# Emergence of homogamy in a two-loci stochastic population model

#### Manon Costa

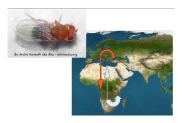
Institut de Mathématiques de Toulouse

joint work Camille Coron, Fabien Laroche, Hélène Leman et Charline Smadi.

### Motivation

Homogamy is a mating pattern in which individuals with similar phenotypes reproduce more frequently than expected under random uniform mating.

How does such mechanism arise in a randomly mating population?



### Motivation

## Eco-Evolutionary framework : take into account the underlying environment :

- Varying size populations
- Interactions with other individuals (competition for resource)
- Adaptive dynamics: Metz and al 1996, Bolker and Pacala 1997,...
- In the context of stochastic individual based models: Fournier and Méléard 2004, Champagnat 2006,...

## Uniformly mating population

### Genotypes

A or a

### **Ecological parameters**

- b mating rate
- d intrinsic death rate
- c competitive pressure.
- $K \in \mathbb{N}$  rescales the competition  $\approx$  carrying capacity.

## Random mating

- Initially, individuals mate uniformly
- Every individual, at rate b, chooses independently a mate uniformly
- Mendelian inheritance  $A \times a \rightarrow 1/2\delta_A + 1/2\delta_a$

Birth rate

$$b_{\alpha}(N) = b \left( N_{\alpha} \frac{N_{\alpha} + N_{\bar{\alpha}}/2}{N_{\alpha} + N_{\bar{\alpha}}} + N_{\bar{\alpha}} \frac{0.N_{\bar{\alpha}} + N_{\alpha}/2}{N_{\alpha} + N_{\bar{\alpha}}} \right) = b N_{\alpha},$$

Death rate

$$d_{\alpha}(N) = \left(d + \frac{c}{K}(N_A + N_a)\right)N_{\alpha}, \quad \alpha \in \{A, a\}.$$

## Dimorphic population with random mating

When population size of order K, rescaled population process  $(N_A + N_a)/K$  evolves as a competitive Lotka-Volterra equation (Ethier and Kurtz 1986):

$$\begin{cases} \dot{z}_A = (b - d - c(z_A + z_a))z_A \\ \dot{z}_a = (b - d - c(z_A + z_a))z_a \end{cases}$$

### Positive equilibrium if b > d

$$b-d-c(z_A+z_a)=0 \iff z_A+z_a=\overline{z}=\frac{b-d}{c}$$

$$\frac{\dot{z_A}}{z_A + z_a} = 0 \Rightarrow \text{ infinity of equilibria, any allele proportions}$$

## Mutation impacting the mate choice

- When random mating: allele p; new mutant: allele P
- On a chromosome different from the chromosome coding for a/A
- Benefit: higher birth rate with individuals of the same type (a/A):

$$b(1+\beta_1), \qquad (\beta_1 \ge 0)$$

• Cost : smaller birth rate with individuals of the other type (a/A) :

$$b(1-\beta_2) \qquad (0 \le \beta_2 < 1)$$

Assortative mating : preference for individuals of the same type

### Birth rate

Possible couples to generate Ap (first parent choosing and second parent chosen)

(1) 
$$Ap \times Ap$$
 (1/2)  $Ap \times ap$  (1/2)  $ap \times Ap$  (1/2)  $Ap \times AP$  (1/4)  $ap \times AP$  (1/4)  $Ap \times aP$  (1/2)  $AP \times Ap$  (1/4)  $AP \times ap$  (1/4)  $aP \times Ap$ 

Assortative birth rate

$$\begin{split} b_{Ap}(N) = & \frac{b}{N_A + N_a} \Big[ 1 N_{Ap} N_{Ap} + \frac{1}{2} N_{Ap} N_{ap} + \frac{1}{2} N_{ap} N_{Ap} + \frac{1}{2} N_{Ap} N_{AP} \\ & \quad + \frac{1}{4} N_{ap} N_{AP} + \frac{1}{4} N_{Ap} N_{aP} \Big] \\ & \quad + \frac{(1 + \beta_1) b}{N_A + N_a} \Big[ \frac{1}{2} N_{AP} N_{Ap} \Big] + \frac{(1 - \beta_2) b}{N_A + N_a} \Big[ \frac{1}{4} N_{AP} N_{ap} + \frac{1}{4} N_{aP} N_{Ap} \Big]. \end{split}$$

### Assortative birth rate

$$b_{Ap}(\mathbf{N}) = bN_{Ap} + \frac{b}{N} \left[ \frac{\beta_1}{2} N_{AP} N_{Ap} - \beta_2 \left( \frac{1}{4} N_{AP} N_{ap} + \frac{1}{4} N_{aP} N_{Ap} \right) \right]$$

$$- \frac{b}{2N} \left[ N_{aP} N_{Ap} - N_{AP} N_{ap} \right].$$

$$b_{AP}(\mathbf{N}) = bN_{AP} + \frac{b}{N} \left[ \beta_1 N_{AP} \left( N_{AP} + \frac{1}{2} N_{Ap} \right) - \beta_2 \left( N_{AP} \left( n_{aP} + \frac{1}{4} N_{ap} \right) + \frac{1}{4} N_{aP} N_{Ap} \right) \right]$$

$$+ \frac{b}{2N} \left[ N_{aP} N_{Ap} - N_{AP} N_{ap} \right].$$

### Death rates

When the population is in state  $N = (N_{AP}, N_{aP}, N_{Ap}, N_{ap})$  the total death rate of i individuals ( $i \in \{AP, aP, Ap, ap\}$ ):

$$N_i \left( d + rac{c}{K} (N_{AP} + N_{aP} + N_{Ap} + N_{ap}) \right).$$

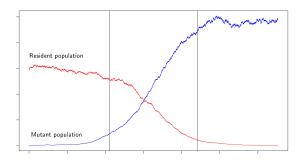
### Questions

- Under which conditions may the mutant P invade?
- What is the invasion probability?

- What is the final state of the population?
- What is the invasion time scale?

### **Dynamics**

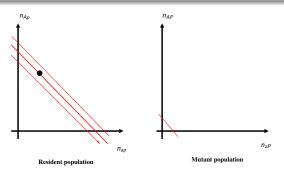
- 1- Invasion phase
- 2- Comparison with a deterministic limit
- 3- Extinction



### Invasion phase

### First idea to study the beginning of the invasion process

- Consider that as long as the mutant population size is small  $(\ll K)$  it has a small impact on the resident individuals
- Freeze the resident population size and allele proportions
- Compare the mutant population to a bitype branching process.



### Mathematical issues

- Proportions in the resident population not an hyperbolic equilibrium
- No large deviation results to ensure that they stay almost constant during an exponential time
- Proportions in the resident population very dependent on the P-population size
  - $\Rightarrow$  p and P populations have to be studied together

### Step 1 : control of the resident population size

 Coupling of the p-population size with two logistic processes with close birth and death rates as long as the P-population size is smaller than εK

- Classical large deviation results to ensure that the total p-population size stays close to (b-d)K/c during an exponential time
- Invasion time of order log K

## Step 2 : Control of the proportions in the resident population

As long as

$$0 < \mathit{N}_{\mathit{P}} < \varepsilon^{\xi} \mathit{K} \quad \text{and} \quad \left| \frac{\mathit{N}_{\mathit{p}}}{\mathit{K}} - \frac{b-\mathit{d}}{\mathit{c}} \right| < \varepsilon,$$

the proportions in the resident population stay close to their initial value :

$$\left| \frac{N_{A_P}}{N_p} - \frac{N_{A_P}(0)}{N_p(0)} \right| \leq (\mathcal{B}\varepsilon)^{1/4}$$

Idea of the proof : amounts to control

$$\frac{1}{K}\mathbb{E}\left[\int_0^{\tau_{\varepsilon}} N_P(s)ds\right] \leq C\varepsilon^{\xi}.$$

Achieved by finding a function such that

$$\int_0^t N_P \le \int_0^t \mathcal{L}f(N_{Ap}, N_{ap}, N_{AP}, N_{aP}) = f(\mathbf{N}(t)) - f(\mathbf{N}(0)) + Mart$$

# Step 3 : comparison of the P mutant population with a bitype branching process

- Once we know that the size and proportions vary slightly during the invasion, we can compare the p mutant population with a bi-type branching process
  - ▶ If supercritical, positive probability of invasion,
  - ▶ if subcritical, no invasion
- Also give the invasion time scaling if supercritical (log  $K/\lambda$ , where  $\lambda$  maximal eigenvalue of the mean matrix of the branching process)

## How to compute the approximation

Assume  $(N_{Ap},N_{ap})=Krac{b-d}{c}(
ho_A,1ho_A)$  and  $N_P\simeq arepsilon$  :

$$b_{AP}(N) = bN_{AP} \left[ 1 + \frac{\beta_1}{N} \left( N_{AP} + \frac{1}{2} N_{Ap} \right) - \frac{\beta_2}{N} \left( n_{aP} + \frac{1}{4} N_{ap} \right) - \frac{N_{ap}}{2N} \right] + bN_{aP} \frac{(2 - \beta_2)}{4N} N_{Ap}$$

## How to compute the approximation

Assume  $(N_{Ap}, N_{ap}) = K \frac{b-d}{c} (\rho_A, 1 - \rho_A)$  and  $N_P \simeq \varepsilon$ :

$$b_{AP}(\mathbf{N}) = bN_{AP} \left[ 1 + \frac{\beta_1}{N} \left( N_{AP} + \frac{1}{2} N_{Ap} \right) - \frac{\beta_2}{N} \left( n_{aP} + \frac{1}{4} N_{ap} \right) - \frac{N_{ap}}{2N} \right]$$

$$+ bN_{aP} \frac{(2 - \beta_2)}{4N} N_{Ap}$$

$$\simeq bN_{AP} \left[ 1 + \beta_1 \frac{\rho_A}{2} - \beta_2 \frac{1 - \rho_A}{4} - \frac{1 - \rho_A}{2} \right]$$

$$+ bN_{aP} \frac{(2 - \beta_2)}{4} \rho_A$$

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$$+ bN_{aP} \frac{(2 - \beta_2)}{4N} N_{Ap}$$

$$\simeq bN_{AP} \left[ 1 + \beta_1 \frac{\rho_A}{2} - \beta_2 \frac{1 - \rho_A}{4} - \frac{1 - \rho_A}{2} \right]$$

$$+ bN_{aP} \frac{(2 - \beta_2)}{4} \rho_A$$

$$d_{AP}(\mathbf{N}) = N_{AP}(d + \frac{c}{\kappa}N) \simeq b$$

## Mutant population of size $\varepsilon K$

Comparison of the mutant population with supercritical branching process

Infinitesimal generator:

$$\frac{b}{2} \begin{pmatrix} \rho_A(1+\beta_1) - \frac{\beta_2}{2}(1-\rho_A) - 1 & (1-\rho_A)\left(1-\frac{\beta_2}{2}\right) \\ \rho_A\left(1-\frac{\beta_2}{2}\right) & (1-\rho_A)(1+\beta_1) - \frac{\beta_2}{2}\rho_A - 1 \end{pmatrix},$$

### Kesten-Sigmung Theorem

If  $\pi = (\pi_A, \pi_a)$  is the normalized left eigenvector associated to the maximal eigenvalue

 $\Rightarrow$  the proportions of A and a in the mutant population close to  $\pi$  when the mutant population reaches a size of order K.

### Invasion with positive probability

From the branching approximation, we deduce that invasion has a positive probability  $(1-q_A/1-q_a)$  if and only if

$$\beta_1 > \beta_2$$
 or  $\rho_A(1 - \rho_A) < \frac{\beta_1(\beta_2 + 2)}{2(\beta_1 + \beta_2)(\beta_1 + 2)}$ .

Two conditions may foster the invasion

- Advantage of the homogamous reproduction has to be larger than cost
- Small initial allelic diversity

## Invasion probability

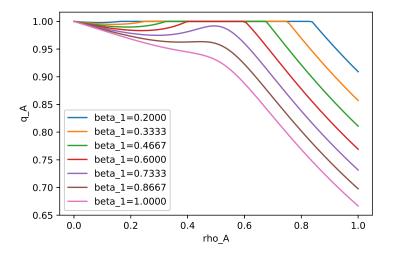
Invasion probability If first mutant of type  $\alpha$ ,  $1-q_{\alpha}$  where  $(q_A, q_a)$  smallest solution of

$$\begin{split} &(1-q_A) + \frac{1}{2} \left[ 1 + \rho_A (1+\beta_1) - \frac{\beta_2}{2} (1-\rho_A) \right] q_A (1-q_A) + \frac{1-\rho_A}{2} \left[ 1 - \frac{\beta_2}{2} \right] q_A (q_a - 1) = 0 \\ &(1-q_a) + \frac{1}{2} \left[ 1 + (1-\rho_A)(1+\beta_1) - \frac{\beta_2}{2} \rho_A \right] q_a (1-q_a) + \frac{\rho_A}{2} \left[ 1 - \frac{\beta_2}{2} \right] q_a (q_A - 1) = 0. \end{split}$$

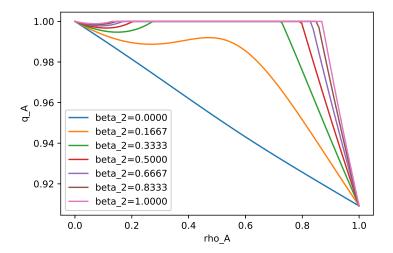
A special case If  $\rho_A = 1$  (only A individuals),  $q_A = 2/(2 + \beta_1)$ 

$$q_{a} = \frac{1}{2 - \beta_{2}} \left( \frac{6 - \beta_{1}\beta_{2} + 4\beta_{1} - \beta_{2}}{2 + \beta_{1}} - \sqrt{\left(\frac{6 - \beta_{1}\beta_{2} + 4\beta_{1} - \beta_{2}}{2 + \beta_{1}}\right)^{2} - 4(2 - \beta_{2})} \right).$$

 $q_A$ , for  $\beta_2 = 0.7$ 



 $q_A$ , for  $\beta_1 = 0.2$ 



## Mean field phase

**4-dimensional dynamical system** Once p- and P-populations of order K, we can compare the evolution of the system to this of a dynamical system (Ethier and Kurtz 1986)

$$\begin{cases} \dot{z}_{\alpha P} = bz_{\alpha P} + \frac{b}{z} \left[ \beta_1 z_{\alpha P} \left( z_{\alpha P} + \frac{z_{\alpha p}}{2} \right) - \beta_2 \left( z_{\alpha P} \left( z_{\bar{\alpha} P} + \frac{z_{\bar{\alpha} p}}{4} \right) + z_{\alpha p} \frac{z_{\bar{\alpha} P}}{4} \right) \right] \\ + \frac{b}{2z} \left( z_{\bar{\alpha} P} z_{\alpha p} - z_{\alpha P} z_{\bar{\alpha} p} \right) - \left( d + cz \right) z_{\alpha P} \\ \dot{z}_{\alpha p} = bz_{\alpha p} + \frac{b}{z} \left[ \beta_1 z_{\alpha p} \frac{z_{\alpha P}}{2} - \beta_2 \left( z_{\alpha p} \frac{z_{\bar{\alpha} P}}{4} + z_{\alpha P} \frac{z_{\bar{\alpha} p}}{4} \right) \right] \\ - \frac{b}{2z} \left( z_{\bar{\alpha} P} z_{\alpha p} - z_{\alpha P} z_{\bar{\alpha} p} \right) - \left( d + cz \right) z_{\alpha p} \end{cases}$$

 $\alpha \in \{a, A\}.$ 

## Convergence of the dynamical system

### **Theorem**

Assume that the initial condition **z** satisfies  $z_{AP} \geq z_{aP}$  and  $z_{Ap} \geq z_{ap}$  and moreover that

$$\beta_1 > \beta_2$$
 or  $\frac{z_{ap}(0)}{z_p(0)} \frac{z_{Ap}(0)}{z_p(0)} < \frac{\beta_1(\beta_2 + 2)}{2(\beta_1 + \beta_2)(\beta_1 + 2)}.$ 

then the solution  $\mathbf{z}(t)$  converges as  $t \to \infty$  toward

$$z_{AP}^* = \frac{(1+\beta_1)b-d}{c}$$
 and  $z_{AP}^* = z_{Ap}^* = z_{Ap}^* = 0$ 

## Idea of the proof

- If  $\exists t_0$ ,  $(z_{AP}-z_{aP})(z_{Ap}-z_{ap})(t_0)>0$ , holds true for any  $t\geq t_0$
- Let us introduce  $D = z_A z_a / (z_A + z_a)^2$ . Then

$$\dot{D} \leq -D\frac{\beta_1 b}{z^2} (z_{AP} - z_{aP}) (z_{Ap} - z_{ap})$$

D positive, decreasing, thus converges to a limit point such that  $\dot{D}=0$ 

Among the possible limits, we prove that only one is possible :

$$(z_{Ap}, z_{ap}, z_{AP}, z_{aP}) = \left(0, 0, \frac{(1+\beta_1)b - d}{c}, 0\right).$$

### Extinction phase

Combining previous steps, with the Markov property we can assume that

$$(z_{Ap}, z_{ap}, z_{AP}, z_{aP}) \in [0, \eta]^2 \times \left[\frac{(1+\beta_1)b-d}{c} \pm \eta\right] \times [0, \eta]$$

Coupling with a subcritical birth and death process. Time to reach 0 for the p-population size :

$$\frac{2}{b\beta_1}\log K.$$

## Summary of the results

Initial condition  $(N_{\alpha P}(0), N_{\bar{\alpha} P}(0)) = (1, 0), \quad \alpha \in \mathfrak{A}$ 

$$\left(Z_{Ap}^K(0),Z_{ap}^K(0)\right) \underset{K \to \infty}{\overset{\mathbb{P}}{\to}} \left(\rho_A \frac{b-d}{c}, (1-\rho_A) \frac{b-d}{c}\right), \quad \rho_A > 1/2$$

### Stopping times

$$T_0^P=\inf\{t\geq 0,\, N_{AP}(t)+N_{aP}(t)=0\}$$
 extinction of mutant  $T_{\mathcal{S}_\mu}=\inf\{t\geq 0,\, \mathbf{N}(t)\in \mathcal{S}_\mu\}$  invasion of mutant

where

$$S_{\mu} = \left\{ \left( z_{AP}, z_{aP}, z_{Ap}, z_{ap} \right) \in \left[ rac{\left( 1 + eta_1 
ight) b - d}{c} \pm \mu 
ight] imes \left\{ 0 
ight\}^3 
ight\}$$

## Summary of the results

#### **Theorem**

Assume furthermore that  $\lambda \neq 0$ .

Then there exists a Bernoulli random variable B with parameter  $1-q_{\alpha}$ , such that for any  $0<\mu<(b(1+\beta_1)-d)/c$ :

$$\lim_{K \to \infty} \left( \frac{T_{\mathcal{S}_{\mu}} \wedge T_0^P}{\ln K}, \mathbf{1}_{\{T_{\mathcal{S}_{\mu}} < T_0^P\}} \right) = B \times \left( \frac{1}{b\tilde{\lambda}(\rho_A, \beta_1, \beta_2)} + \frac{2}{b\beta_1}, 1 \right),$$

where the convergence holds in probability.

### Future work

- Recombinations
- Dimorphic populations and dominance?
- Applications to mosquitoes

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Thank you for your attention!