

## How so diverse?

Self-incompatibility in flowering plants:  
a case-study for modelling the role of chance in evolution,  
from the beginnings of population genetics to today

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Sylvain Billiard

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Université de Lille - France - Lab. Evo-Eco-Paléo - UMR CNRS 8198

## Wild Cherry (*Prunus avium*)

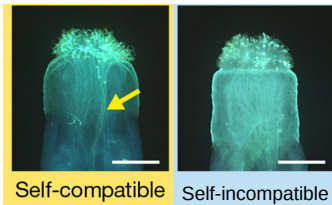
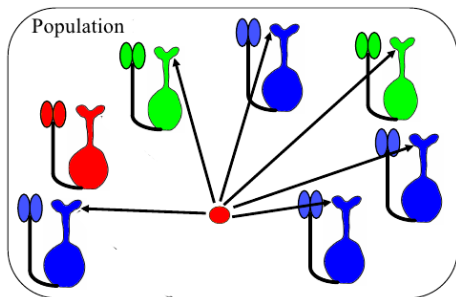








# Self-incompatibility: who can mate with whom?



- Brassicaceae (cabbage, *Arabidopsis*, rapeseed, ...)
- Asteraceae (salad, chicory, chrysanthemum, ...)
- Oleaceae (olive tree, ash tree, lilac, ...)
- Rosaceae (cherries, apples, ...)
- Solanaceae (tobacco, tomato, potato, ...)

# A huge surprising diversity



*Oenothera organensis*

45 S-alleles ~ 5000 individuals  
(Emerson 1938, 1939)



Wild cherry (*Prunus avium*)

22 S-alleles ~ 500 individuals  
(Stoeckel et al. 2011)



Wild tomato (*Solanum chilense*)

34 S-alleles ~ 100 sampled individuals  
(Igc et al. 2007)



*Arabidopsis halleri*

66 S-alleles ~ 900 sampled individuals  
(V. Castric, Pers. Comm.)



*Oenothera organensis*  
45 S-alleles ~ 5000 individuals  
(Emerson 1938, 1939)

## The birth of Population genetics stochastic models

- Fisher (1930), Wright(1937, 1938, 1945), Kolmogorov: Fokker-Planck equation
- Malécot (1945), Moran (1962), Ewens, Kimura, etc.: Markov Process

## An early application to Self-Incompatibility systems

- Wright(1939)

# One of the first quantitative prediction ever in population genetics

Natural selection

$$\Delta q = \frac{q(1-q)(1+R)}{2[R+q(1-R)]}$$

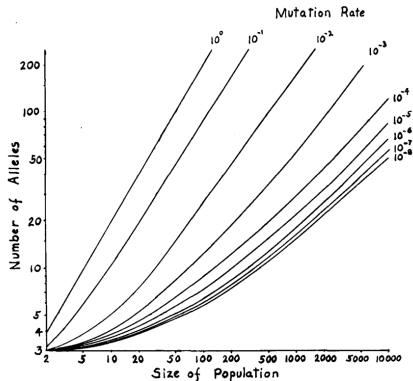
Mutation and Immigration

$$[1+u+m(1-q_i)]q + (v+mq_i)(1-q)$$

$$\sigma_{\Delta q}^2 = \frac{q(1-q)}{2N}$$

Binomial random sampling  
("genetic drift")

$$\phi(q) = C[R+q(1-R)]^{2N(1+R)/(1-R)} q^{4N(v+mq_i)-1} (1-q)^{4N[1+u+m(1-q_i)]-1}$$



# Self-incompatibility: an archetype for stochastic models in population genetics (long story short)

## Haters gonna hate

- Fisher (1958), Wright (1960)

## A surge from the shoulders of Giants

- Wright(1964, 1966)
- Ewens (1964, 1966), Kimura and Crown (1964), Mayo (1966), Moran (1962), Yokoyama and Nei (1979)

## But incomplete

- Moran (1962): lack of rigour as “*the probabilistic model has not been specified*” and other criticisms
- Wright (1964): not important as “ *My paper was directed at giving an admittedly approximate solution of a biological problem*”

# From micro to macro: from scratch (Czuppon and Billiard 2022)

A Moran's model

# Rates and approximations

## Birth rate

$$T_{ij}^+ = \left( \underbrace{\frac{1}{2} \sum_{k \neq i,j} A_{jk} \frac{p_i}{1-p_j-p_k}}_{i \text{ pollen fertilization}} + \underbrace{\frac{1}{2} \sum_{k \neq i,j} A_{ik} \frac{p_j}{1-p_i-p_k}}_{j \text{ pollen fertilization}} \right) \underbrace{\frac{N-A_{ij}}{N}}_{\text{non-}\{ij\}\text{ replacement}}$$

## Death rate

$$T_{ij}^- = \left( \underbrace{N - \frac{1}{2} \sum_{k \neq i,j} A_{ik} \frac{p_j}{1-p_i-p_k} - \frac{1}{2} \sum_{k \neq i,j} A_{jk} \frac{p_i}{1-p_j-p_k}}_{\text{non-}\{ij\}\text{ reproduction}} \right) \underbrace{\frac{A_{ij}}{N}}_{\{ij\} \text{ replacement}}$$

## Approximations of the stationary distributions: Ornstein-Uhlenbeck for $M$ different S-alleles.

(Diffusion approximation on frequencies,  $N$  large, Central Limit Theorem)

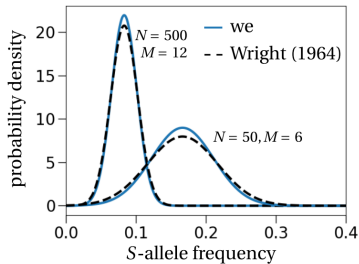
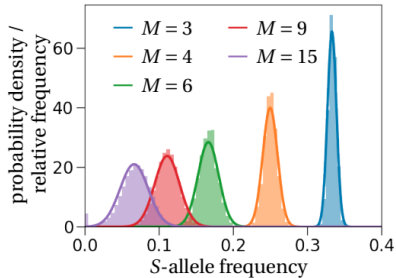
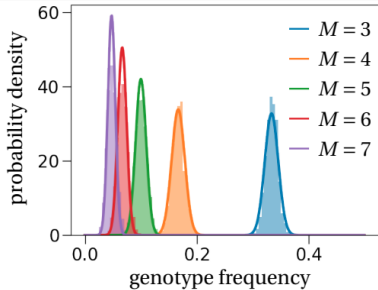
### Genotypic frequencies

$$da_{ij}(t) = \mu_{ij}(t)dt + \sqrt{\frac{\sigma_{ij}^2(t)}{N}} dW_t^{ij} \quad \longrightarrow \quad \psi_{ij}^* \sim \begin{cases} \mathcal{N}\left(\frac{2}{M(M-1)}, \frac{4(M-2)(M+1)}{3NM^2(M-1)^2}\right), & M=3, \\ \mathcal{N}\left(\frac{2}{M(M-1)}, \frac{2(M-2)(M+1)}{NM^2(M-1)^2}\right), & M \geq 4, \end{cases}$$

### Allelic frequencies

$$dp_i(t) = \mu_i(t)dt + \sqrt{\frac{\rho_i^2(t)}{N}} dW_t^i \quad \longrightarrow \quad \psi \sim \mathcal{N}\left(\frac{1}{M}, \frac{(M-2)^3}{NM^2(2M-3)}\right),$$

# Stationary distributions





# Rates and approximations

## Birth rate

$$T_{ij}^+ = \left( \underbrace{\frac{1}{2} \sum_{k \neq i,j} A_{jk} \frac{p_j}{1-p_j-p_k}}_{i \text{ pollen fertilization}} + \underbrace{\frac{1}{2} \sum_{k \neq i,j} A_{ik} \frac{p_j}{1-p_i-p_k}}_{j \text{ pollen fertilization}} \right) \underbrace{\frac{N-A_{ij}}{N}}_{\text{non-}(ij) \text{ replacement}}$$

## Death rate

$$T_{ij}^- = \underbrace{\left( N - \frac{1}{2} \sum_{k \neq i,j} A_{ik} \frac{p_j}{1-p_i-p_k} - \frac{1}{2} \sum_{k \neq i,j} A_{jk} \frac{p_i}{1-p_j-p_k} \right)}_{\text{non-}(ij) \text{ reproduction}} \underbrace{\frac{A_{ij}}{N}}_{(ij) \text{ replacement}}$$

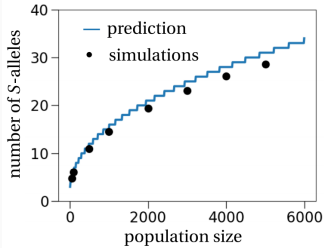
## Approximations of the expected number of S-alleles.

Allelic frequencies

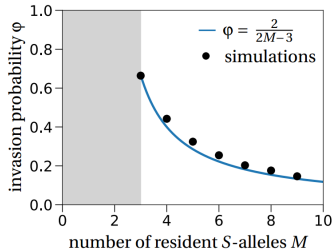
$$dp_i(t) = \mu_i(t)dt + \sqrt{\frac{\rho_i^2(t)}{N}} dW_t^i \longrightarrow \psi \sim \mathcal{N}\left(\frac{1}{M}, \frac{(M-2)^3}{NM^2(2M-3)}\right),$$

$$u = \underbrace{\frac{M}{N}}_{T^- \times M} \times \underbrace{\int_{-\infty}^{1/2N} \psi(x) dx}_{S\text{-allele at freq. } 1/2N},$$

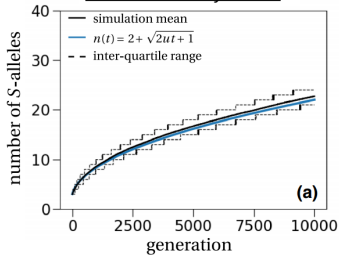
### Expected diversity



### Invasion probability



### Diversification dynamics



1. Towards the stationary distribution of the number of  $S$ -alleles  $M$
2. Individual plants distributed in a continuous space and dispersal
3. Joint inference of the number of  $S$ -alleles  $\hat{M}$  and population size  $\hat{N}$
4.  $S$ -allele emergence and the origin of the mutation rate  $u$

# 1. Stationary distribution of the number of $S$ -alleles $M$

## A Moran's model with mutation

**Birth rate**

$$T_{ij}^+ = \left( \underbrace{\frac{1}{2} \sum_{k \neq i,j} A_{jk} \frac{p_j}{1-p_j-p_k}}_{i \text{ pollen fertilization}} + \underbrace{\frac{1}{2} \sum_{k \neq i,j} A_{ik} \frac{p_j}{1-p_i-p_k}}_{j \text{ pollen fertilization}} \right) \underbrace{\frac{N-A_{ij}}{N}}_{\text{non-}(ij)\text{ replacement.}}$$

**+ mutation / immigration**

**Death rate**

$$T_{ij}^- = \left( \underbrace{N - \frac{1}{2} \sum_{k \neq i,j} A_{ik} \frac{p_j}{1-p_i-p_k} - \frac{1}{2} \sum_{k \neq i,j} A_{jk} \frac{p_i}{1-p_j-p_k}}_{\text{non-}(ij)\text{ reproduction}} \right) \underbrace{\frac{A_{ij}}{N}}_{(ij)\text{ replacement}}$$

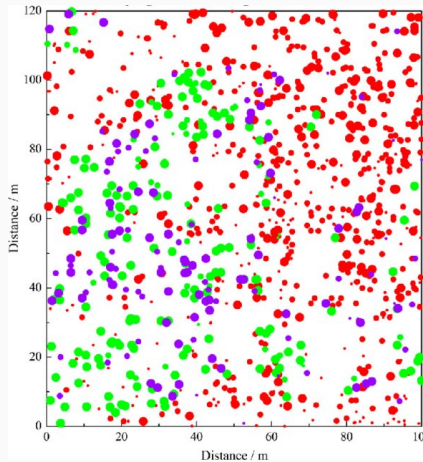
**- mutation / immigration**

Convergence?



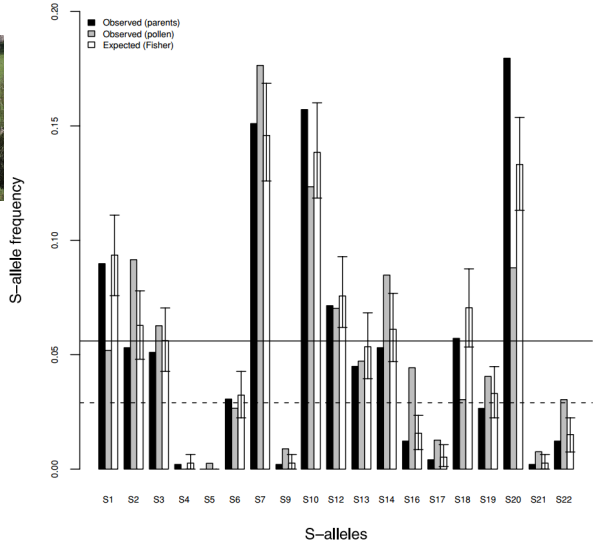
$$u = \underbrace{\frac{M}{N}}_{T^- \times M} \times \underbrace{\int_{-\infty}^{1/2N} \psi(x) dx}_{S\text{-allele at freq. } 1/2N}$$

## 2. Continuous spatial distribution



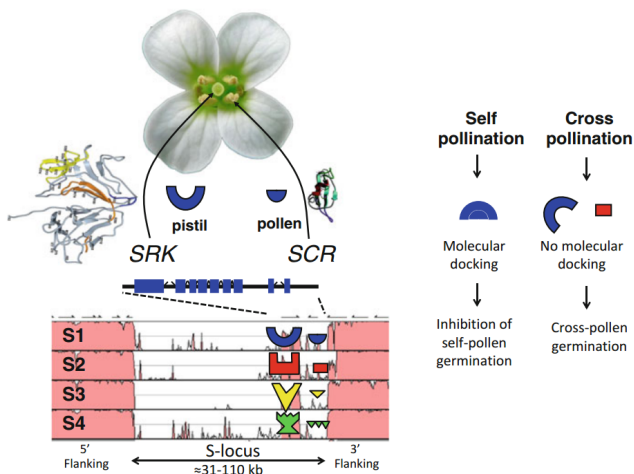
### 3. Estimator of $M$ and $N$ from a sample

*Prunus avium*

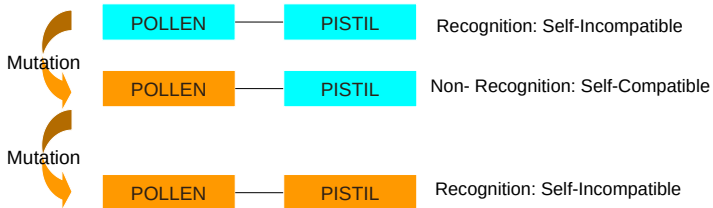


(Stoeckel et al. 2011)

## 4. Origin of the mutation rate $u$ key-lock mechanism / two genes - one locus



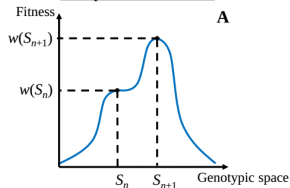
## Where's the problem?



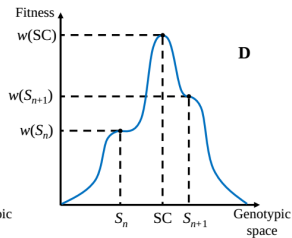
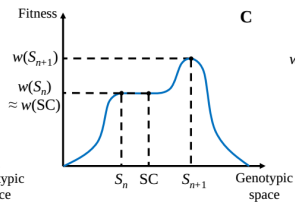
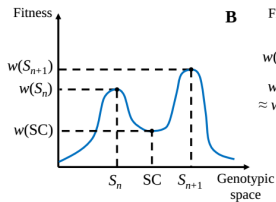


# A crossing of fitness valley problem

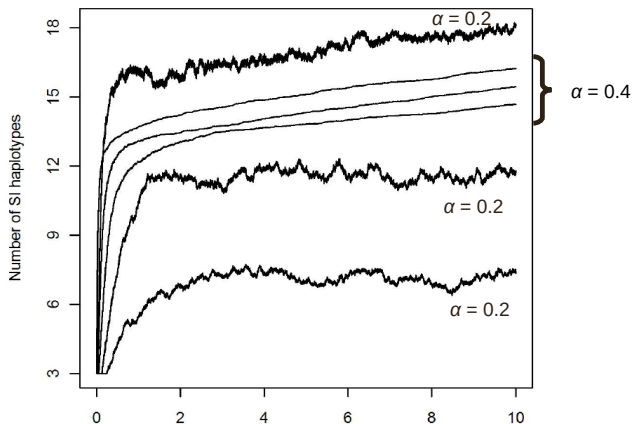
1-step mutation model



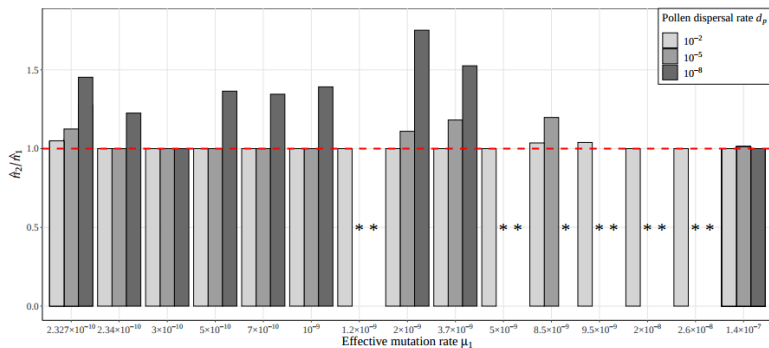
2-steps mutation model



# Diversification of S-alleles: Individual-Based stochastic simulations



# In a deme-subdivided population: A puzzle



# Self-incompatibility as an archetype for stochastic models in population genetics: An update

## PDEs, stochastic computer simulations, ...

- Fisher (1958), Wright (1960)
- Wright(1964, 1966)
- Ewens (1964, 1966), Kimura and Crown (1964), Mayo (1966), Moran (1962), Yokoyama and Nei (1979)

## But...

- Moran (1962): lack of rigour
- Wright (1964): mathematic justification are not important as far as "*it works*"

## A very recent micro → macro derivation

- Czuppon and Billiard (2022): old models and new results
- Still much to do! Keep on running Self-Incompatibility for population genetics!