

Three Lectures about : “Evolutionary Processes and Patterns of Biodiversity”

Lecture 3/3 : Coevolving genes and species

Amaury Lambert

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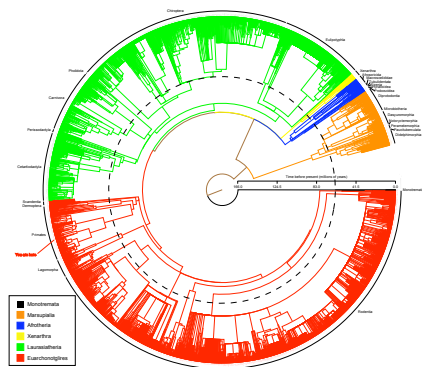


IICD & Probability and Society Initiative Joint Seminar Series
Columbia University
October 23, 2020

Outline

1. Introduction
2. Nested coalescents generalizing the MSC
3. Model 1. Dynamic spatial structure
4. Two models allowing for gene flow
5. Applications
6. References

Introduction : how to get deeper insight into macro-evolutionary processes

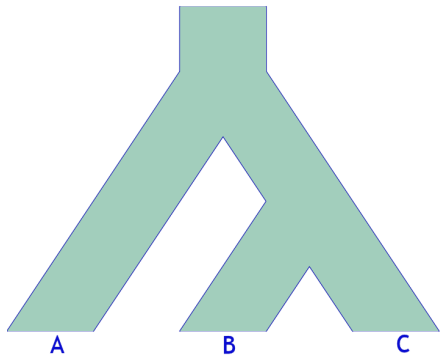


Phylogeny of Mammals
Bininda-Emonds et al *Nature* 2007

- ▶ Statistical problems in the phylogenetic approach to diversification (see Lecture 2)
 - ▶ False positive associations
(Rabosky & Goldberg *Syst Biol* 2015)
 - ▶ Problems of identifiability
(Louca & Pennell *Nature* 2020)
- ▶ Phylogenies are not big data
- ▶ Need to search for **additional signal** from :
 - ▶ Fossils
 - ▶ **Genomes**

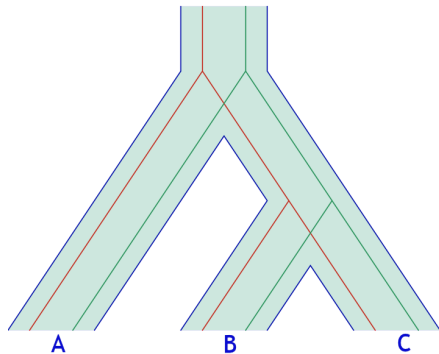
Gene trees vs Species tree

- ▶ Gene trees can be inferred by comparing sequences



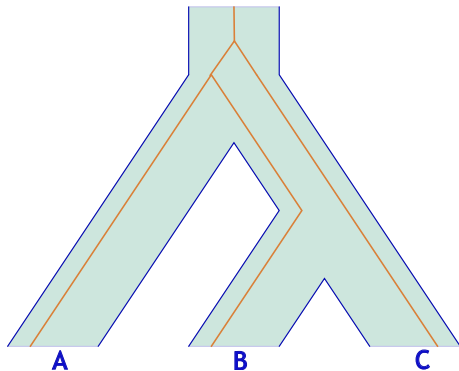
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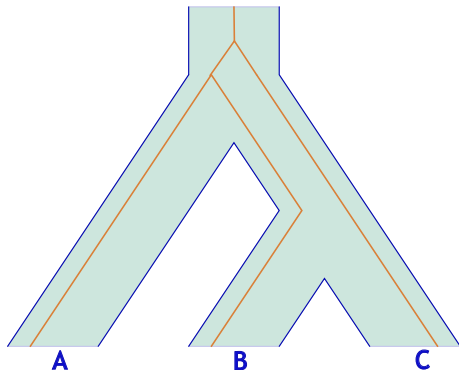
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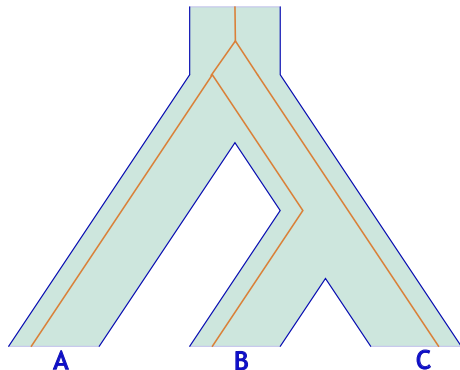
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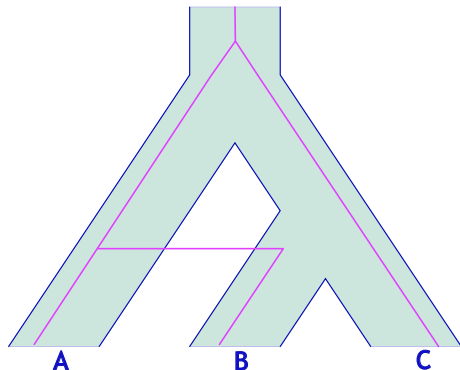
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SHAKING UP THE TREE OF LIFE

Species were once thought to keep to themselves. Now, hybrids are turning up everywhere, challenging evolutionary theory



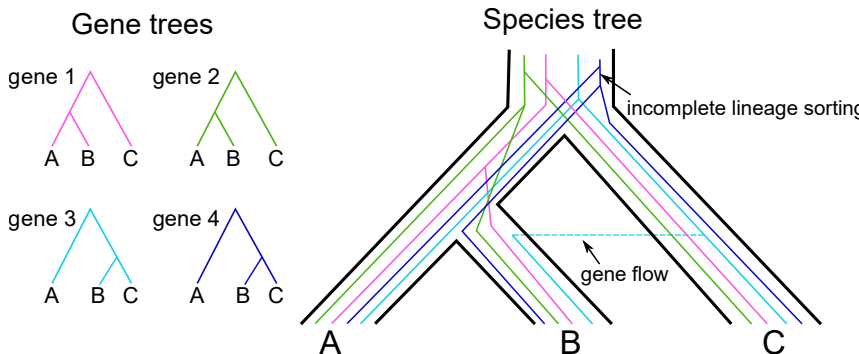
Outline

- ▶ Trees within tree : multispecies coalescent and other nested coalescents
- ▶ A model allowing for dynamic spatial structure
- ▶ Two models allowing for gene flow between species
- ▶ Applications
 - ▶ **Q1.** How do nested coalescents come down from infinity?
 - ▶ **Q2.** How to cluster a sample of genomes into putative species

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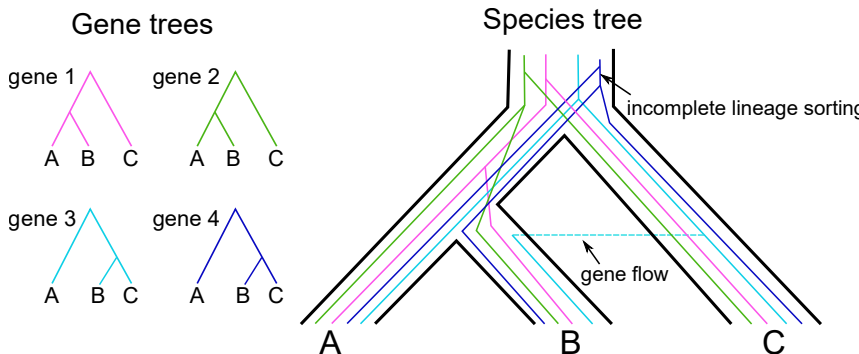
Coupling gene trees and species tree : The Multispecies Coalescent Paradigm



Picture by Julie Marin

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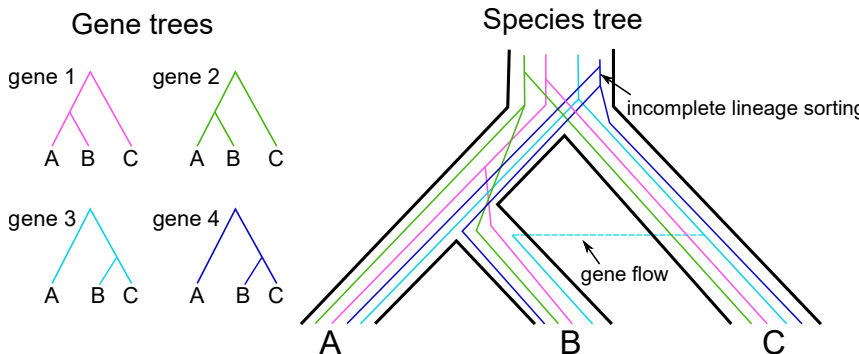
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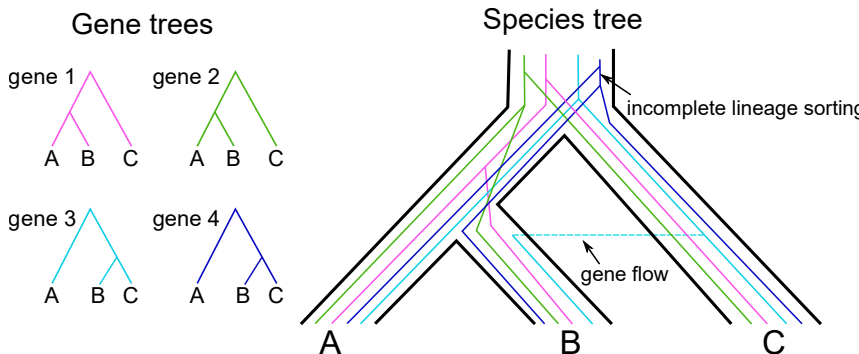
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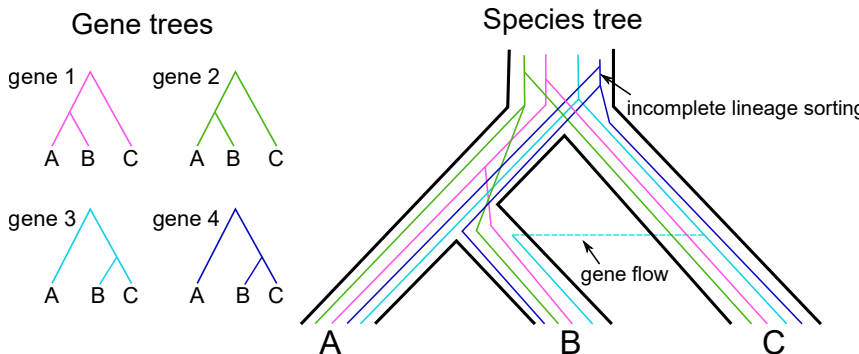
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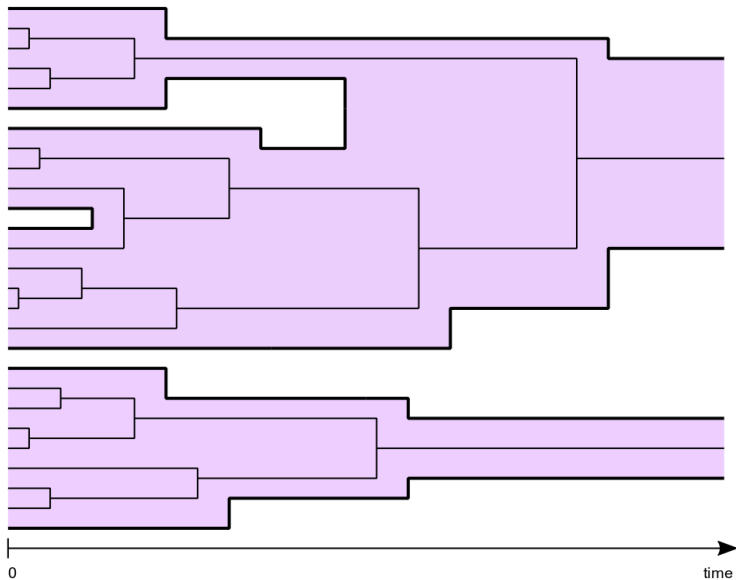
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- ▶ Disagreements among gene trees mainly due to **randomness of coalescent process**
- ▶ Example : if sp tree given by Kingman's coalescent, the pair gene tree/species tree is called the **nested Kingman coalescent**, or simply '**Kingman in Kingman**'...

Kingman in Kingman



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Sagitov, Möhle, Pitman, Schweinsberg, Berestycki, Bertoin, Le Gall...

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- ▶ A partition into b blocks sees a given subset of $k \geq 2$ blocks merge at rate

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- ▶ ...corresponding to Kingman coalescent when $\Lambda = \delta_0$.

Nested coalescents

- ▶ A **nested coalescent** describes the coagulation dynamics of genes contained in species
- ▶ Sample DNA **at the same locus** in each individual labelled $1, \dots, n$ and define $\Pi^g(t)$ and $\Pi^s(t)$ by
 - i and j are in same block of $\Pi^g(t) \iff$ the **gene lineages** of i and j have **coalesced before t**
 - i and j are in same block of $\Pi^s(t) \iff$ the **species lineages** of i and j have **coalesced before t**
- ▶ In the absence of gene flow, gene lineages can **coalesce only if $\in$ the same species**
 - $\Rightarrow \Pi^g(t)$ **is finer than** $\Pi^s(t)$.
- ▶ A nested coalescent is said **simple** if both Π^g and Π^s see only **one merger at a time – but possibly the same time.**

Simple nested coalescents

Blancas, Duchamps, Lambert & Siri-Jégousse, "Trees within trees : Simple nested coalescents", *EJP* (2018)

Theorem (Blancas, Duchamps, Lambert & Siri-Jégousse (2018))

A *simple nested coalescent* can be characterized by the following three types of mechanisms :

- ▶ There is a *measure Λ_s on $[0, 1]$* such that species undergo Λ -coalescent-type events according to Λ_s , *during which genes do nothing*.

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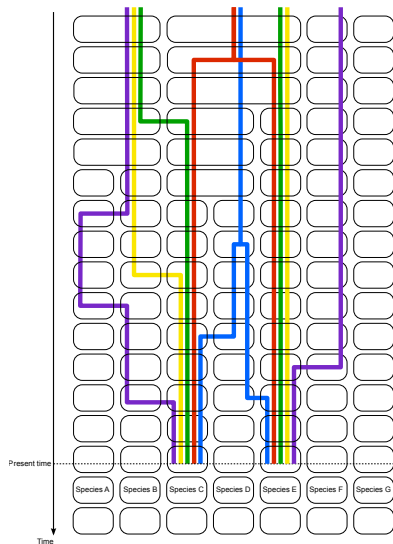
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For simple *nested fragmentations*, see :

Duchamps, JJ “Trees within trees II : Nested fragmentations”, *Ann Inst H Poincaré Probab Stat* (2020).

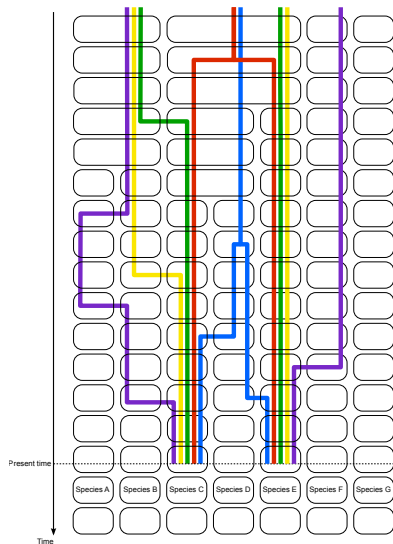
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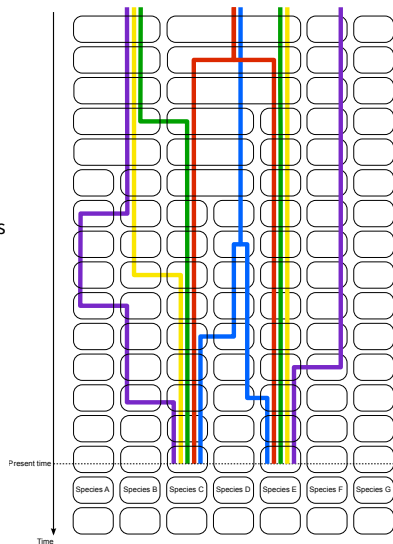
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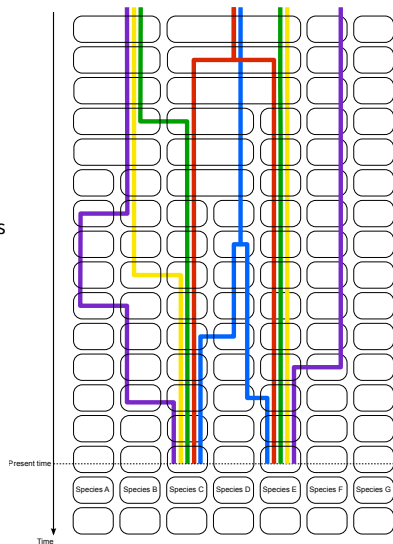
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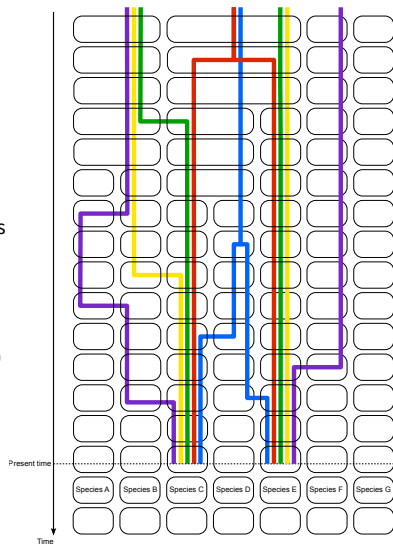
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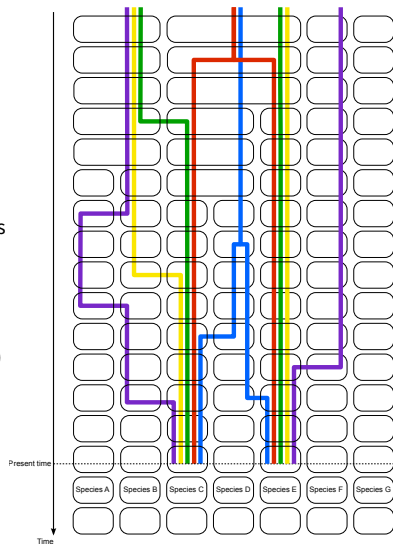
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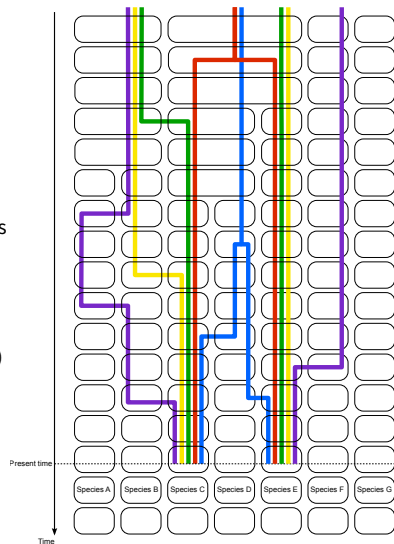
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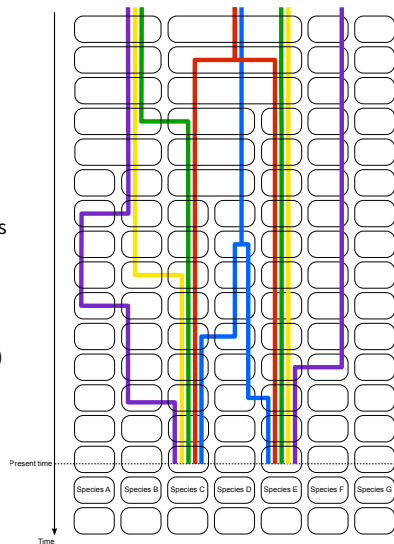
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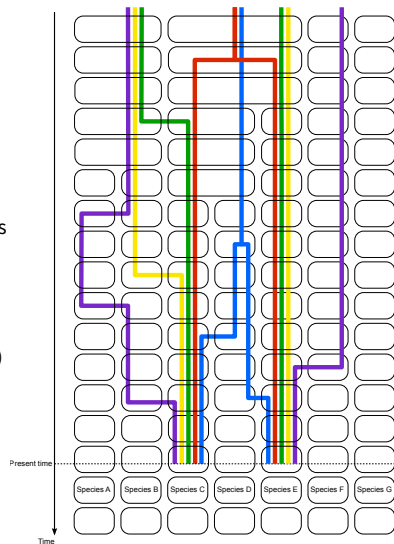
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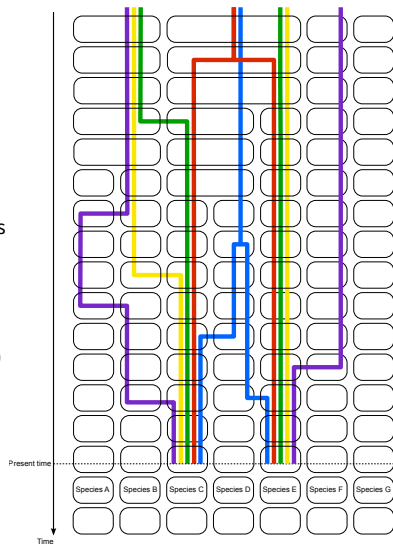
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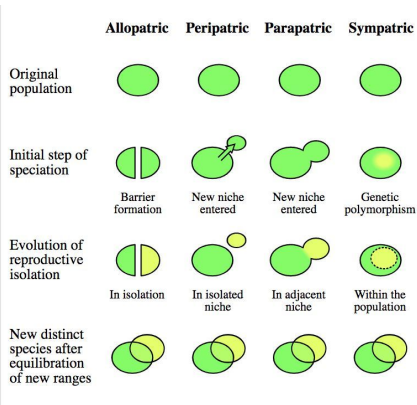


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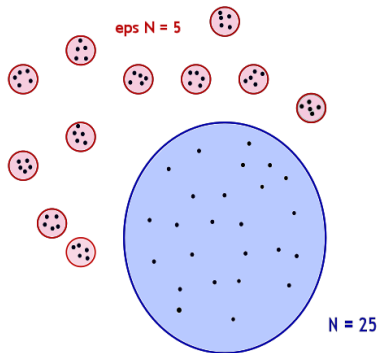
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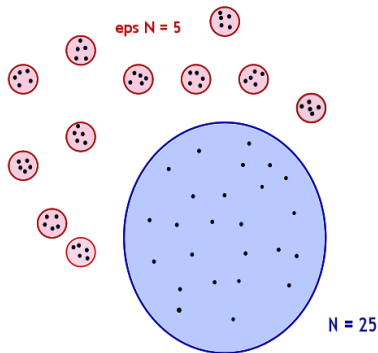
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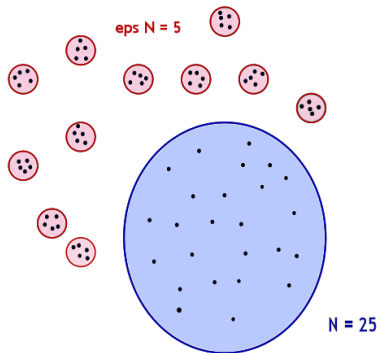
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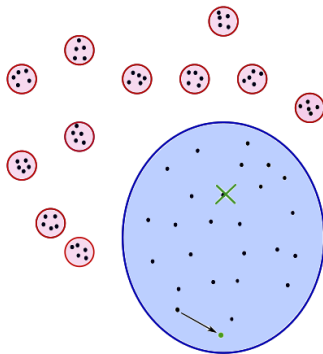
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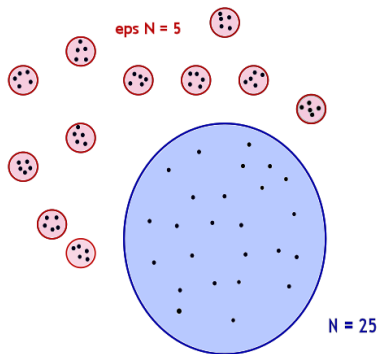
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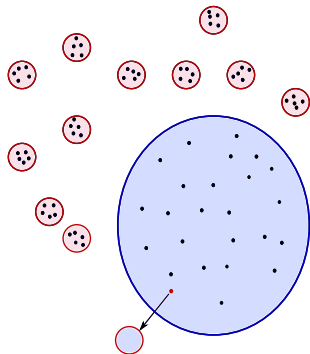


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 - ▶ Small colonies emerge from **colonization events (fission)** and disappear by **merging with main pop (fusion)**...

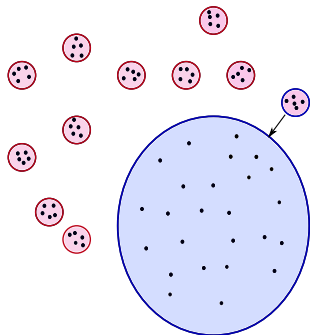


Metapopulation dynamics : Fusions and fissions



- ▶ **Fission** : each individual independently seeds a new colony...
- ▶ ...at rate $\theta_N = \theta / \varepsilon_N N^2$ if from main pop
- ▶ ...at rate $\beta_N = \beta / \varepsilon_N N^2$ if from a colony
- ▶ **Total fission rate** (gain of colonies) :

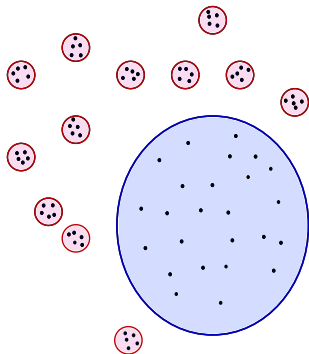
$$= \frac{\theta}{\varepsilon_N N^2} N + \frac{\beta}{\varepsilon_N N^2} (\varepsilon_N N \xi_N) = \frac{\theta + \beta(\varepsilon_N \xi_N)}{\varepsilon_N N}$$



- ▶ **Fusion** : each colony independently merges with main population...
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- ▶ $\alpha > 1$: density-dependence
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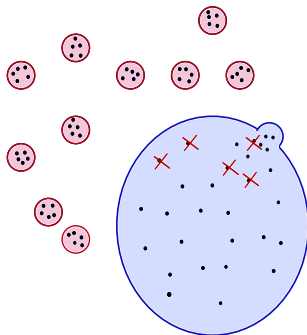
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Large populations

Lambert & Ma, "The coalescent in peripatric metapopulations", *J Appl Prob* (2015)

Proposition (Lambert & Ma (2015))

As $N \rightarrow \infty$, $\varepsilon_N \rightarrow 0$ and $\varepsilon_N N \rightarrow \infty$,

$$\varepsilon_N \xi_N(t) \longrightarrow x(t), \quad \text{where} \quad \dot{x} = \theta + \beta x - \gamma x^\alpha,$$

As $t \rightarrow \infty$,

$$x(t) \longrightarrow \kappa = \kappa(\alpha, \beta, \gamma, \theta), \quad \text{where} \quad \theta + \beta \kappa - \gamma \kappa^\alpha = 0.$$

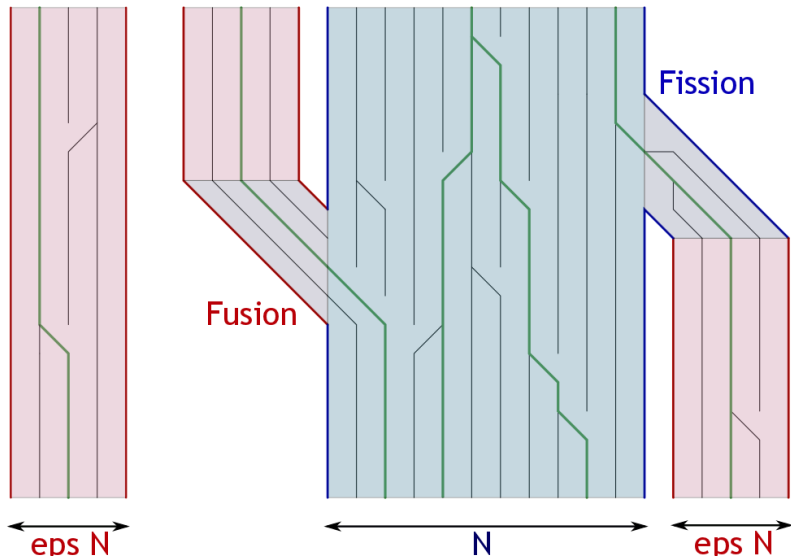
- ▶ Total number of colonies at eq = $\varepsilon_N \xi_N \approx \kappa / \varepsilon_N \ll \kappa N$
- ▶ Total number of individuals in colonies at eq = $\varepsilon_N N \xi_N \approx \kappa N$
- ▶ Fraction of biomass in main pop eq = $N / (N + (\varepsilon_N N) \xi_N) \approx 1 / (1 + \kappa)$

$$\text{Total fission rate (gain of colonies)} \approx \frac{1}{N} \times \frac{\theta + \beta \kappa}{\varepsilon_N}$$

$$\text{Total fusion rate (loss of colonies)} \approx \frac{1}{N} \times \frac{\gamma \kappa^\alpha}{\varepsilon_N}$$

(equal at equilibrium)

Genealogy of a sample in a dynamic metapopulation



The in/out coalescent

Lambert & Ma, "The coalescent in peripatric metapopulations", *J Appl Prob* (2015)

Theorem (Lambert & Ma (2015))

As $N \rightarrow \infty$, $\varepsilon_N \rightarrow 0$ and $\varepsilon_N N \rightarrow \infty$, the genealogy of a sample at equilibrium only depends on which lineages are

- ▶ *'inner' = in main pop, or*
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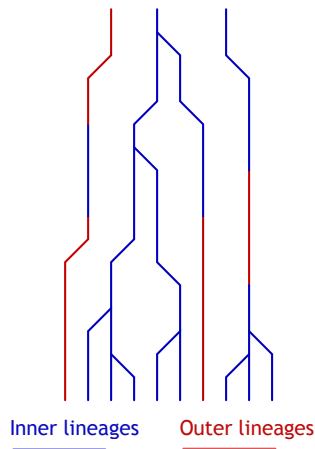
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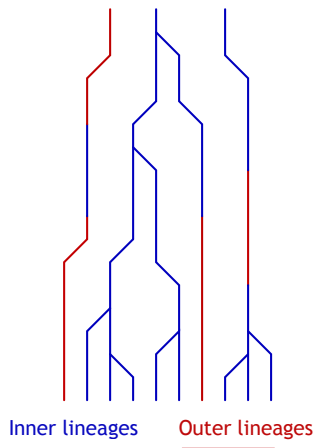
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$$\text{Rate [In} \rightarrow \text{Out]} \approx \frac{\gamma \kappa^\alpha}{\varepsilon_N} \times \frac{\varepsilon_N N}{N + \varepsilon_N N} \approx \gamma \kappa^\alpha$$



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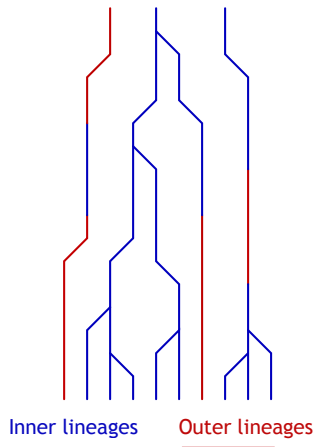
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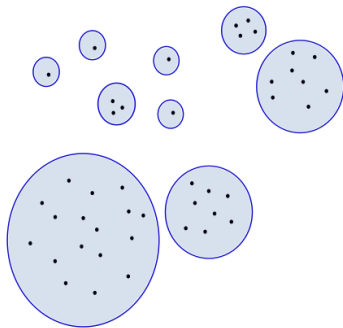
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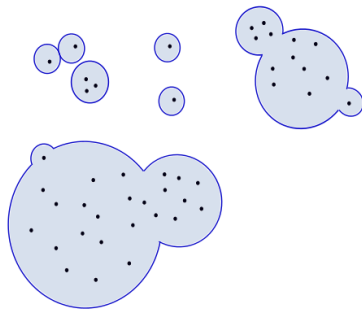
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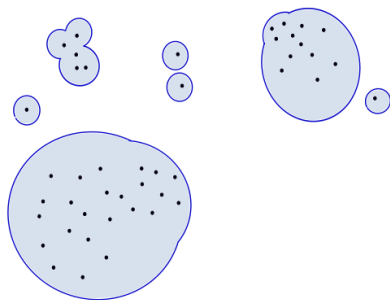
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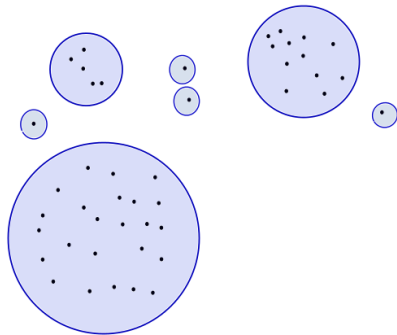
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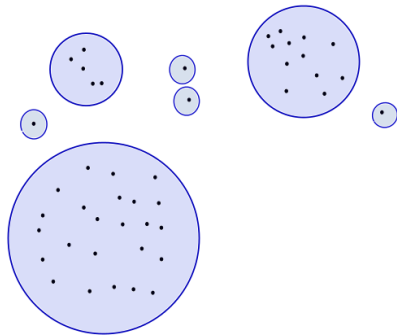
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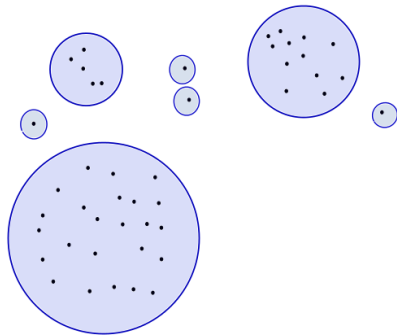
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See for example Blath, González Casanova, Kurt & Wilke-Berenguer, “A new coalescent for seedbank models” *Ann Appl Prob* (2016)

... who show for example that for a sample of n , $T_{MRCA} \asymp \ln \ln(n)$...

⇒ The active/inactive coalescent doesn't come down from infinity but ALMOST :)

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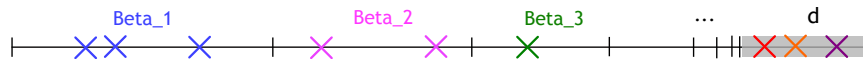
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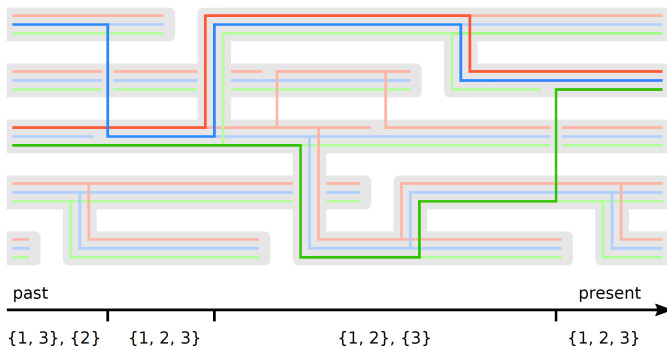


Model 2. Speciation with introgression

(A) Forward time model with N species

- ▶ N monomorphic species, each harboring **one genome of n genes** indexed by $\{1, \dots, n\}$

(B) Backward time : ancestry of 1 sampled genome

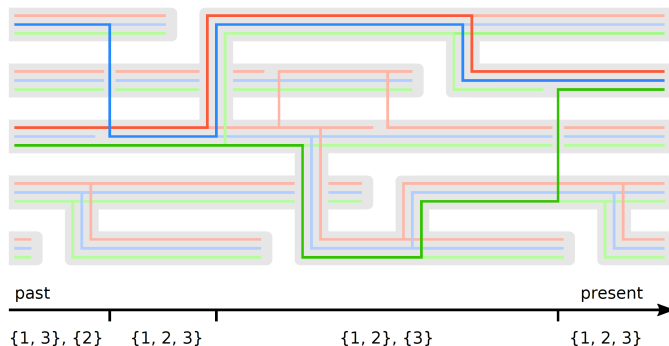


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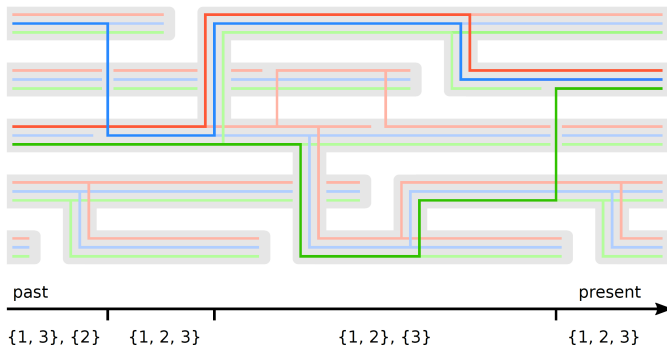


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(B) Backward time : ancestry of 1 sampled genome



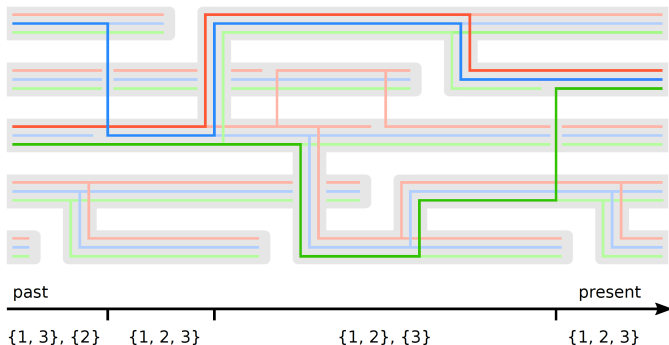
Model 2. Speciation with introgression

(A) Forward time model with N species

- ▶ N monomorphic species, each harboring **one genome of n genes** indexed by $\{1, \dots, n\}$
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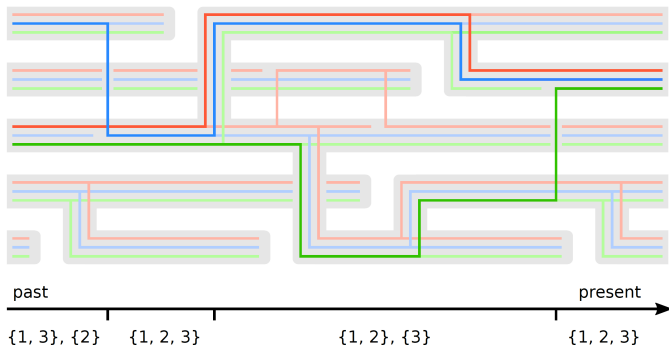
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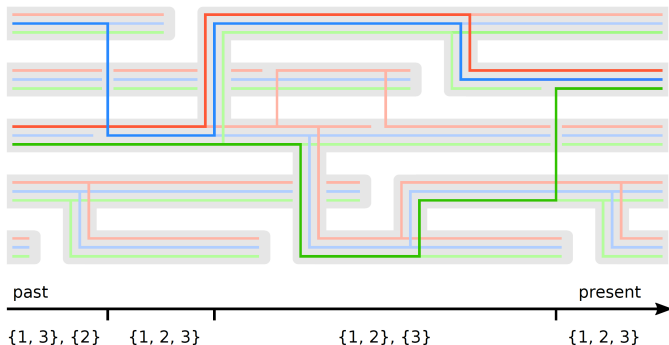
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- ▶ **Erosion** : Each lineage **leaves its block at rate c** and **forms a new singleton**.

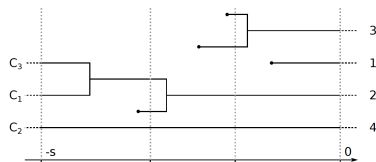
$\Rightarrow \Pi_n(t)$ = **Kingman coalescent with erosion**



The Kingman coalescent with erosion

Foutel-Rodier, Lambert & Schertzer, "Kingman's coalescent with erosion", *EJP* (2020)

- Nb of blocks $\#\Pi_n(t) =$ nb of ancestral species to the sampled genome t time units ago

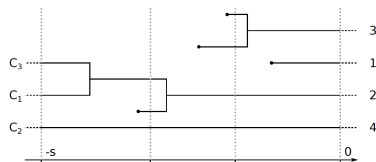


The origin of a block can be traced back to its singletons.
Reversing time, the size of a block is the total progeny of a critical birth-death process

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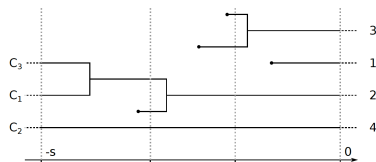


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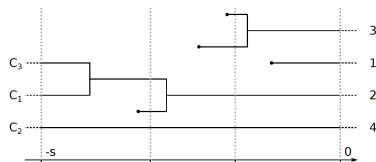


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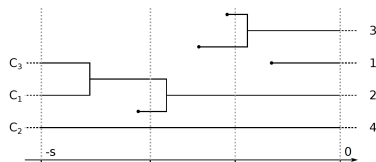


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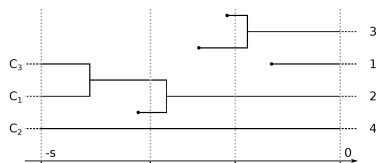


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Theorem (Foutel-Rodier, Lambert & Schertzer (2020))

Set $M_n(k) :=$ nb of blocks of size k in $\Pi_n(t)$ as $t \rightarrow \infty$ and $M_n := \#\Pi_n(\infty) = \sum_k M_n(k)$. Then as $n \rightarrow \infty$, $M_n/\sqrt{n} \rightarrow \sqrt{2c}$ and

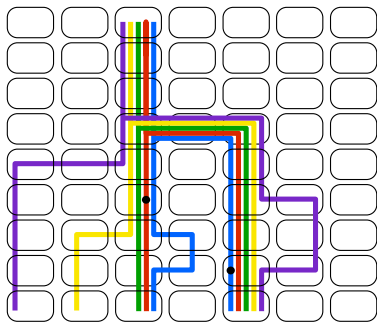
$$\lim_{n \rightarrow \infty} \frac{M_n(k)}{\sqrt{2cn}} = \mathbb{P}(J = k),$$

where J is the total progeny of a critical birth-death process. Also $\Pi_\infty(t)$ has no dust ($d = 0$) and as $t \rightarrow \infty$, its block frequencies (β_j) can be explicitly characterized.

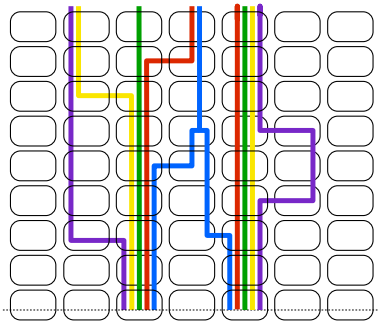
See also Berestycki, J (2004).

Model 3. Gene-based diversification and the notion of co-adaptation

- ▶ In **forward** time, gene lineages accumulate mutations giving rise to new alleles
- ▶ A **new allele** is only **co-adapted** with alleles **present at other loci of the same genome** at that time
- ▶ Separately evolving populations progressively lose co-adaptation of their genomes.
- ▶ In **backward** time, a gene lineage is ancestral to one or several genomes of the sample
- ▶ Two non-homologous gene lineages are **co-adapted** iff they are **both ancestral to one common genome**
- ▶ In backward time, co-adaptation increases as coalescences occur.



Coadaptation in forward time :
New alleles are co-adapted with genomic background



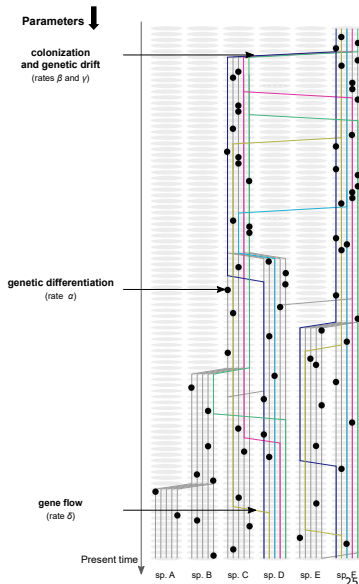
Coadaptation in backward time :
Lineages ancestral to the same genome are co-adapted

Model 3. Gene-based diversification (Forward)

Marin, Achaz, Crombach & Lambert "The genomic view of diversification", *J Evol Biol* 2020

- ▶ Genomes **accumulate mutations** at rate α per lineage

GBD-forward model

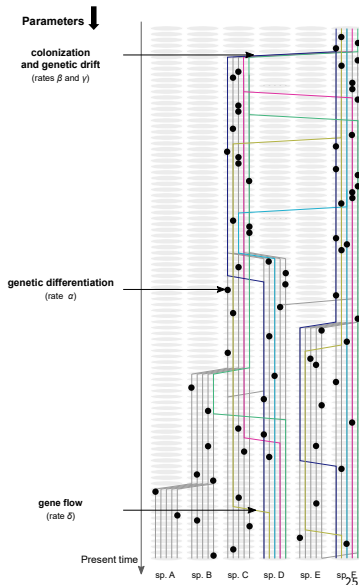


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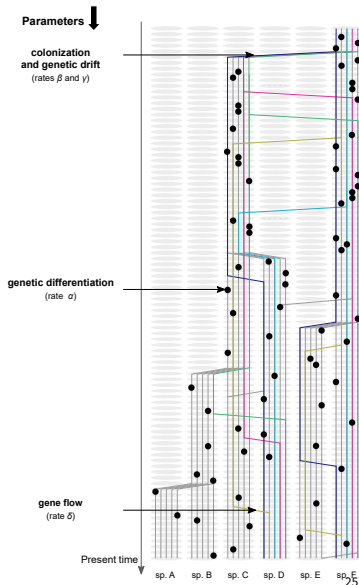


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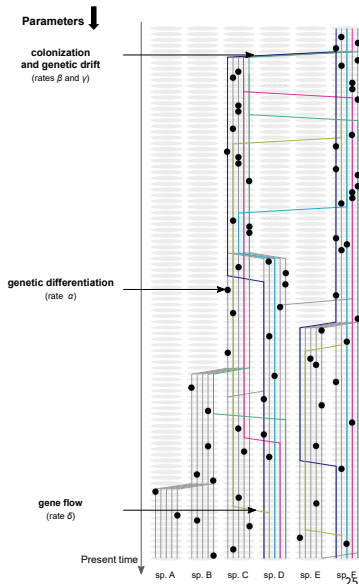


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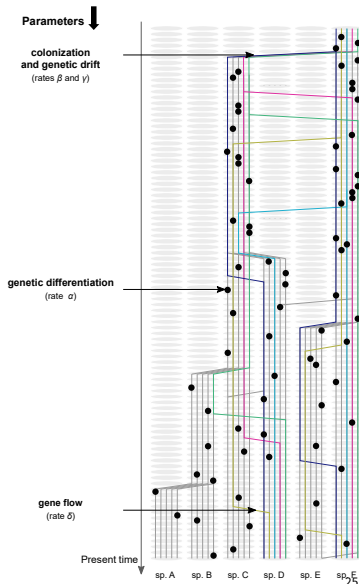


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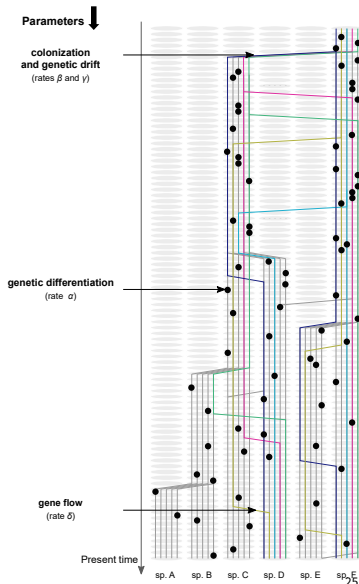


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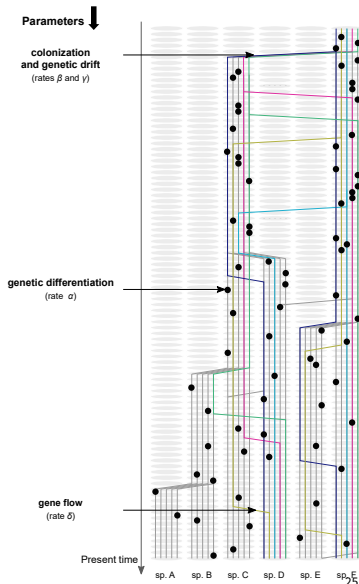


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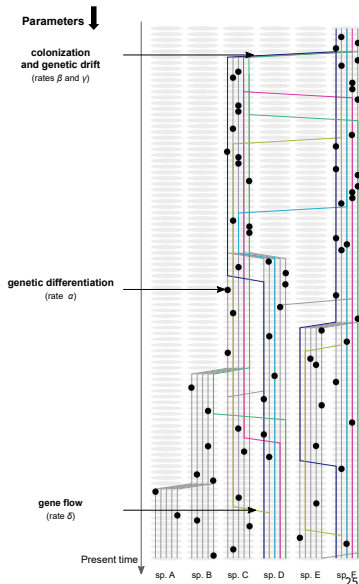


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- ▶ BUT **prohibitively slow** for simulation or inference.

GBD-forward model



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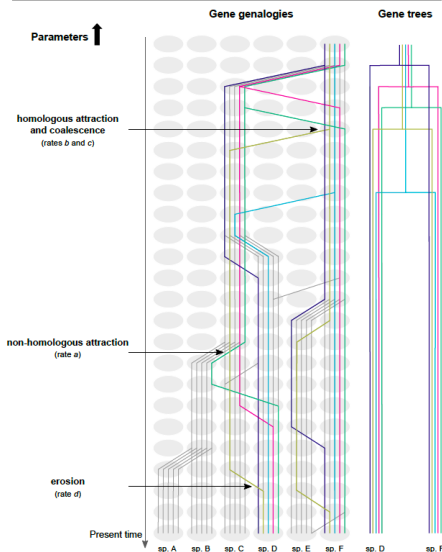
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- Rate a : Non-homologous attraction **between co-adapted gene lineages**

...Tunes the **timescale of gene flow**

Large a $\Rightarrow$ Most gene lineages concentrated in one or two species

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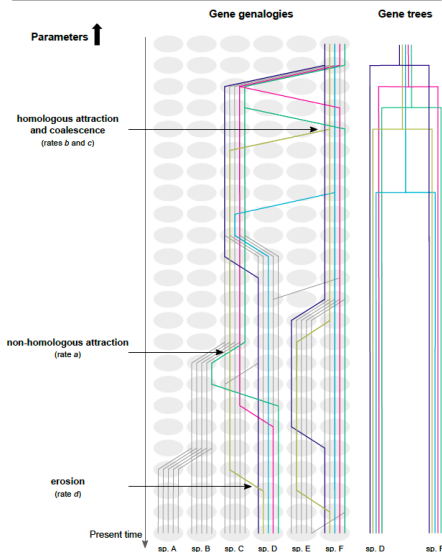
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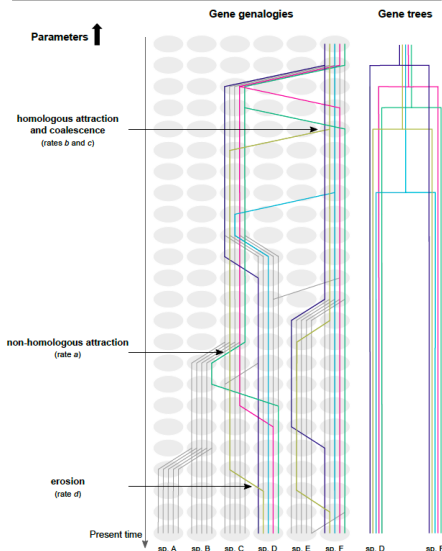
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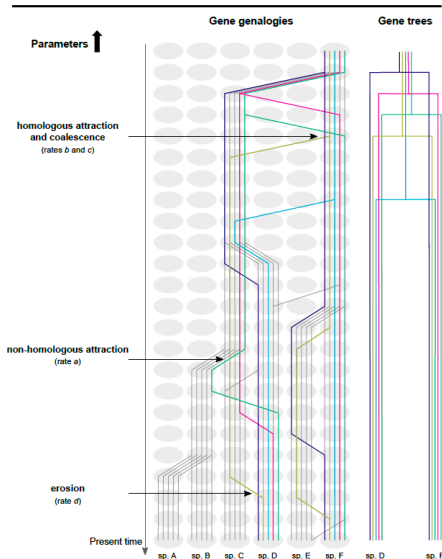


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- ▶ Rate ***d*** : Erosion
...Tunes the **number of pops exchanging genes**
Large *d* $\Rightarrow$ Many ancestral species

GBD-backward model



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Marin, Achaz, Crombach & Lambert “The genomic view of diversification”, *J Evol Biol* (2020)

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 - ▶ No dust + block frequencies given by the **Poisson-Dirichlet** distribution obtained by re-ordering $(\beta_j)_{j \geq 1}$ defined as

$$\beta_j := Z_j \prod_{i=1}^{j-1} (1 - Z_i),$$

where the (Z_i) are i.i.d. with density $\theta(1 - z)^{\theta-1}$.

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 - ▶ Nb of ancestral species to n genes $\#\Pi_n(\infty) \sim \theta \ln(n)$
 - ▶ Few ancestral species containing k genes $\sim \frac{\theta}{k}$
 - ▶ No dust + block frequencies given by the **Poisson-Dirichlet** distribution obtained by re-ordering $(\beta_j)_{j \geq 1}$ defined as

$$\beta_j := Z_j \prod_{i=1}^{j-1} (1 - Z_i),$$

where the (Z_i) are i.i.d. with density $\theta(1 - z)^{\theta-1}$.

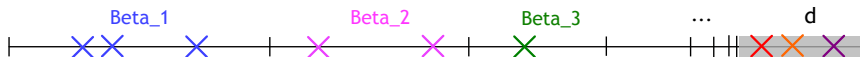
Properties of the GBD backward model

Marin, Achaz, Crombach & Lambert "The genomic view of diversification", *J Evol Biol* (2020)

- ▶ Coalescent-based, fast to simulate
- ▶ Plastic : can incorporate time-inhomogeneity, gene-specific rates...
- ▶ Sampling-consistent
- ▶ Ancestral configuration of **one single genome** $\Pi_n(t)$
 - ▶ Non-homologous attraction = pairs of blocks with masses $(j, k) \rightarrow (j - 1, k + 1)$ at rate ajk
 - ▶ Erosion = block with mass $j \rightarrow (j - 1, 1)$ at rate dj
 - ▶ = Moran model with **resampling rate** a and **mutation rate** d .
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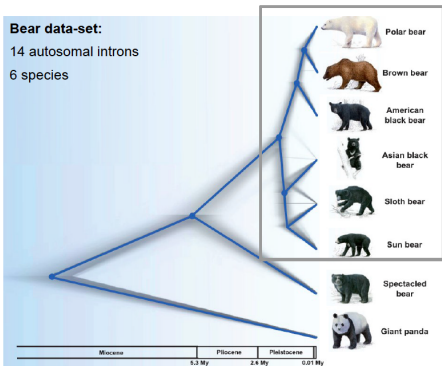
Bear and Finch datasets

Kutschera et al 14, Kumar et al 17, Farrington et al 14

Bear data-set:

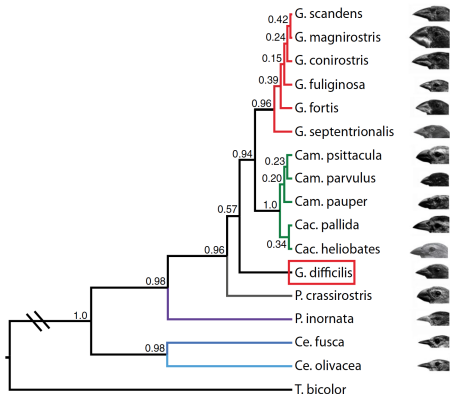
14 autosomal introns

6 species



Kutschera et al MBE 14

Bears = 6 species, 14 loci



Farrington et al Evolution 14

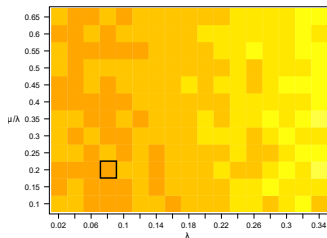
Finches = 6 species, 7 loci

ABC on Bear and Finch datasets

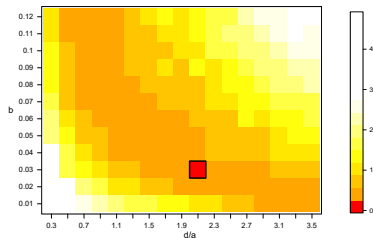
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Bear data-set

Multi-species coalescent (MSC) model

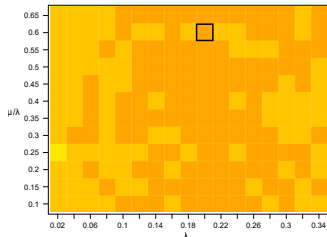


Gene-based diversification (GBD) model

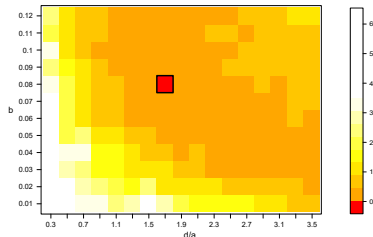


Finch data-set

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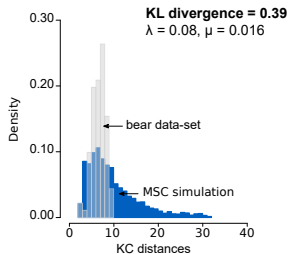


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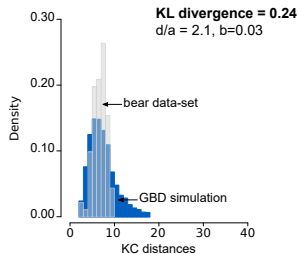
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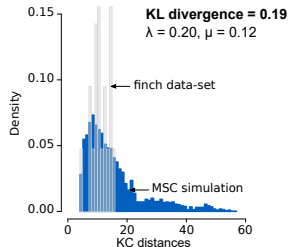


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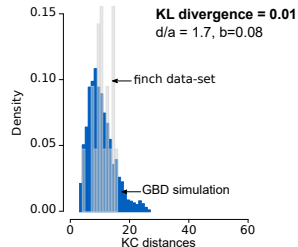


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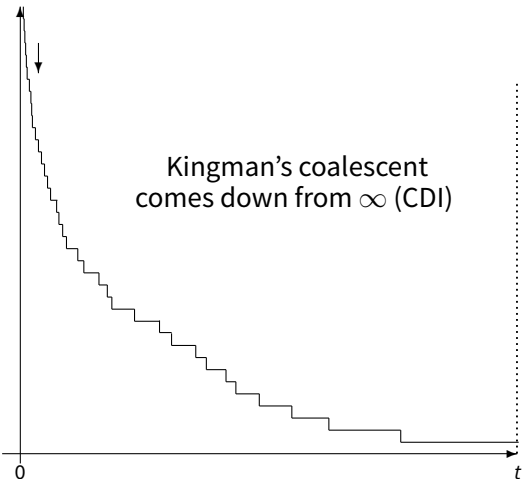
Outline

1. Introduction
2. Nested coalescents generalizing the MSC
3. Model 1. Dynamic spatial structure
4. Two models allowing for gene flow
- 5. Applications**
6. References

How does Kingman's coalescent CDI?

CDI = come down from infinity

Kingman's coalescent
comes down from ∞ (CDI)



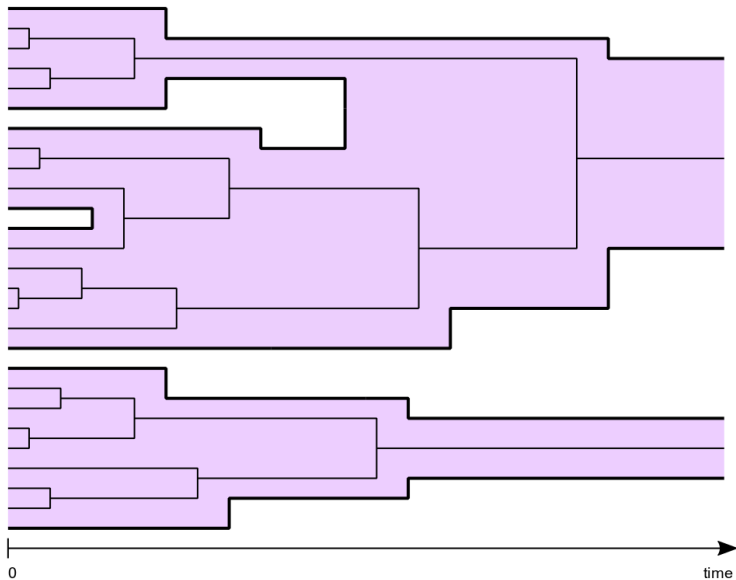
- ▶ The process K_t counting the number of blocks in Kingman's coalescent is a **pure-death process** going from k to $k - 1$ at rate $\binom{k}{2}$
- ▶ Under $\mathbb{P}_\infty$, K_t behaves like the solution to $\dot{x} = -\frac{x^2}{2}$ starting at ∞ , equal to

$$x(t) = \frac{2}{t}$$

i.e.

$$\mathbb{P}_\infty(tK_t \rightarrow 2) = 1.$$

Kingman in Kingman



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- ▶ Then the **Λ -coalescent CDI** iff

$$[\text{Grey's condition}] \quad \int_{\lambda_0}^{\infty} \frac{dx}{\psi(x)} < \infty.$$

and then it behaves at time 0^+ like $\dot{x} = -\psi(x)$ starting at ∞ .

Schweinsberg (2000), Berestycki, Berestycki & Limic (2010)

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The coagulation-transport PDE

- The **transport equation** with velocity $-\psi$

$$\partial_t d(t, x) = \partial_x(\psi d)(t, x) \quad t, x \geq 0$$

describes the evolution of the concentration $d(t, x)$ of particles with mass x at time t , where particles **spontaneously lose mass** as in the ODE $\dot{x} = -\psi(x)$.

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describes the evolution of the concentration $d(t, x)$ of particles which lose mass as in the ODE $\dot{x} = -\psi(x)$ and **gain mass by pairwise coagulation at rate a** .

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Note : $d \star d(t, x) = \int_0^x d(t, x-y)d(t, y) dy$ denotes the convolution product.

∞ species with at least one gene (each)

Lambert & Schertzer, "Coagulation-transport equations and the nested coalescents", *Probability Theory & Related Fields* 2020

- Let $S(t) := \# \text{ species}$, $\Pi^i(t) := \# \text{ genes}$ or **mass** of the i -th species

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Theorem (Lambert & Schertzer (2020))

Under these conditions, $(G_n(t/n); t \geq 0)$ converges to **the unique solution** of the **coagulation-transport equation**

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- ▶ Solution starts at δ_∞ and ends at δ_0 .
- ▶ Uniqueness of solution holds under the sole condition that $\limsup_{t \downarrow 0} \int_y^\infty d(t, x) dx > 0$ for some y : starting at ∞ many species does not require tuning initial number of genes: species coalescences dominate gene coalescences so as to generate initial condition.

CDI of the nested Kingman coalescent

see also Blancas, Rogers, Schweinsberg & Siri-Jégousse (2018)

- For $\psi(x) = cx^\gamma$ ($\gamma > 1$) and $a(t) = 1/t$, if Υ is the rv with density $d(1, \cdot)$, then $d(t, \cdot)$ is the density of

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- ▶ In other words

$$\lim_{t \downarrow 0} t^2 \rho(t) = 2\mathbb{E}(\Upsilon).$$

Collaborators

Jean-Jil DUCHAMPS*, Airam BLANCAS & Arno SIRI-JÉGOUSSE



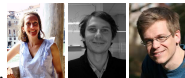
Chunhua MA* (Nankin U)



Félix FOUTEL-RODIER* & Emmanuel SCHERTZER*



Julie MARIN*, Guillaume ACHAZ* & Anton CROMBACH



Emmanuel SCHERTZER*



*= members or former members of SMILE.

SMILE : An interdisciplinary group in Paris

Below : SMILE members in May 2020



COLLÈGE
DE FRANCE
—1530—



Jasmine 12/01



François 15/01



Guillaume T. 25/02



Pete 29/03



Emmanuel 18/04



Laura 21/05



Jean-Jil 24/05



Felix 05/09



Rob 16/09



Julie 21/09



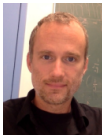
Elise 10/10



Léo 07/11



Guillaume A. 09/12



Amaury 16/12



Philibert 30/12



Alejandro



SMILE = **S**tochastic **M**odels for the **I**nfERENCE of **L**ife **E**volution

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2. Nested coalescents generalizing the MSC
3. Model 1. Dynamic spatial structure
4. Two models allowing for gene flow
5. Applications
6. References

Books and monographs

- ▶ Gascuel, O. (Ed) (2005) *Mathematics of evolution and phylogeny*
- ▶ Steel, M. (2016) *Phylogeny : Discrete and random processes in evolution*
- ▶ Scornavacca, C., Delsuc, F., Galtier, N. (Eds) (2019) *Phylogenetics in the genomic era*
- ▶ Balding, D., Moltke, I., Marioni, J. (Eds) (2019) *Handbook of statistical genomics*
- ▶ Anisimova, M. (Eds) (2019) *Evolutionary genomics – statistical and computational methods*

Papers

- ▶ Schweinsberg, “A necessary and sufficient condition for the Λ -coalescent to come down from infinity”, *Elec Comm Prob* (2000)
- ▶ Berestycki, “Exchangeable fragmentation-coalescence processes and their equilibrium measures”, *Elec J Prob* (2004)
- ▶ Berestycki, Berestycki & Limic, “The Λ -coalescent speed of coming down from infinity”, *Ann Probab* (2010)
- ▶ Puillandre, Lambert, Brouillet, Achaz, “ABGD, Automatic Barcode Gap Discovery for primary species delimitation” *Mol Ecol* (2012)
- ▶ Lambert & Ma, “The coalescent in peripatric metapopulations”, *J Appl Prob* (2015)
- ▶ Blancas, Duchamps, Lambert & Siri-Jégousse, “Trees within trees : Simple nested coalescents”, *Elec J Prob* (2018)
- ▶ Blancas, Rogers, Schweinsberg & Siri-Jégousse, “The nested Kingman coalescent : Speed of coming down from infinity”, *Ann Appl Prob* (2019)
- ▶ Duchamps, “Trees within trees II : Nested fragmentations”, *Ann Inst H Poincaré Probab Stat* (2020)
- ▶ Foutel-Rodier, Lambert & Schertzer, “Kingman’s coalescent with erosion”, *Elec J Prob* (2020)
- ▶ Marin, Achaz, Crombach & Lambert, “The genomic view of diversification”, *J Evol Biol* (2020)
- ▶ Lambert & Schertzer, “Coagulation-transport equations and the nested coalescents”, *Probab Theory & Related Fields* (2020)

Comparing qualitative behavior of GBD Forward/GBD Backward

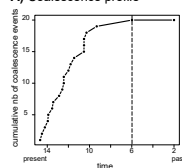
Marin, Achaz, Crombach & Lambert "The genomic view of diversification", *J Evol Biol* (2020)

- ★ 2 species sampled at present time
 - ★ 1 genome with 20 homologous genes per species
 - ★ GBD-forward : $a = 2, d = 6$
 - ★ GBD backward : $\alpha = 0.1, \delta = 0.06$
- As time goes backward, we count...

A) # Pairs of homologous gene lineages having coalesced :

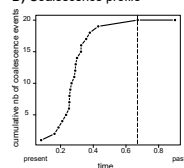
GBD Forward

A) Coalescence profile



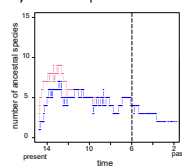
GBD Backward

D) Coalescence profile

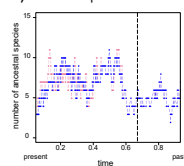


B) # Species ancestral to either present-day species :

B) Ancestral species number

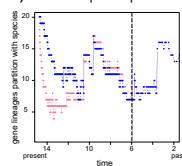


E) Ancestral species number

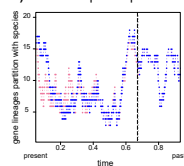


C) # Gene lineages in main ancestral species :

C) Ancestral species partition



F) Ancestral species partition

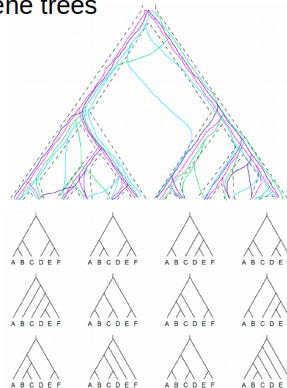


ABC on distribution of pairwise distances between gene trees

Marin, Achaz, Crombach & Lambert “The genomic view of diversification”, *J Evol Biol* (2020)

- ▶ Simulate or infer gene trees
- ▶ Compute (BHV or KC) **distance between each pair of gene trees**
(Billera-Holmes-Vogtmann 05, Kendall-Colijn 16)
- ▶ Compare **distribution of pairwise distances** via Kullback-Leibler divergence to simulations w parameters (a, b, d)
- ▶ **Minimize** KL divergence in parameter space
- ▶ Recall parameters :
 - a tunes timescale of gene flow,
 - b tunes timescale of reproductive isolation,
 - d tunes # ancestral species.

Mosaic of gene trees

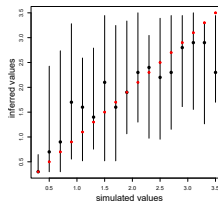


ABC on distribution of pairwise distances between gene trees

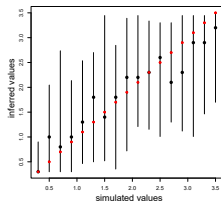
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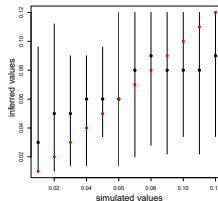
A) Inferences on d/a
BHV distances



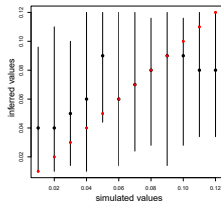
KC distances



B) Inferences on b
BHV distances



KC distances



$O(n)$ species with $O(n)$ genes (each)

Lambert & Schertzer, "Coagulation-transport equations and the nested coalescents", *Probability Theory & Related Fields* (2020)

- Let $S_n(t) := \# \text{ species}$, $\Pi_n^i(t) := \# \text{ genes}$ or **mass** of the i -th species,

$$G_n(t) := \frac{1}{S_n(t)} \sum_{i=1}^{S_n(t)} \delta_{\Pi_n^i(t)/n}.$$

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- ▶ Then $n^{-1} S_n(t/n) \rightarrow 2a(t)$, where $a(t) = \frac{1}{t+\delta}$ with $\delta = \frac{2}{r}$

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Theorem (Lambert & Schertzer 2020)

If $G_n(0) \implies \nu$, then $(G_n(t/n); t \geq 0)$ converges to **the unique solution** of the **coagulation-transport equation**

$$(\star) \quad \partial_t d(t, x) = \partial_x (\psi d)(t, x) + a(t) (d \star d(t, x) - d(t, x)) \quad t, x \geq 0$$

with initial condition $d(0, x) dx = \nu(dx)$.

weak solutions

Call $f : [0, \infty) \rightarrow \mathbb{R}$ a **test-function** if f is C^1 , and f and $\psi f'$ are bounded.

For d solution of

$$(\star) \quad \partial_t d(t, x) = \partial_x(\psi d)(t, x) + a(t) (d \star d(t, x) - d(t, x)) \quad t, x \geq 0$$

Set $\mu_t(dx) = d(t, x) dx$ and $\mu_t(f) = \int_{\mathbb{R}^+} f(x) \mu_t(dx)$.

Assuming that d is a **probability density** and integrating by parts, we get

$$\partial_t(\mu_t(f)) = -\mu_t(\psi f') + a(t)(\mu_t \star \mu_t(f) - \mu_t(f)).$$

weak solutions

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Definition

A probability-valued process $(\mu_t; t \geq 0)$ is a **weak solution of $(\star)$** with initial condition ν if for every test-function f and every $t \geq 0$:

$$\mu_t(f) = \nu(f) - \int_0^t \mu_s(\psi f') ds + \int_0^t a(s)(\mu_s \star \mu_s(f) - \mu_s(f)) ds \quad t \geq 0.$$

Definition

A probability-valued process $(\mu_t; t \geq 0)$ is a **McKean–Vlasov (MK-V) solution of $(\star)$** with initial condition ν if there exists a process $(x_t; t \geq 0)$ such that $\mu_t = \mathcal{L}(x_t)$ and

$$dx_t = -\psi(x_t) dt + v_t \Delta J_t, \quad \mathcal{L}(x_0) = \nu$$

where J is an inhomogeneous Poisson process with rate $a(t)$ at time t , and $(v_t; t \geq 0)$ is a sequence of independent rvs with $\mathcal{L}(v_t) = \mathcal{L}(x_t)$.

Definition

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Proposition

If $(\mu_t; t \geq 0)$ is a **MK–V solution of $(\star)$** with initial condition ν , then it is a **weak solution of $(\star)$** with initial condition ν .

Proof : For every test-function f , take cond expectation of following eq (Itô) :

$$df(x_t) = -f'(x_{t-})\psi(x_{t-}) dt + (f(x_{t-} + v_t) - f(x_{t-})) \Delta J_t.$$

Existence of a MK–V solution	$\implies$	Existence of a weak solution,
Uniqueness of the weak solution	$\implies$	Uniqueness of the MK–V solution.

construction of a MK-V solution

- ▶ Remark 1. **Zooming on** (or conditional sampling) the **Kingman coalescent** gives the **Brownian coalescent point process** (CPP) :

Lambert & Schertzer, “Recovering the Brownian coalescent point process from the Kingman coalescent by conditional sampling”, *Bernoulli* (2019).

- ▶ Remark 2. The Brownian CPP has node depths given by a PPP with intensity $d\ell t^{-2}dt$ = **leftmost lineage** branches at rate $t^{-2} / \int_t^\infty s^{-2}ds = 1/t$

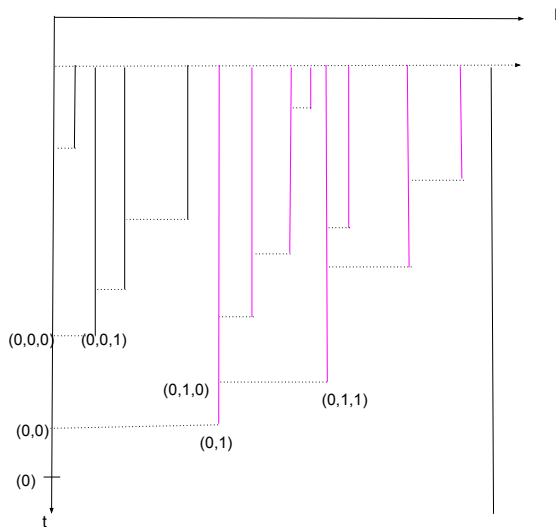
- ▶ Recall that $\mu_t = \mathcal{L}(x_t)$ is a MK-V solution of $(\star)$ with initial cond ν if

$$dx_t = -\psi(x_t) dt + v_t \Delta J_t, \quad \mathcal{L}(x_0) = \nu$$

where J jumps at rate $1/(t + \delta)$ and $\mathcal{L}(v_t) = \mathcal{L}(x_t)$.

Brownian Coalescent Point Process

Node depths form a Poisson point process with intensity $d\ell t^{-2}dt$



construction of a MK-V solution of $(\star)$

- ▶ Assume $\psi(0) = 0$ and ψ nondecreasing.
- ▶ Let $\mathbb{t}$ be a **plane, binary tree** embedded in time, leaves at time 0.
- ▶ Mark leaf i with a positive real number W_i
- ▶ Let each mark decrease with time as $\dot{x} = -\psi(x)$
- ▶ When two branches coalesce, **add the two marks**
- ▶ Let $X_t(\mathbb{t}, (W_i)) :=$ **value of mark on leftmost branch** at depth t .

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Theorem

If the (W_i) are iid $\sim \nu$ and $\mathbb{t}$ is a CPP with intensity $d\ell(t + \delta)^{-2}dt$, then $(X_t(\mathbb{t}, (W_i)); t \geq 0)$ is a MK-V solution to $(\star)$.

construction of a MK-V solution of $(\star)$

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In particular, $\mu_t^{(\delta)} := \mathcal{L}(X_t(\mathbb{t}, (W_i)))$ is a weak solution to $(\star)$.

Laplace transform of the weak solution

- ▶ Let $(\mu_t; t \geq 0)$ be a **weak** solution to $(\star)$ and set

$$u(t, \lambda) := \int_{[0, \infty)} e^{-\lambda x} \mu_t(dx).$$

- ▶ Whenever ψ is of type (Λ) , including $\psi(x) = cx^\gamma$ for $\gamma \in (1, 2]$, u is solution to

$$(L) \quad \partial_t u = Au + a(t)(u^2 - u),$$

where A is the **infinitesimal generator** of a Markov process Z .

- ▶ The process $(Z_t; t \geq 0)$ is a **critical, continuous-state branching process** or **CSBP** with branching mechanism ψ .
- ▶ Under Grey's condition, Z is a.s. absorbed at 0 in finite time.

uniqueness of weak solution to $(\star)$ and $(\star\star)$

- ▶ Let $\mathfrak{t}$ is a pure-birth tree with birth rate $\tilde{a}(t) = a(T - t)$ starting at time 0 and stopped at time T .
- ▶ Let Q_x^T be the law of a branching particle system
 - ▶ starting with one particle with mass x at time 0
 - ▶ each particle follows an edge of $\mathfrak{t}$ and splits into two copies of itself at the next branching time
 - ▶ particle masses evolve like independent copies of Z between nodes of $\mathfrak{t}$
 - ▶ $(Z_t^i; 1 \leq i \leq N_t)$ denote the particle masses at time t

uniqueness of weak solution to $(\star)$ and $(\star\star)$

- ▶ Let $\mathfrak{t}$ is a **pure-birth tree** with birth rate $\tilde{a}(t) = a(T - t)$ starting at time 0 and **stopped at time T** .
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Theorem

Case $(\star)$: The only solution to (L) with $u(0, \lambda) = \int_{[0, \infty)} e^{-\lambda x} \nu(dx)$ is given by

$$u(T, \lambda) = Q_\lambda^T \left(\prod_{i=1}^{N_T} e^{-W_i Z_T^i} \right),$$

where the (W_i) are iid with law ν .

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where the (W_i) are iid with law ν .

Case $(\star\star)$: If now $\int_0^\epsilon a(t) dt = \infty$, under Grey's condition, any **proper** sol to (L) equals

$$u(T, \lambda) = Q_\lambda^T (\mathcal{M}),$$

where $\mathcal{M} := \{\text{all masses become extinct before time } T\}$.

uniqueness of weak solution to $(\star)$ and $(\star\star)$: disintegration formula

- Using the branching property of Z , we can invert the Laplace transform

$$u(T, \lambda) = Q_\lambda^T \left(\exp \left(- \sum_{i=1}^{N_T} W_i Z_T^i \right) \right)$$

- In the case $(\star)$, μ_T is the law (wrt pure-birth tree $\mathfrak{t}$ and the W_i 's) of

$$F(\mathfrak{t}, W_i) = M^{\mathfrak{t}} \left(1 - \exp \left(- \sum_{i=1}^{N_T} W_i Z_T^i \right) \right),$$

where $M^{\mathfrak{t}}$ is the **0-entrance law** of the branching CSBP.

- In the case $(\star\star)$, μ_T is the law (wrt pure-birth tree $\mathfrak{t}$) of

$$F(\mathfrak{t}) = M^{\mathfrak{t}}(\mathcal{M}^c),$$

where $\mathcal{M} := \{\text{all masses become extinct before time } T\}$.

- ▶ We exposed a relation between the **empirical measure** of the **nested coalescent** at small times and a **coagulation-transport equation**.
- ▶ We constructed a finite pop ($\delta > 0$) **McKean–Vlasov solution** using the **Brownian coalescent point process**.
- ▶ Using a **disintegration formula**, we proved that there is at most one ∞ -pop ($\delta = 0$) proper solution under Grey's condition, given by the law of

$$F(\mathbb{t}) = M^{\dagger}(\mathcal{M}^c).$$

open problems

- ▶ Convergence of nested Λ coalescents (not only nested Kingman).
- ▶ Uniqueness of the entrance law at ∞ .
- ▶ What if ψ is not the Laplace exponent of a Lévy process? e.g., $\psi(x) = x^\gamma$ with $\gamma > 2$?
- ▶ Characterization of and convergence to dust solutions.