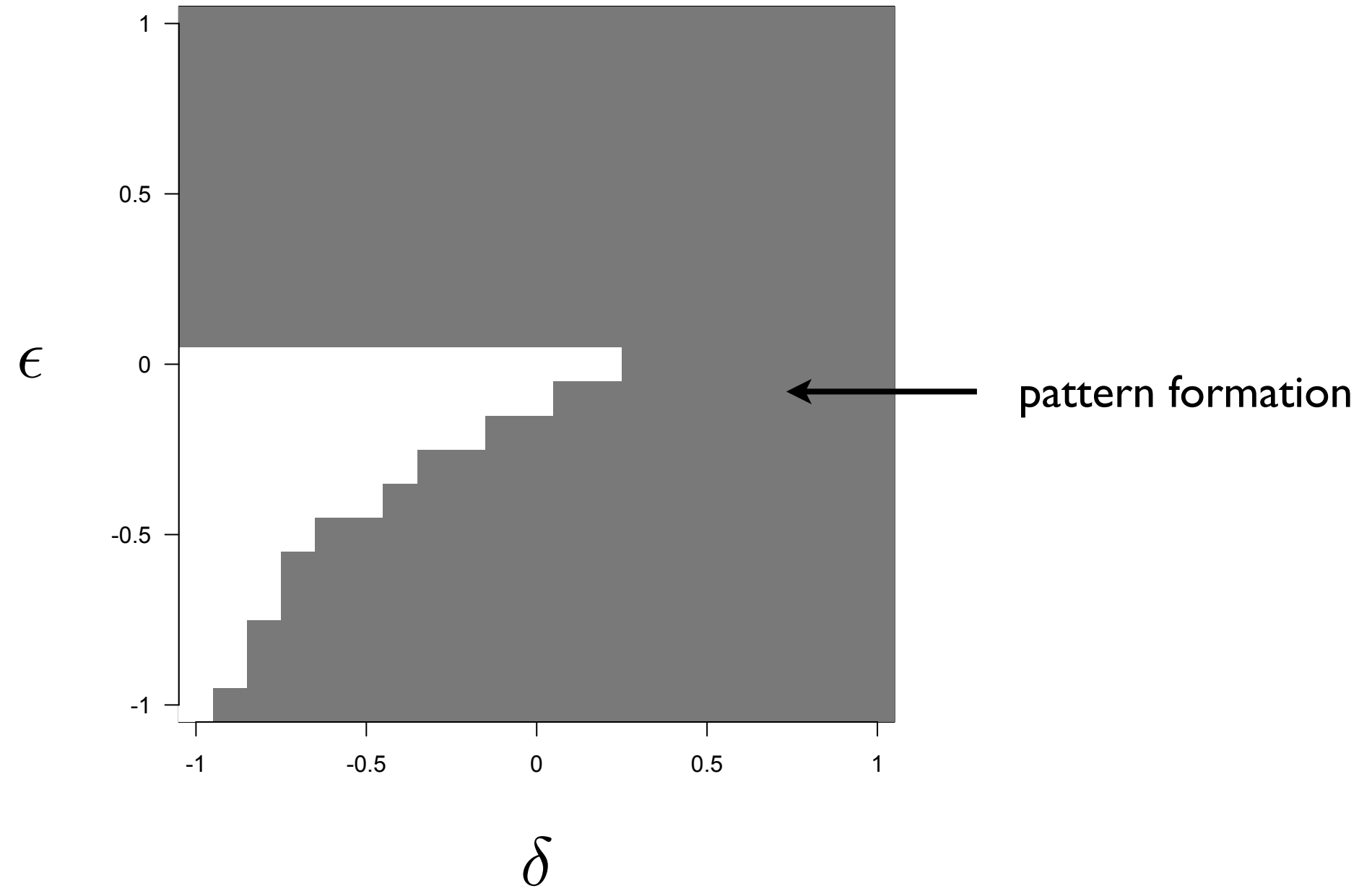
Gaussian equilibrium



Pattern formation

$$\alpha(x, y) = \exp \left[ -\frac{(x - y)^{2+\epsilon}}{2\sigma_\alpha^{2+\epsilon}} \right]$$

$$K(x) = \exp \left[ -\frac{(x)^{2+\delta}}{2\sigma_K^{2+\delta}} \right]$$



# Sexual model

- Asexual model:

$$\frac{\partial \phi}{\partial t} = b\phi(x) \left( 1 - \frac{(\alpha * \phi)(x)}{K(x)} \right) = \underbrace{b\phi(x)}_{\text{asexual birth term}} - \underbrace{b\phi(x) \frac{(\alpha * \phi)(x)}{K(x)}}_{\text{death term}}$$

# Sexual model

- **Asexual model:** 
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- Sexual model: same death term



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- Sexual model: same death term

- Sexual birth term:  $b\beta(x)$

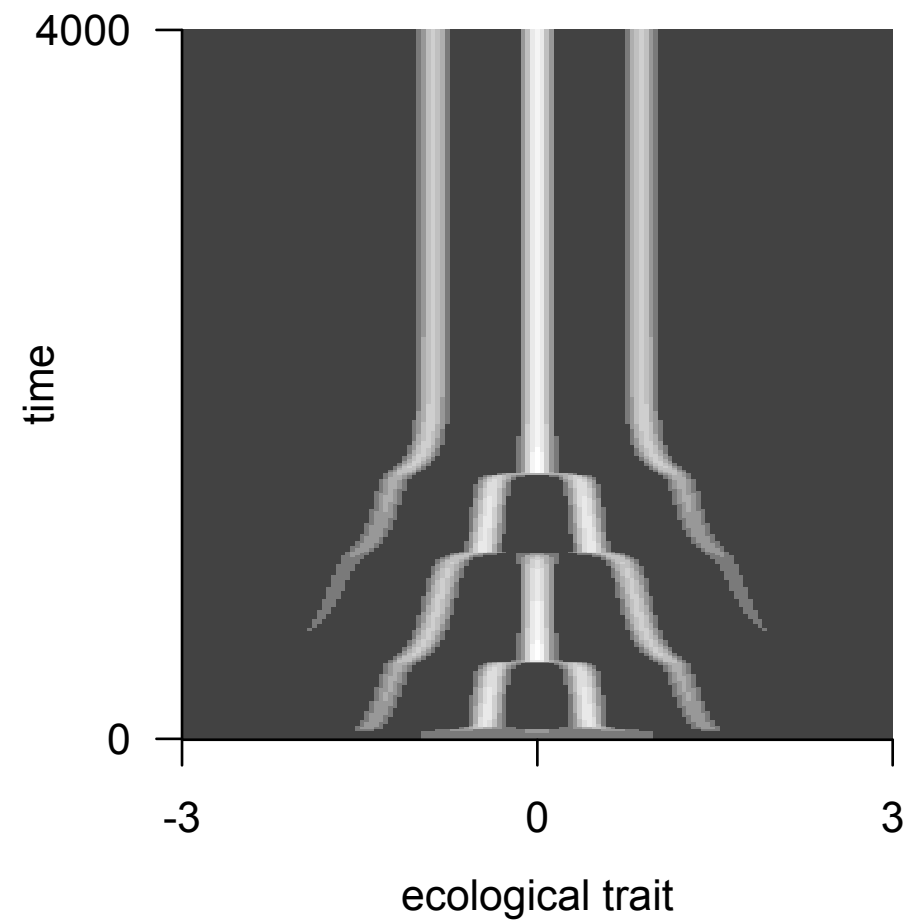
Mating probability between phenotypes  $x$  and  $y$  is proportional to Gaussian function:

$$A(x, y) = \exp\left[\frac{-(x - y)^2}{2\sigma_A^2}\right] \quad \sigma_A : \text{Strength of assortment}$$

Mating between  $x$  and  $y$  produces a Gaussian offspring distribution mean  $(x+y)/2$

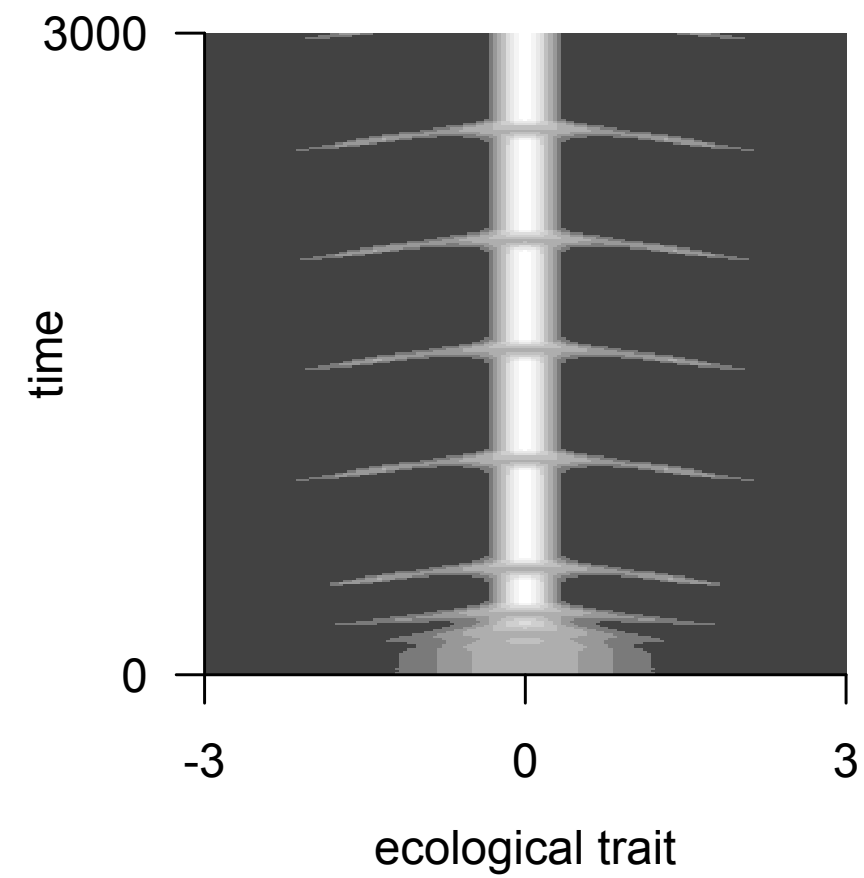
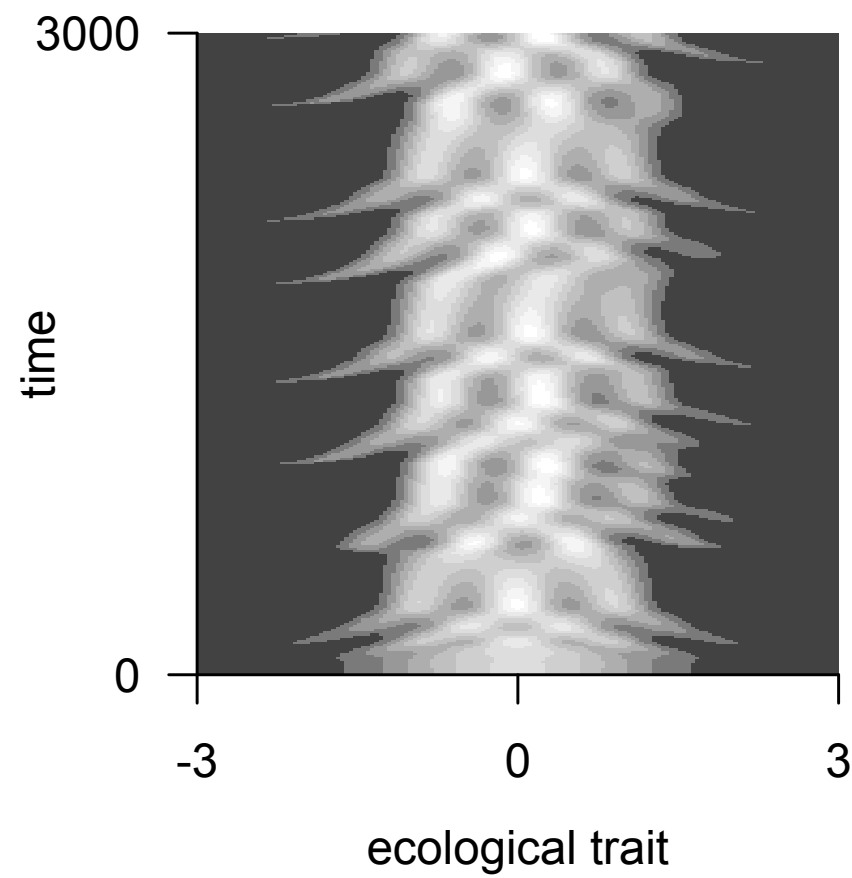
## Sexual model with assortative mating:

Pattern formation even with Gaussian competition kernel and carrying capacity  
(Gaussian equilibrium unstable!)



## Sexual model with assortative mating:

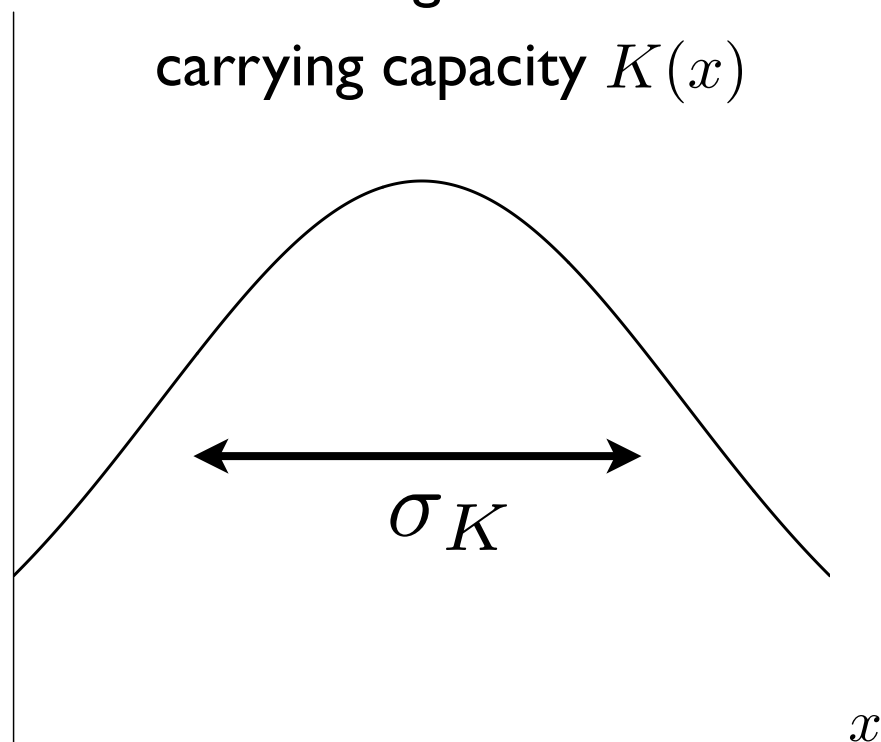
Non-equilibrium dynamics (Gaussian kernels)



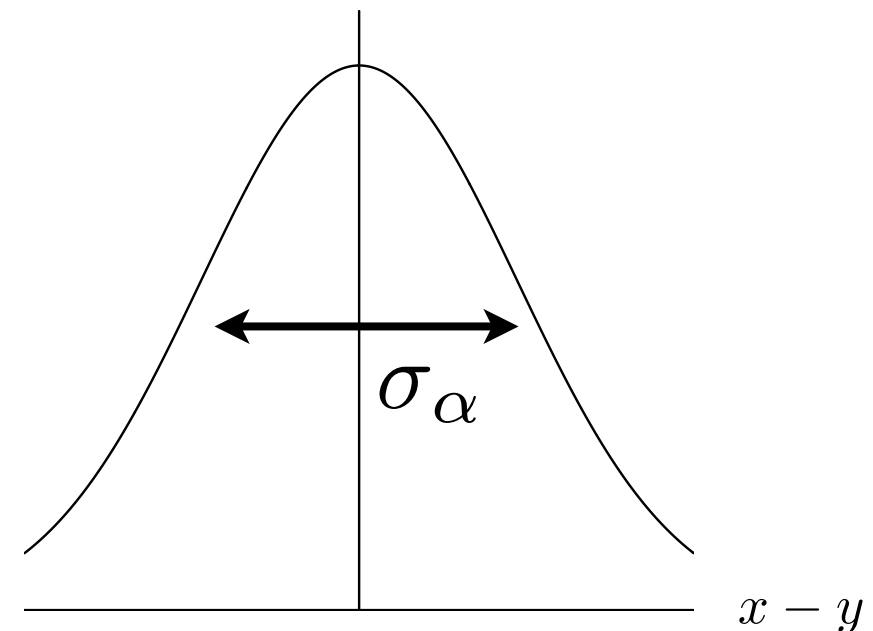
# Phenotypic complexity: diversity in high-dimensional phenotype spaces

1-dimensional: 
$$\frac{\partial \phi}{\partial t} = b\phi(x) \left( 1 - \frac{(\alpha * \phi)(x)}{K(x)} \right)$$

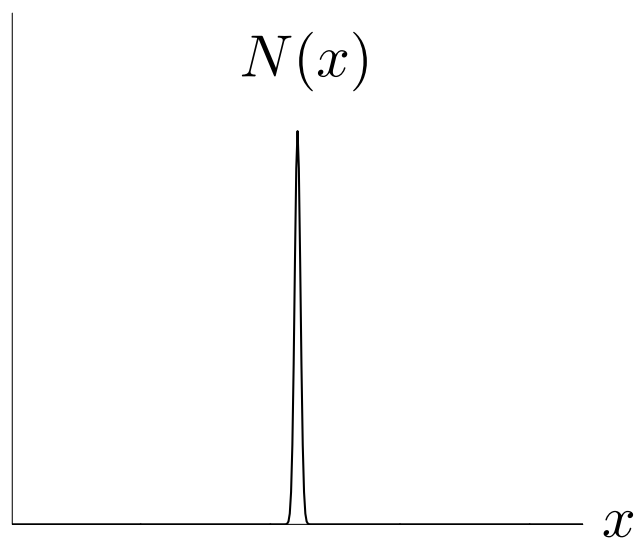
stabilizing selection:  
carrying capacity  $K(x)$



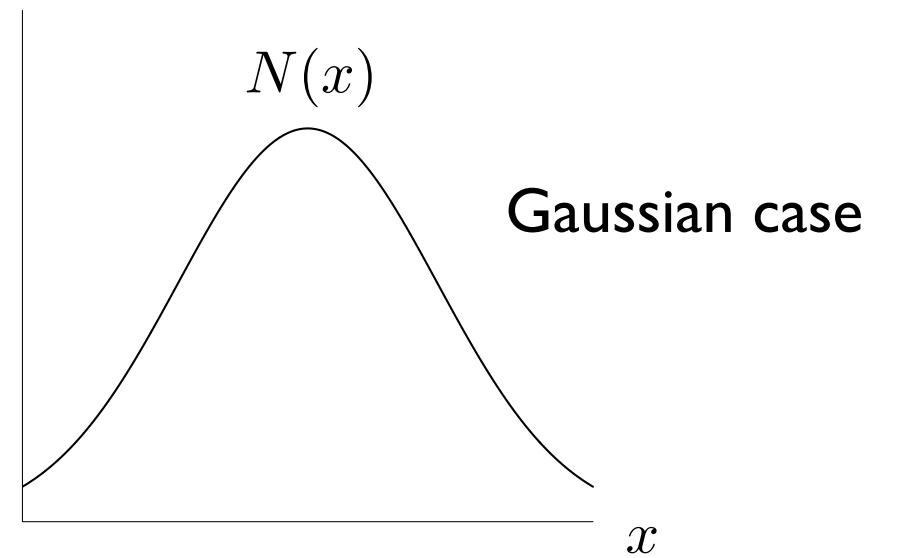
frequency dependence:  
competition kernel  $\alpha(x, y)$



maintenance of variation in the phenotype distribution  $N(x)$  if

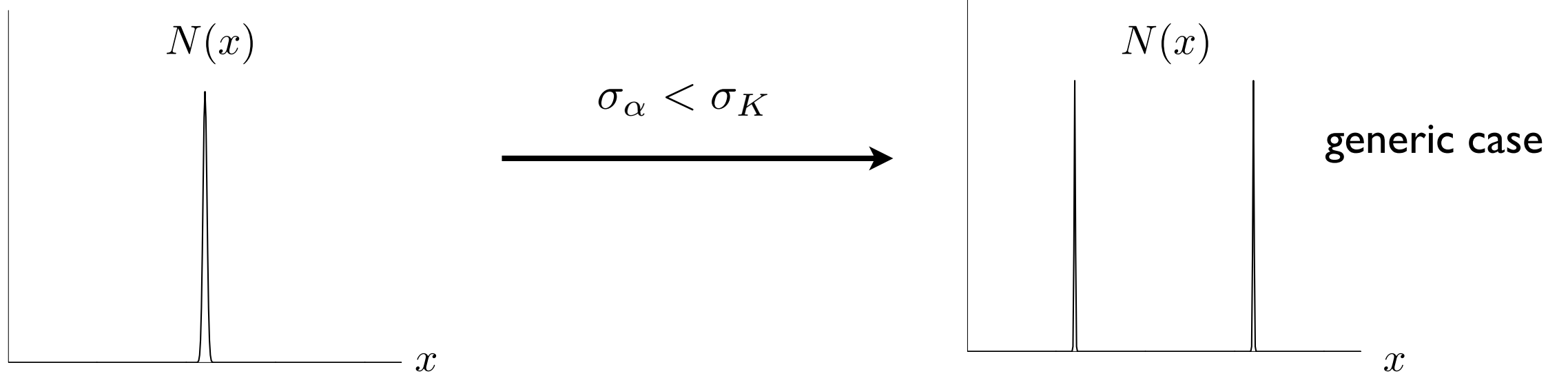


$$\sigma_{\alpha} < \sigma_K$$



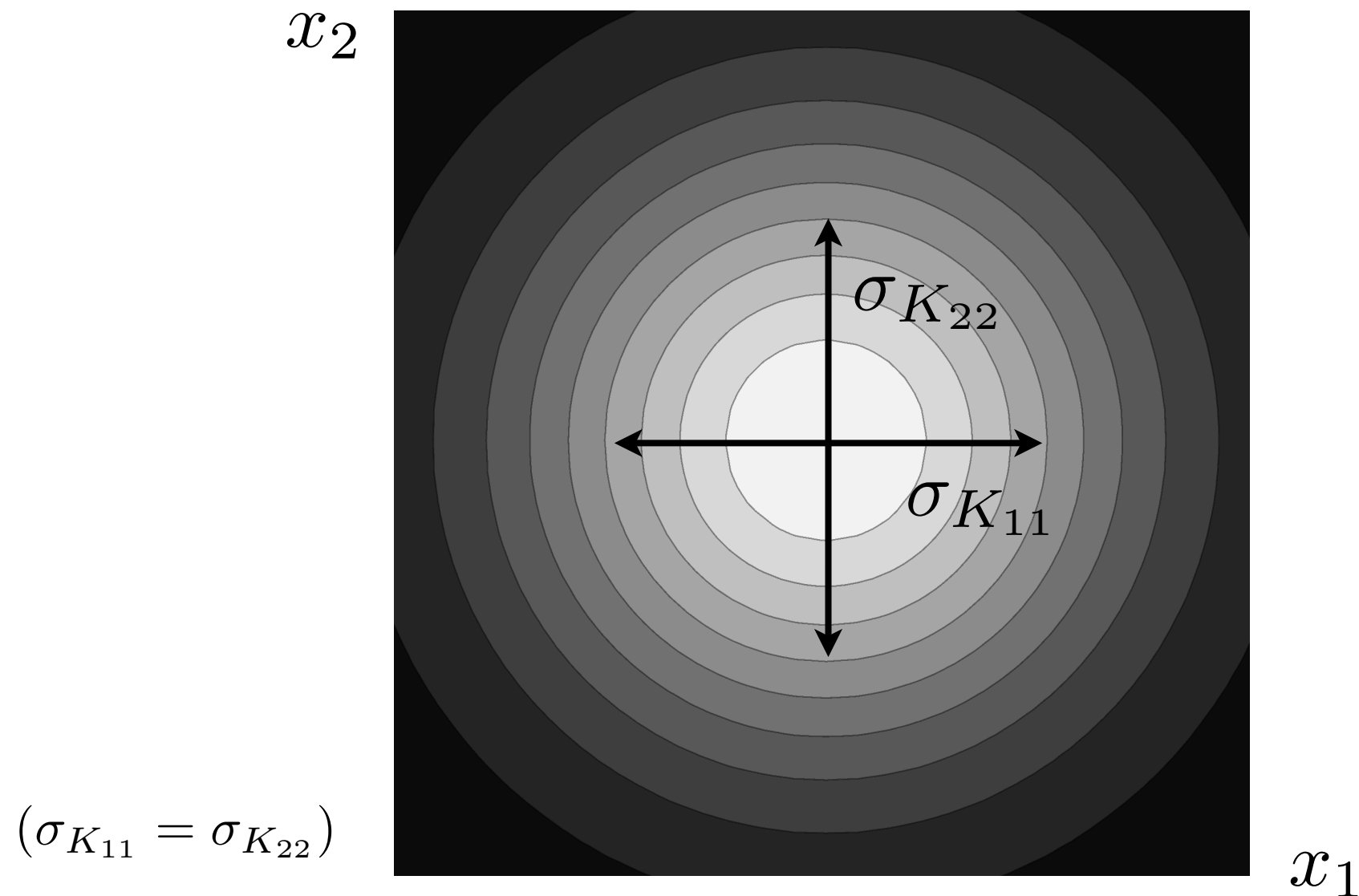


maintenance of variation in the phenotype distribution  $N(x)$  if



## two phenotypic dimensions ( $x_1, x_2$ )

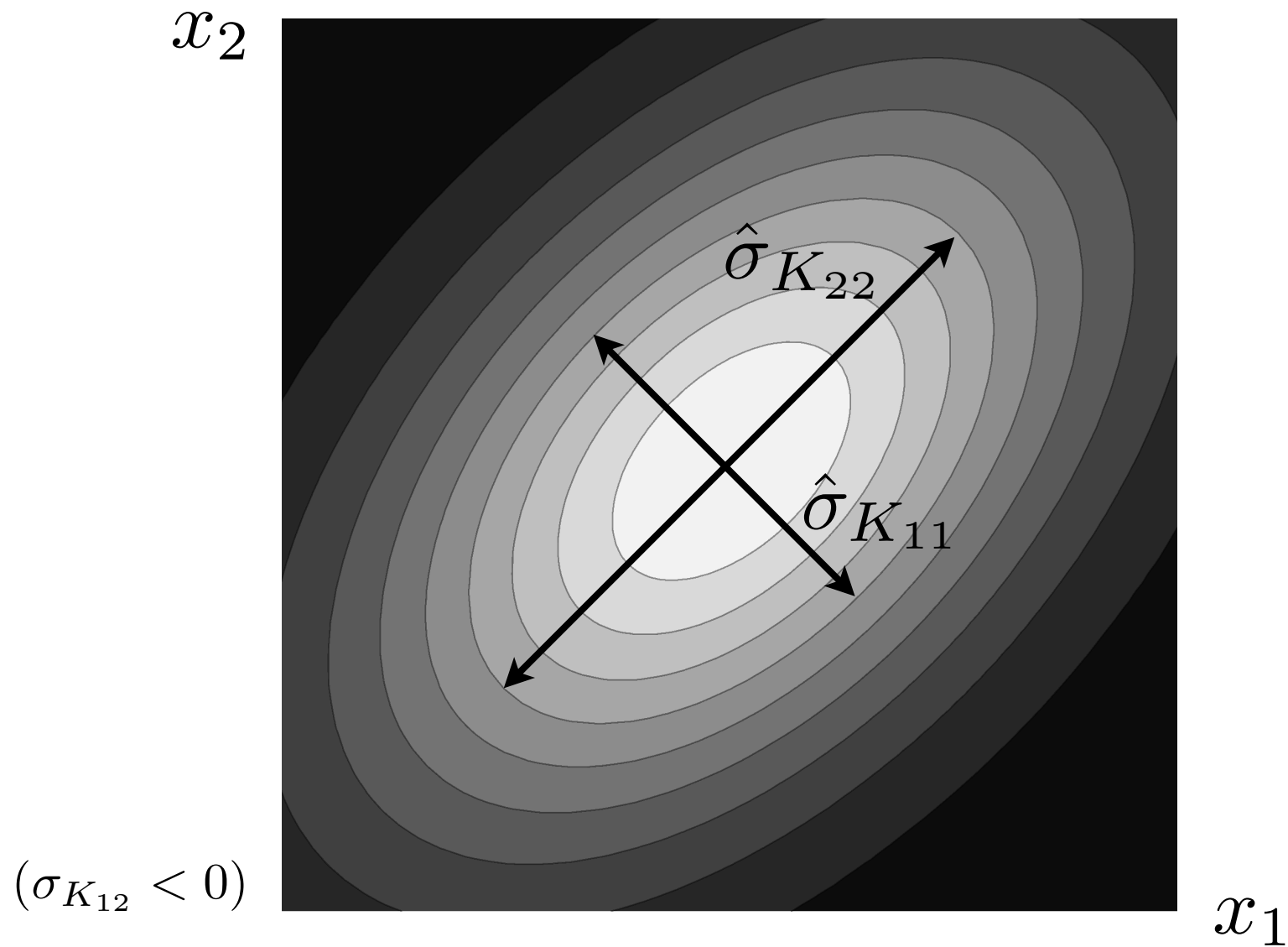
carrying capacity  $K(x_1, x_2) = \exp\left[-\frac{x_1^2}{2\sigma_{K_{11}}^2}\right] \cdot \exp\left[-\frac{x_2^2}{2\sigma_{K_{22}}^2}\right]$



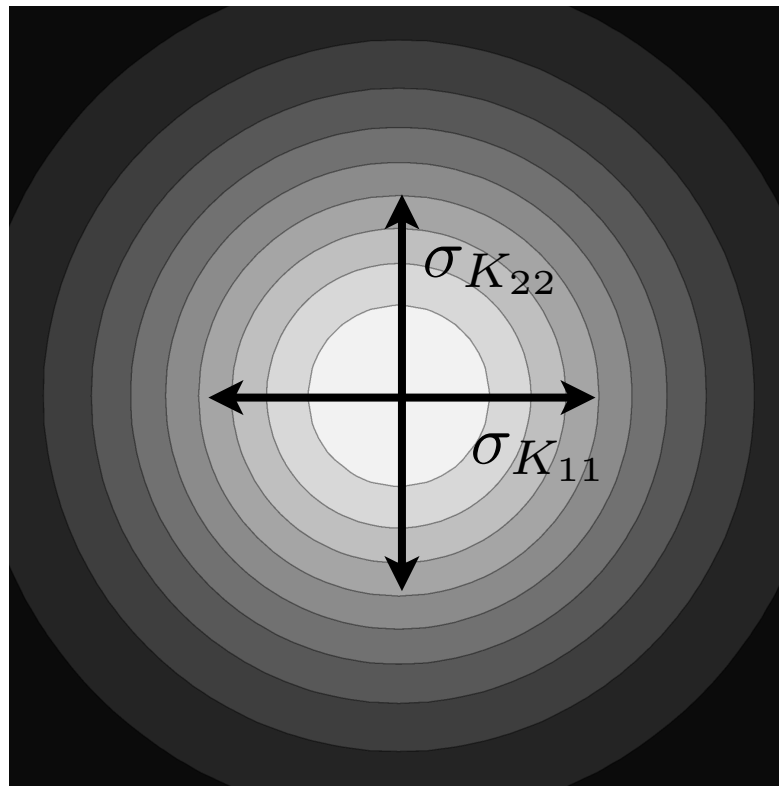
“separable” case: no interactions between phenotypes

“non-separable” case: interactions between phenotypes

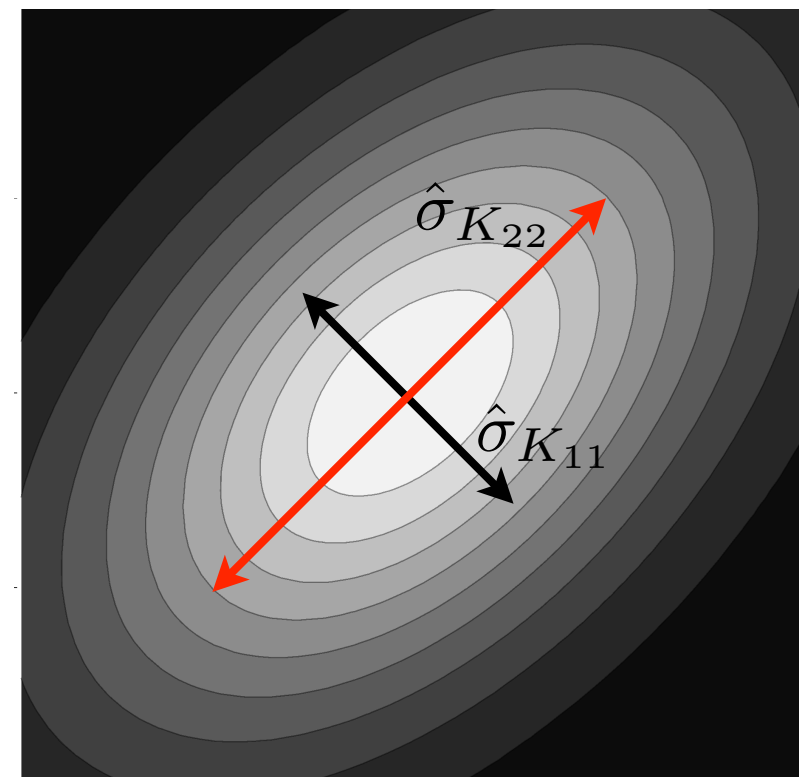
$$K(x_1, x_2) = \exp\left[-\frac{x_1^2}{2\sigma_{K_{11}}^2}\right] \cdot \exp\left[-\frac{x_2^2}{2\sigma_{K_{22}}^2}\right] \cdot \exp\left[-\frac{x_1 x_2}{2\sigma_{K_{12}}}\right]$$



separable  
(no interactions)

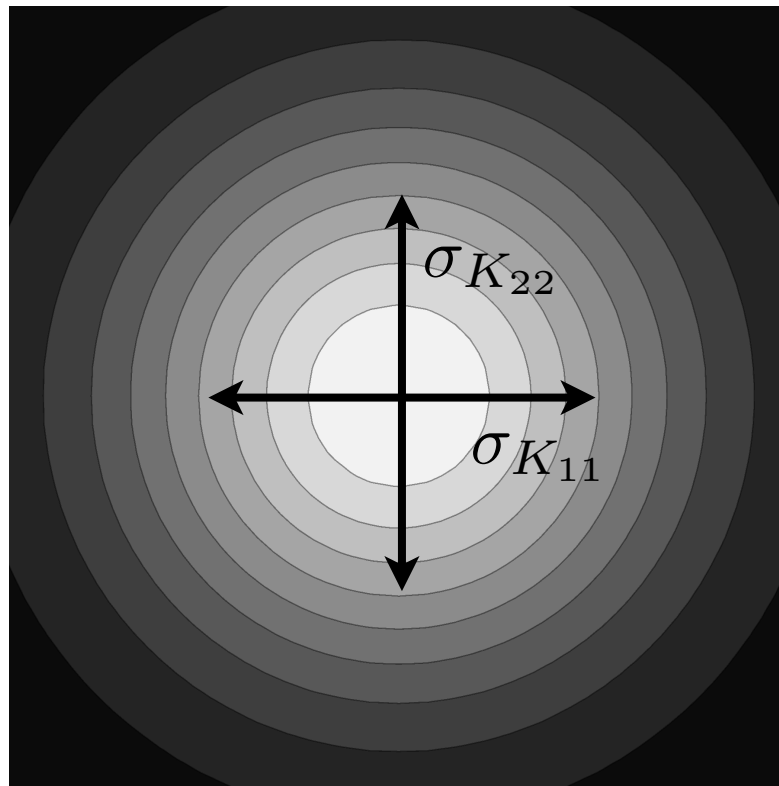


non-separable  
(phenotype interactions)

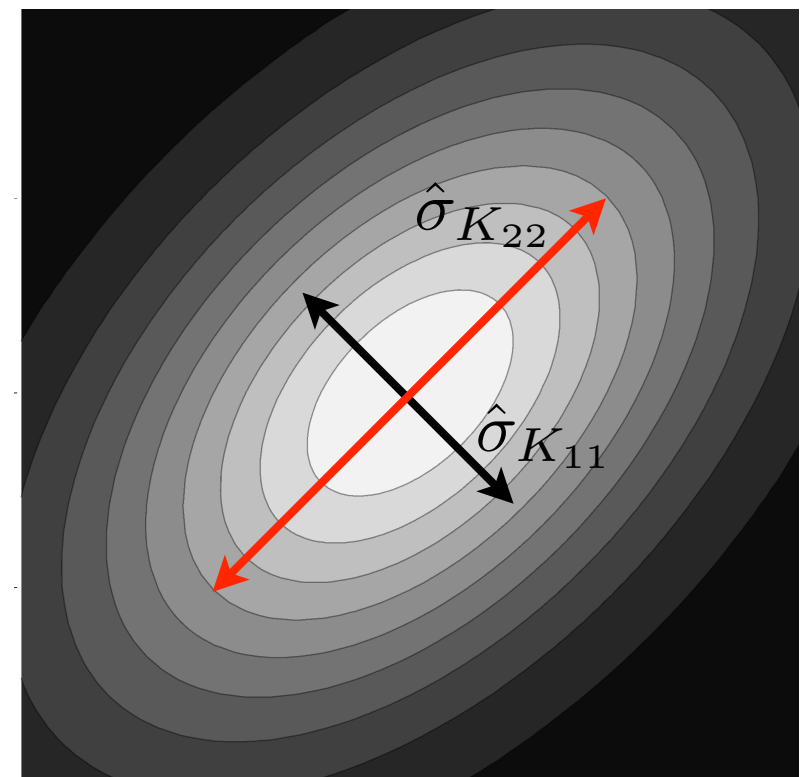


$$\sigma_{K_{22}} < \hat{\sigma}_{K_{22}}!$$

separable  
(no interactions)



non-separable  
(phenotype interactions)

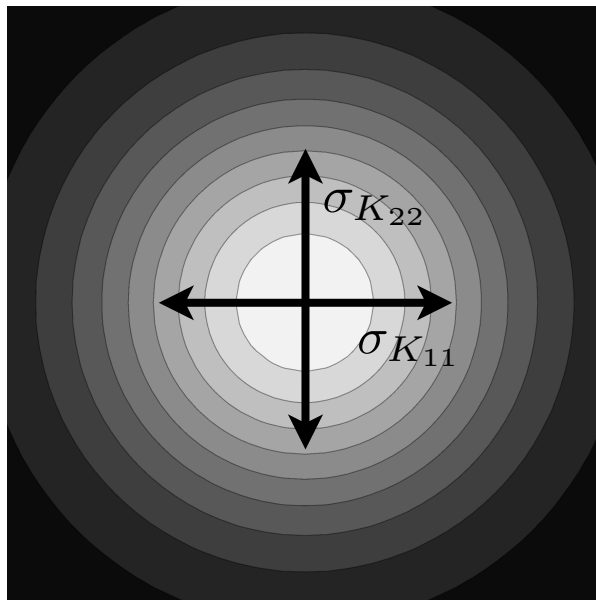


$$\sigma_{K_{22}} < \hat{\sigma}_{K_{22}}!$$

(occurs for *any* interaction between  $x_1$  and  $x_2$ ...)

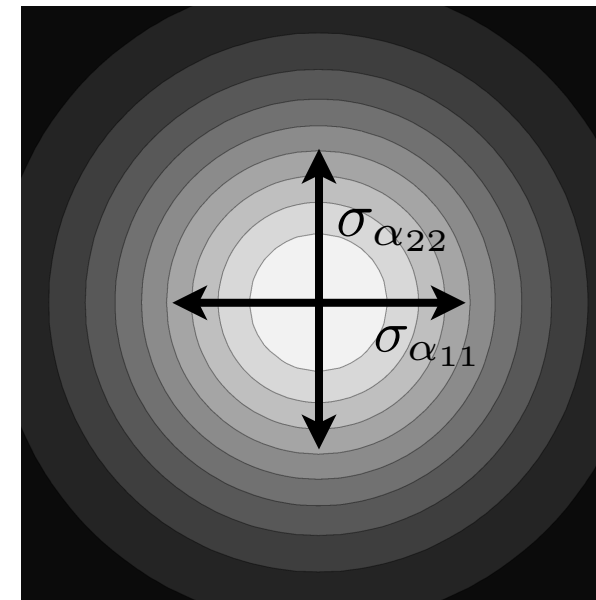


“on the brink of diversification”: widths the same in all directions



separable carrying capacity

$x_2 - y_2$

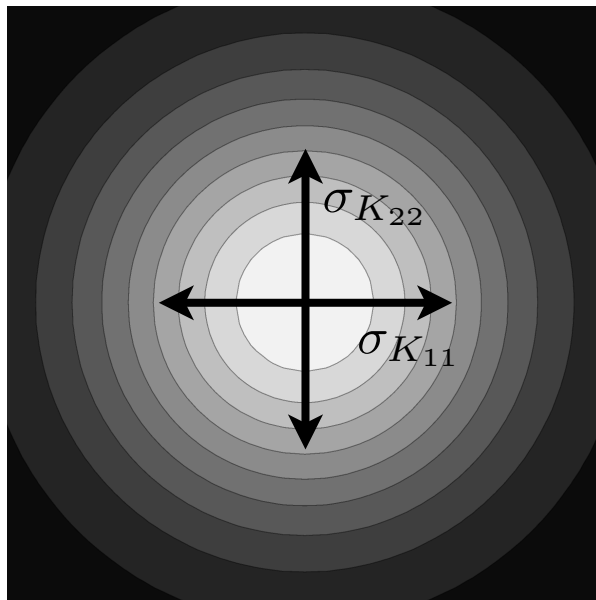


$x_1 - y_1$

separable competition kernel

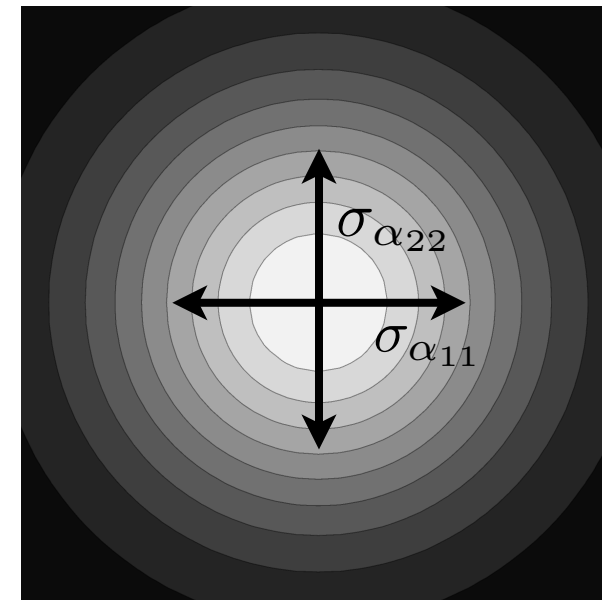
$$(\sigma_{K_{11}} = \sigma_{K_{22}} = \sigma_{\alpha_{11}} = \sigma_{\alpha_{22}})$$

“on the brink of diversification”: widths the same in all directions



separable carrying capacity

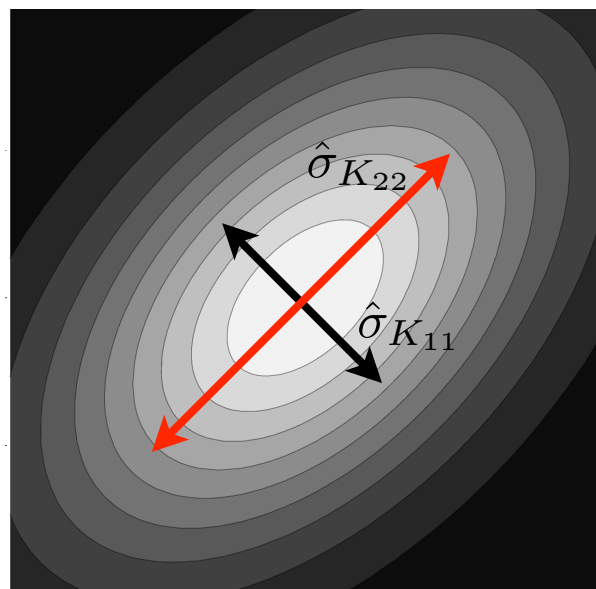
$x_2 - y_2$



separable competition kernel

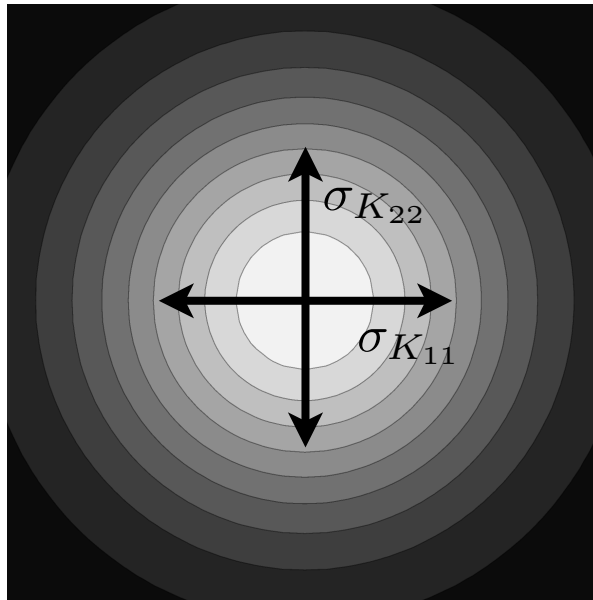
$$(\sigma_{K_{11}} = \sigma_{K_{22}} = \sigma_{\alpha_{11}} = \sigma_{\alpha_{11}})$$

$x_1 - y_1$



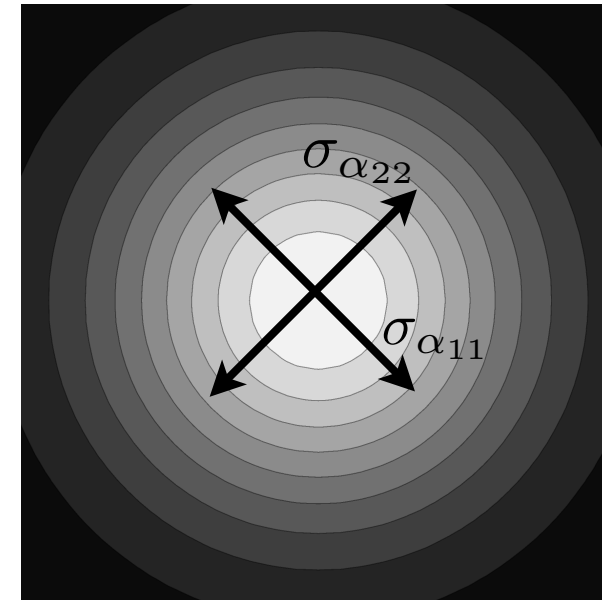
non-separable carrying capacity  
(phenotype interactions)

“on the brink of diversification”: widths the same in all directions



separable carrying capacity

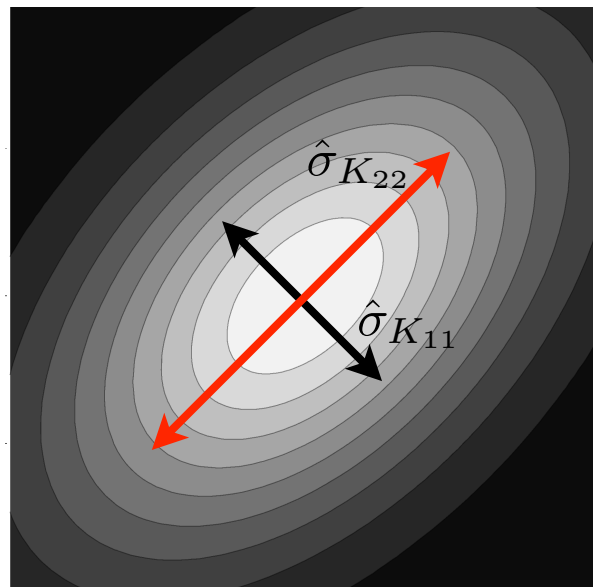
$x_2 - y_2$



$x_1 - y_1$

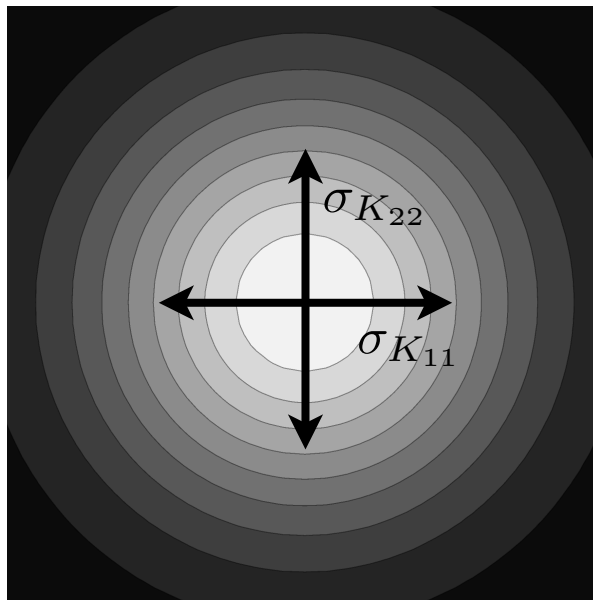
separable competition kernel

$$(\sigma_{K_{11}} = \sigma_{K_{22}} = \sigma_{\alpha_{11}} = \sigma_{\alpha_{11}})$$



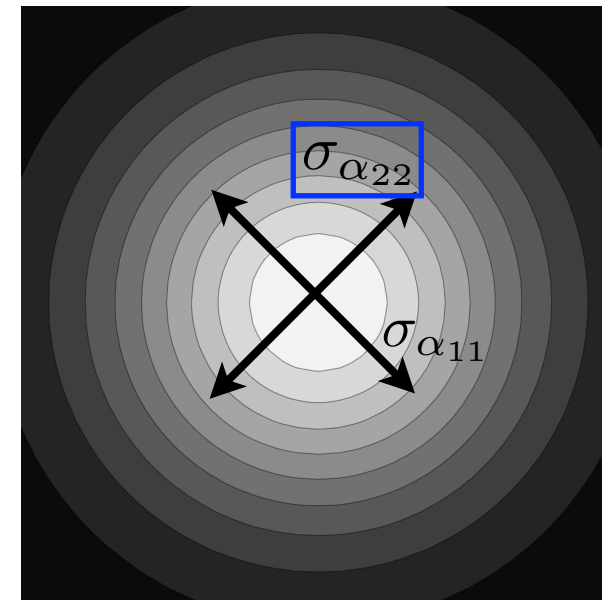
non-separable carrying capacity  
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separable carrying capacity

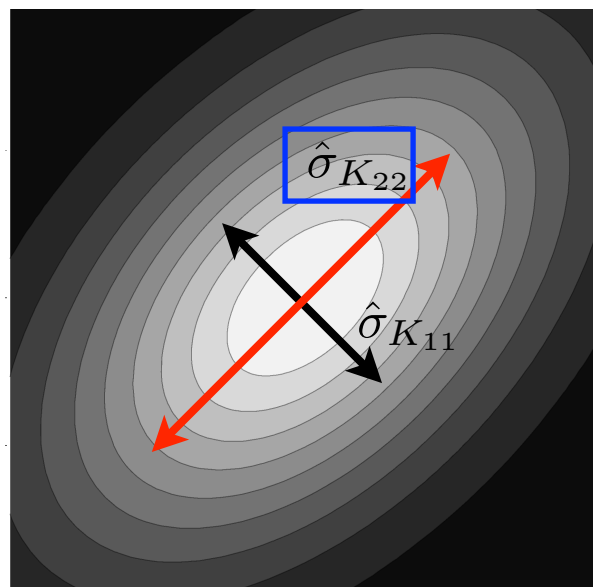
$x_2 - y_2$



$x_1 - y_1$

separable competition kernel

$$(\sigma_{K_{11}} = \sigma_{K_{22}} = \sigma_{\alpha_{11}} = \sigma_{\alpha_{22}})$$



non-separable carrying capacity  
(phenotype interactions)

$$\sigma_{\alpha_{22}} < \hat{\sigma}_{K_{22}} :$$

**diversification (along diagonal)!**

$n$  – dimensional phenotype  $x = (x_1, \dots, x_n)$

carrying capacity:  $K(x) = \exp[-xKx^T]$

competition kernel:  $\alpha(x, y) = \exp[-(x - y)A(x - y)^T]$

$A, K$ : quadratic forms

### Claim:

$A, K$  symmetric, positive definite quadratic forms  $\in \mathbb{R}^{n \times n}$

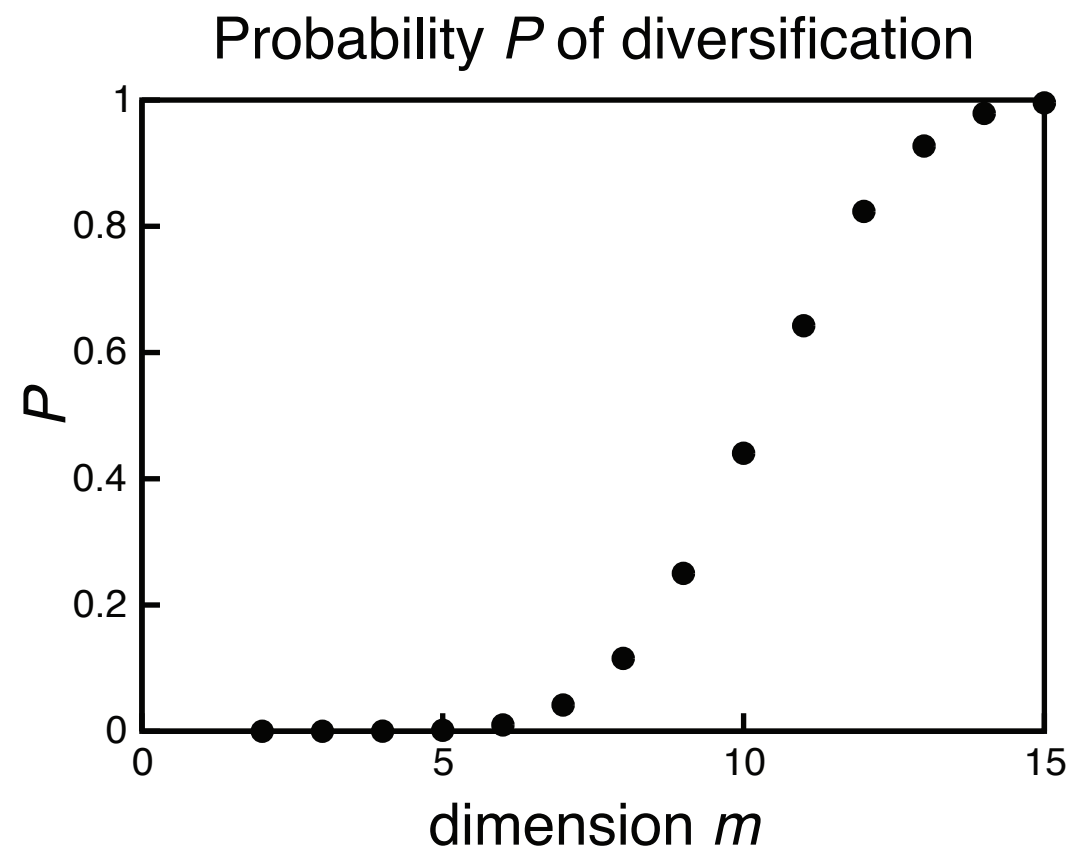
with diagonal elements  $a_{ii} = k_{ii} \quad \forall i$

Then there is a coordinate system in which the quadratic forms are given by diagonal matrices  $\hat{A}, \hat{K}$  such that  $\hat{a}_{i_0} > \hat{k}_{i_0}$  for at least one index  $i_0$

*Example:*

stabilizing selection dominates in each phenotypic direction  $i$  ( $\sigma_{\alpha_{ii}} = 1.6 > \sigma_{K_{ii}} = 0.7$ )

weak interactions strength between phenotypic components ( $|\sigma_{K_{ij}}|$  large, random)





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- Empirical support from microbial evolution experiments
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- “Adaptive Diversification”, Princeton University Press, 2011



Thank you