

Weierstraß-Institut für Angewandte Analysis und Stochastik

BIRS workshop

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work in progress, joint with

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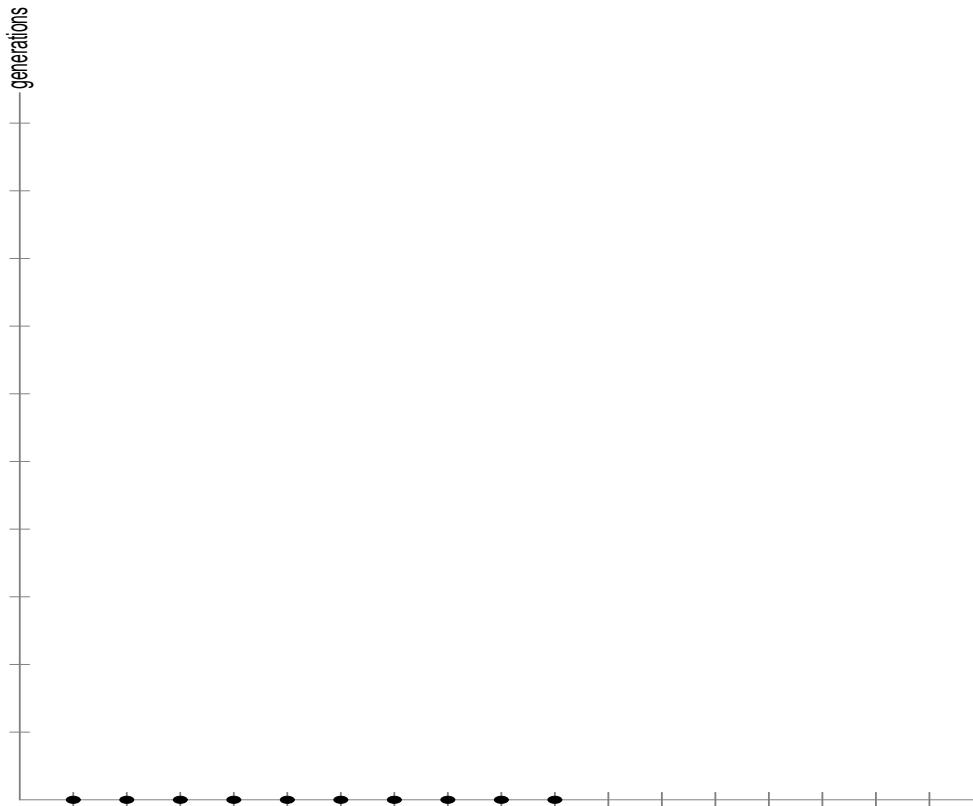
Continuous-mass stable branching and
its resampling counterpart



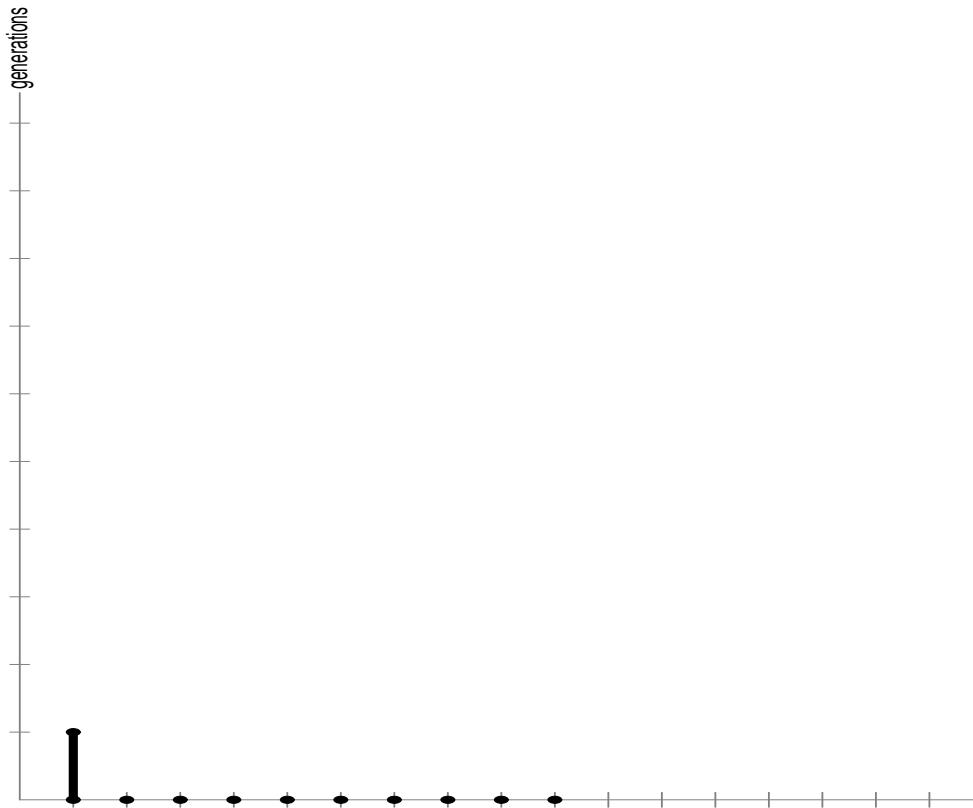
Free branching: Galton-Watson processes

- ▷ individuals have a random number of offspring, independently, according to a fixed probability distribution
- ▷ the totality of offspring forms the next generation
- ▷ da capo ...

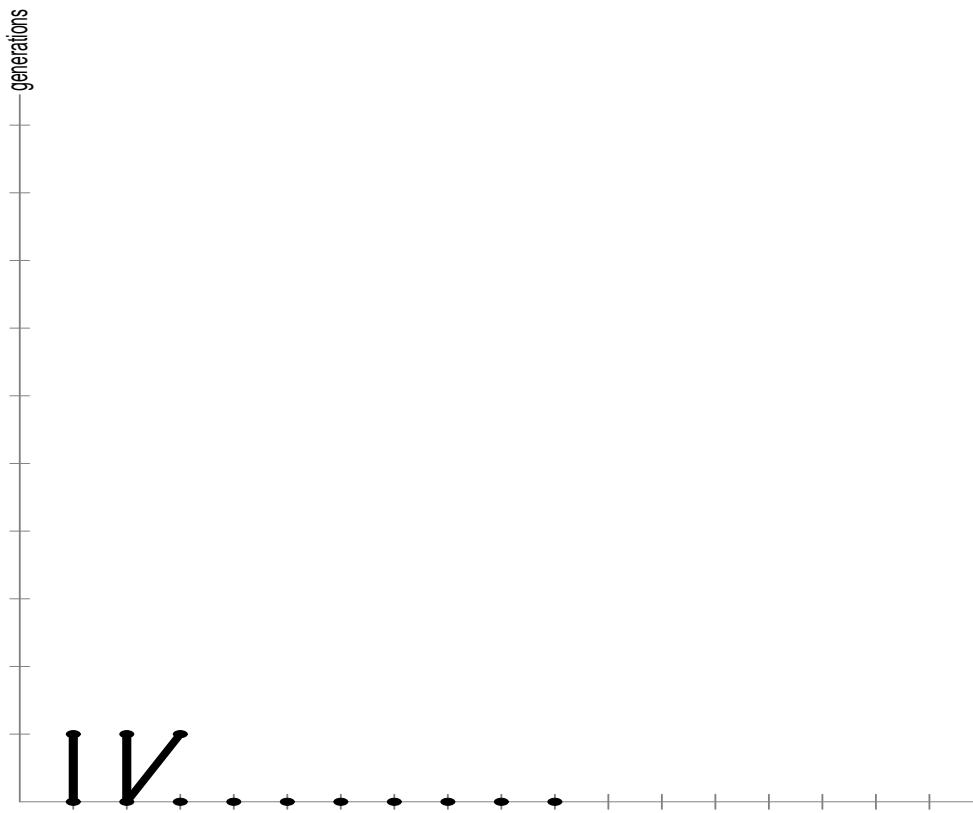
Free branching: Galton-Watson forests



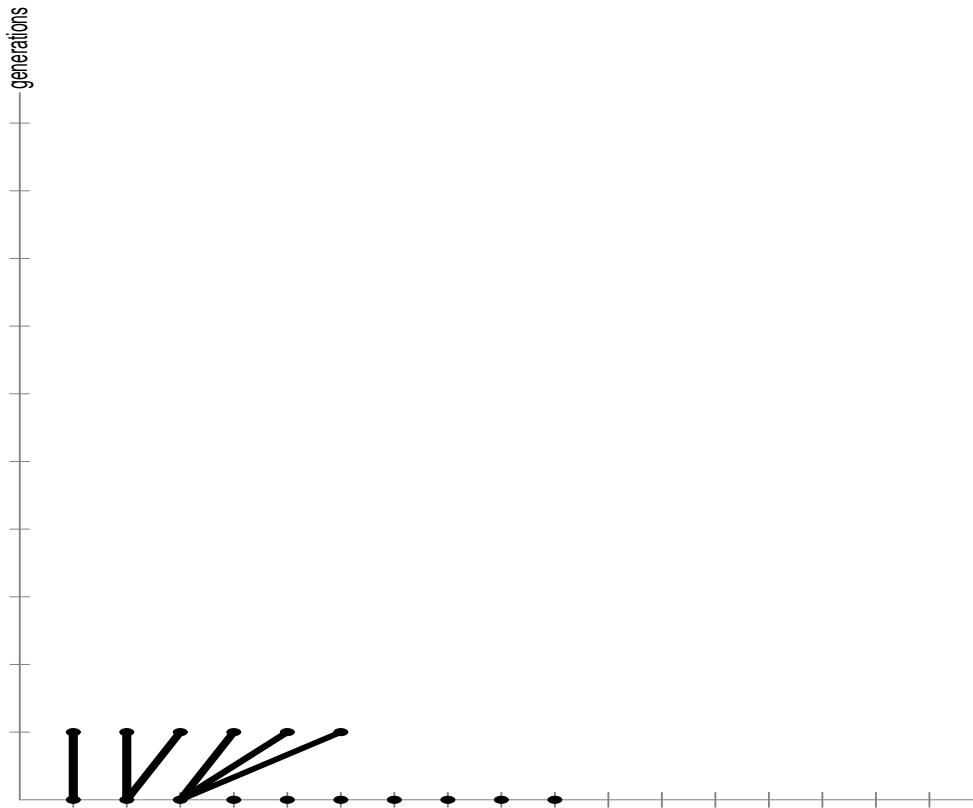
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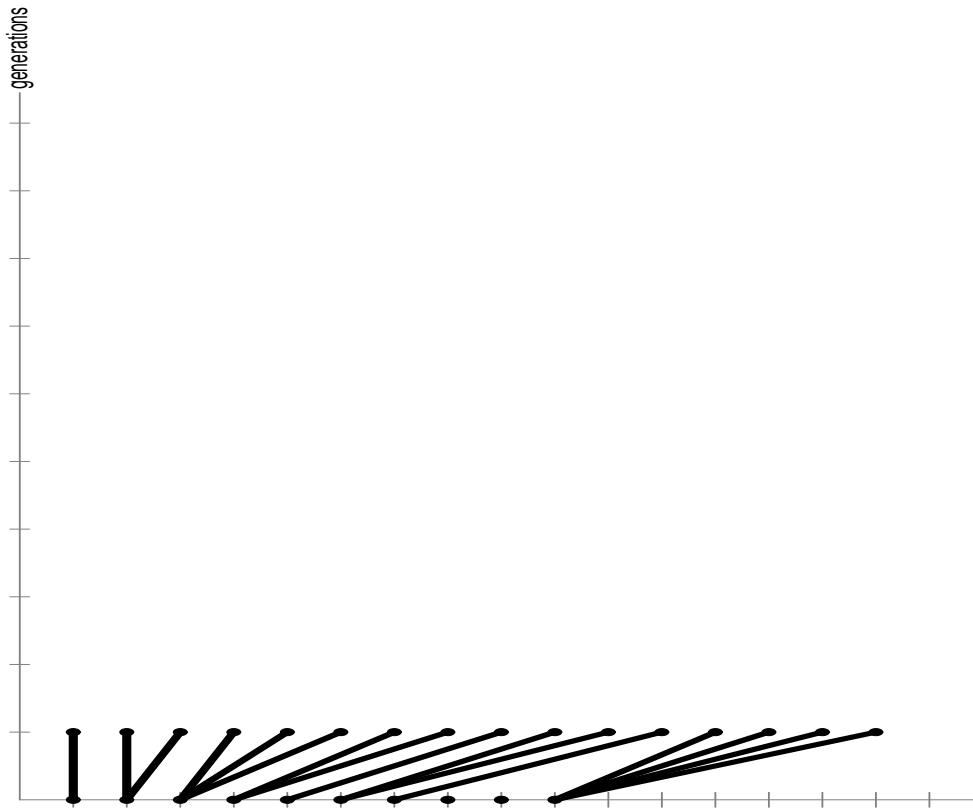
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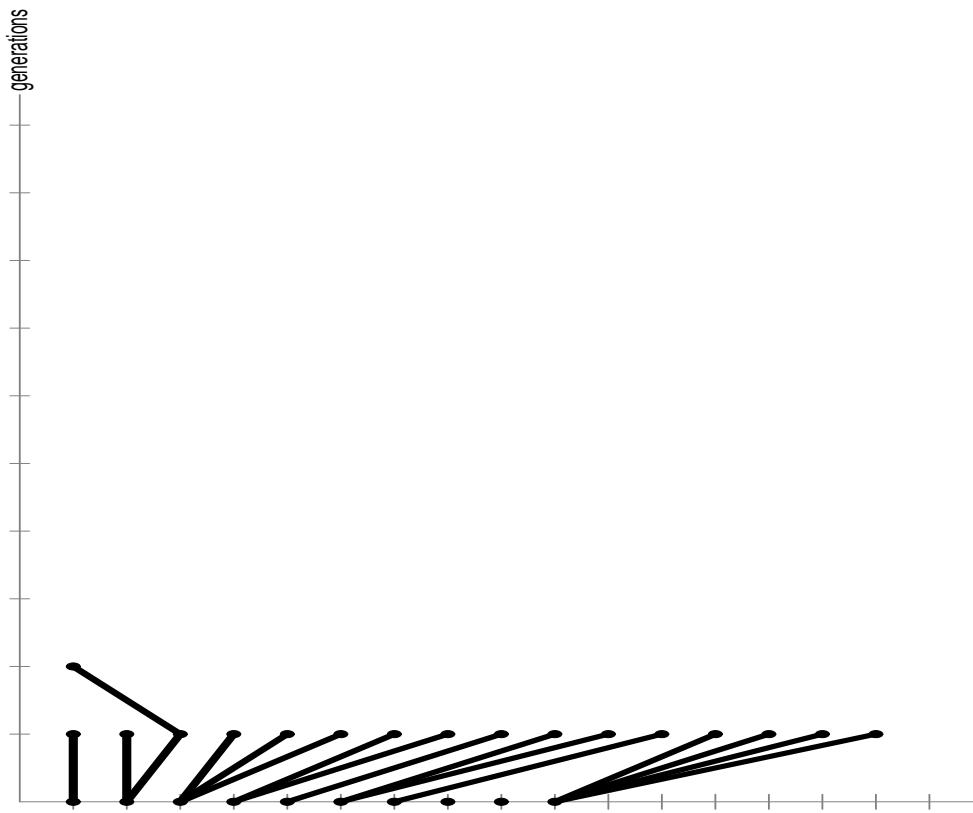
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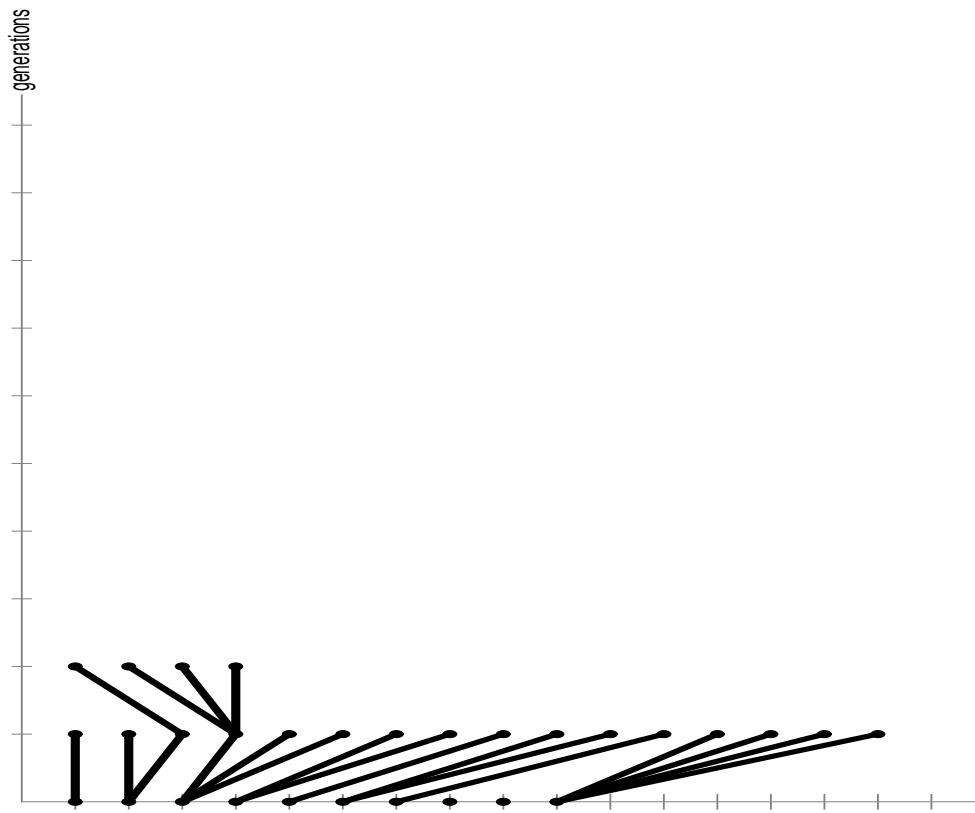
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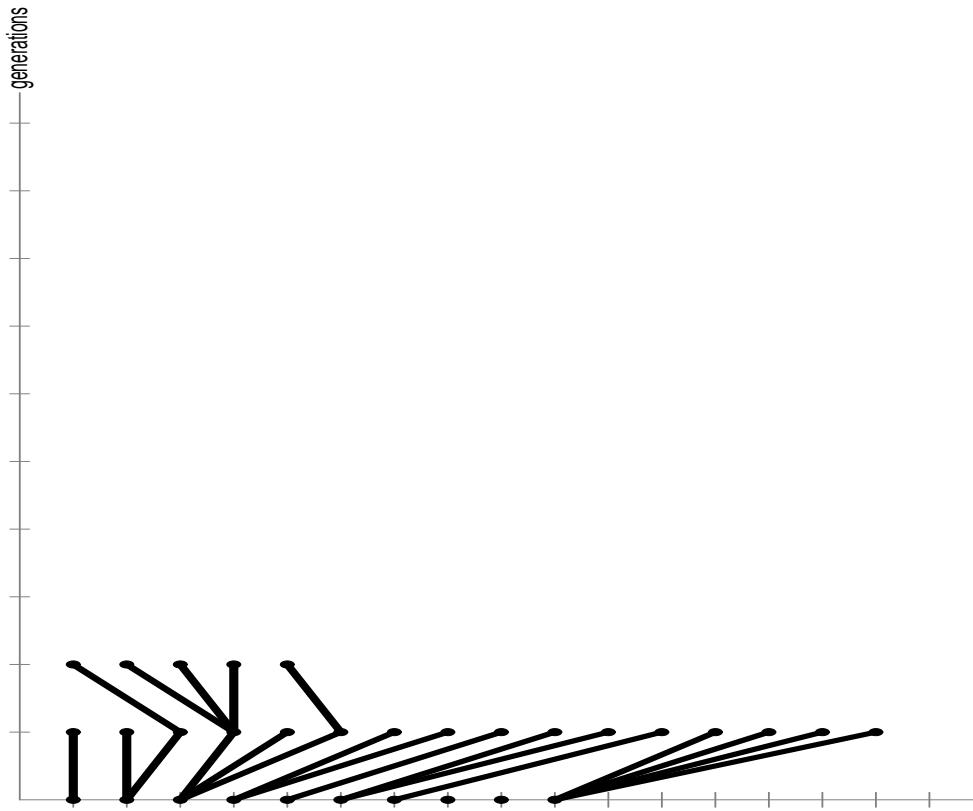
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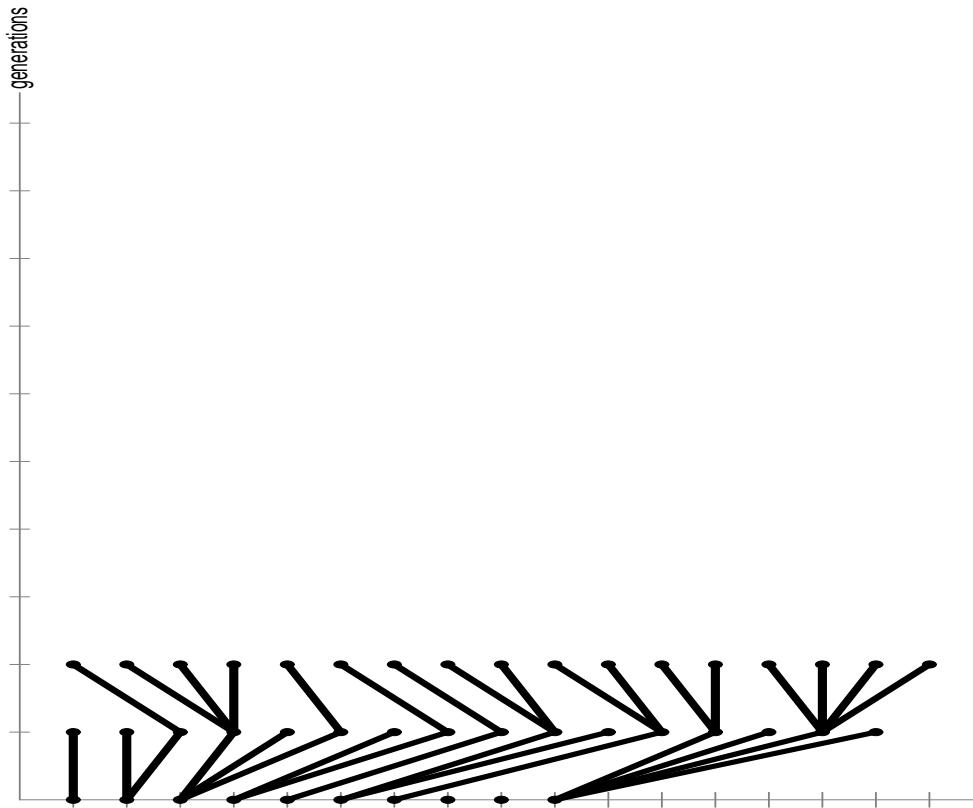
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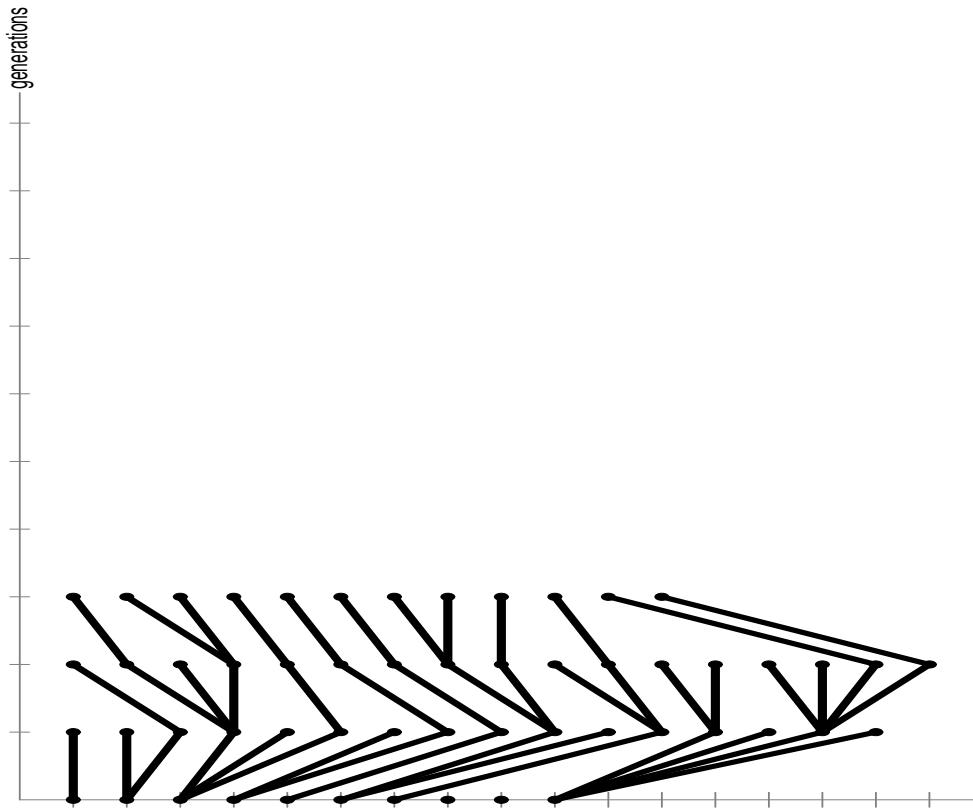
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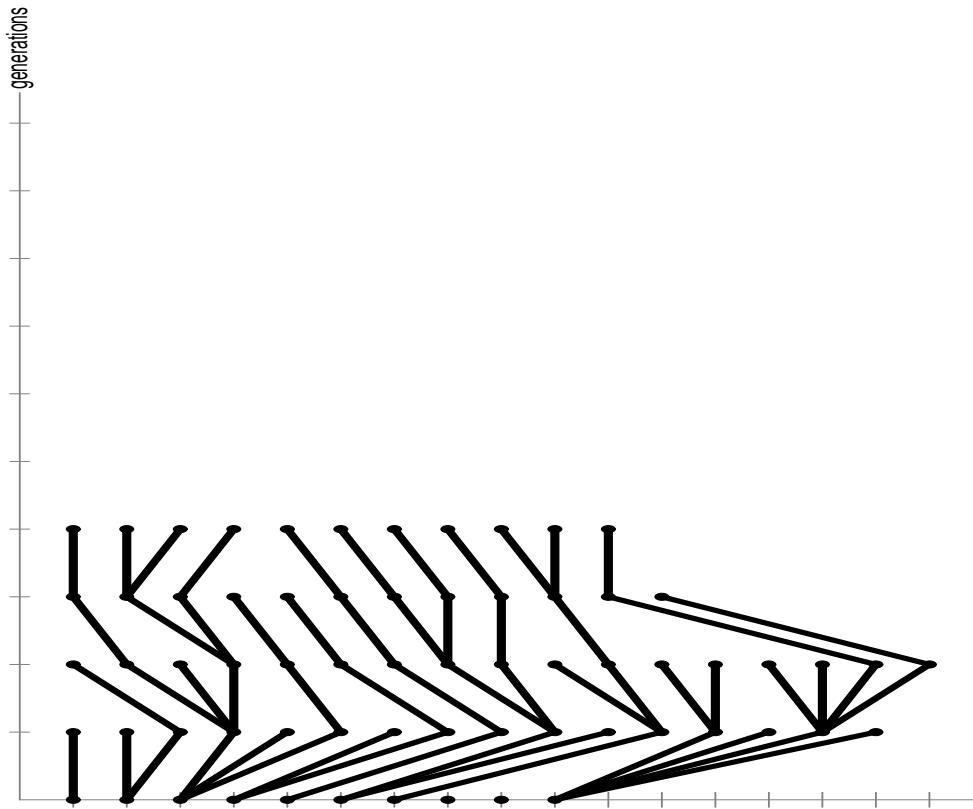
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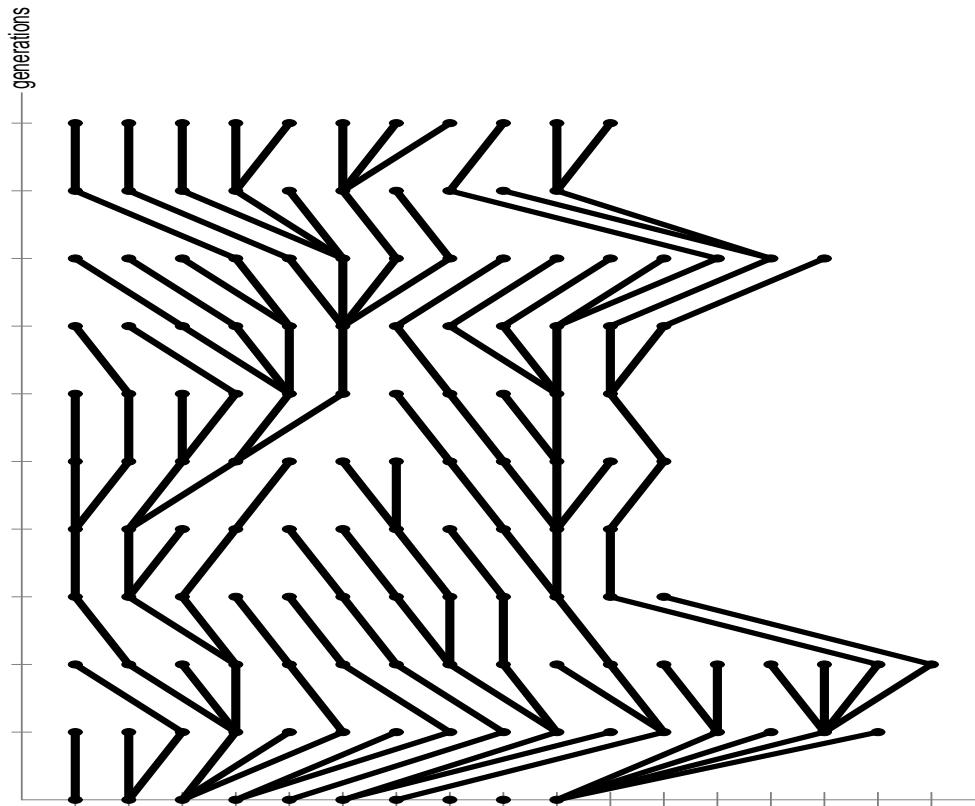
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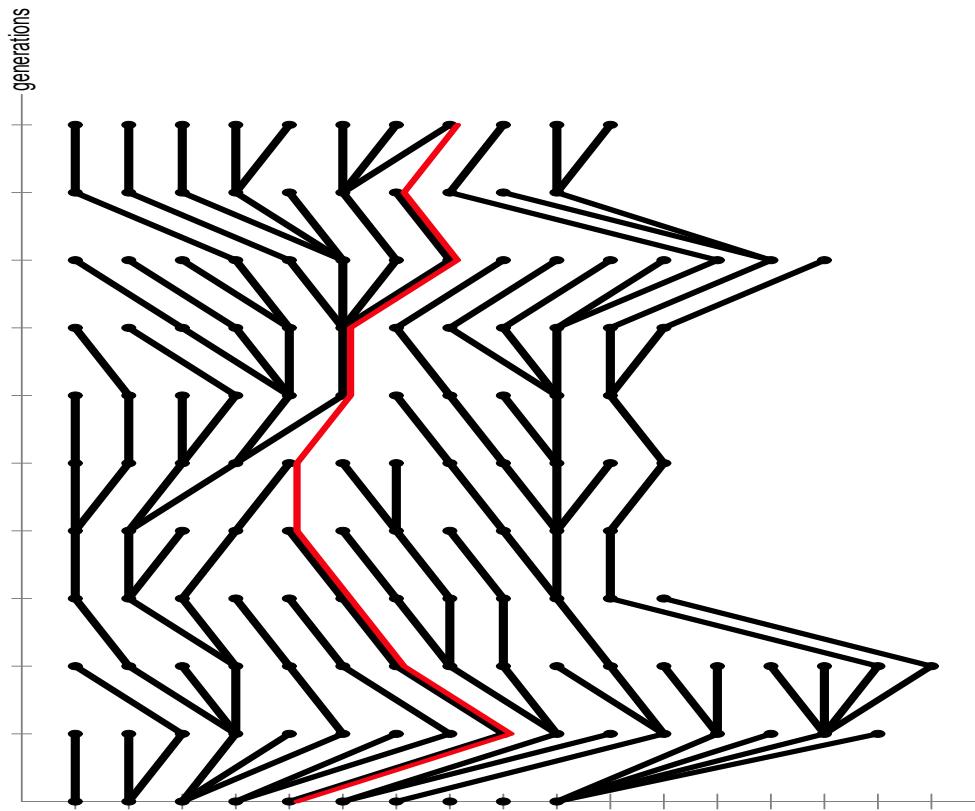
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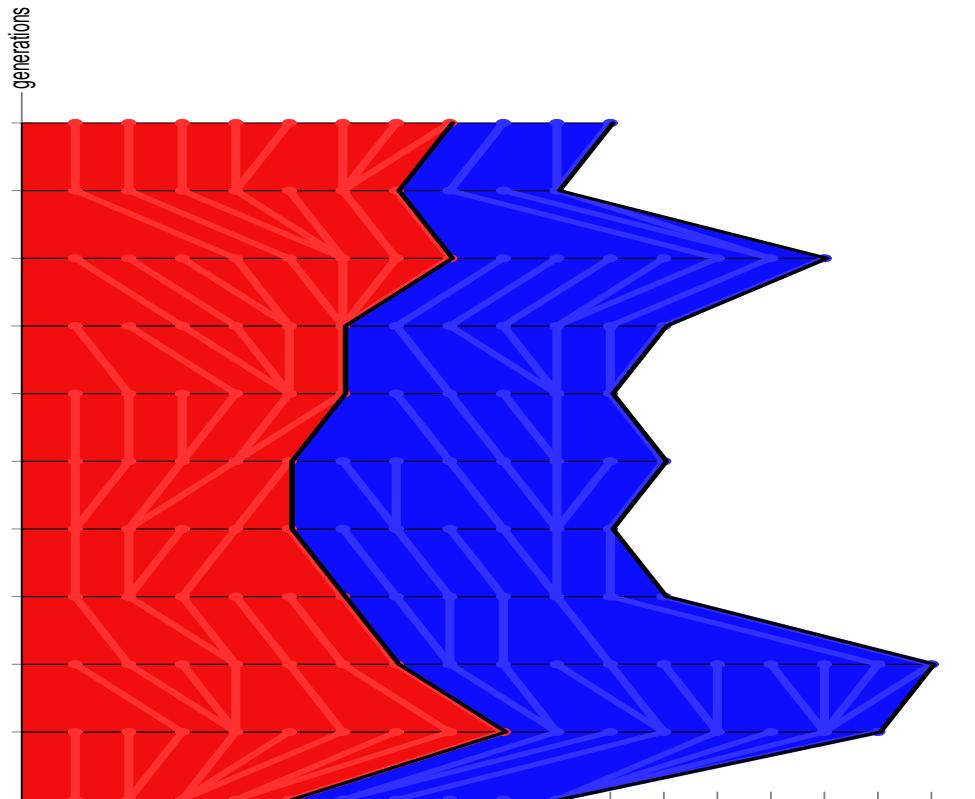


Order the individuals (artificially), let

$$\xi_t(n) := \# \text{ descendants of founders } 1, \dots, n \text{ alive in generation } t .$$

For fixed n , $\xi_t(n)$, $t = 0, 1, 2, \dots$ is a Galton-Watson process with $\xi_0(n) = n$.

Free branching & neutral types



Example: there are 2 neutral types, red and blue.

Fixed population size: Canning's model

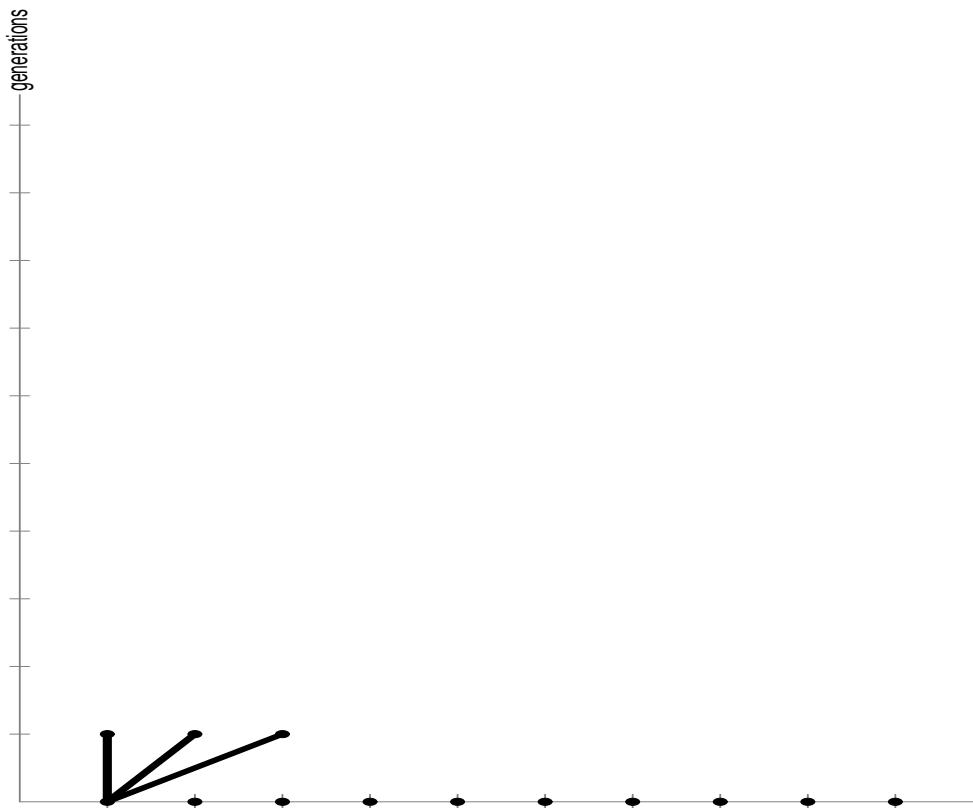
Describes a genealogy:

- ▷ fixed population size N
- ▷ individuals have a random number of offspring,
the offspring numbers (ν_1, \dots, ν_N) are exchangeable with $\sum_{i=1}^N \nu_i = N$
- ▷ the totality of offspring forms the next generation
- ▷ da capo ...

Fixed population size: Canning's model



Fixed population size: Canning's model



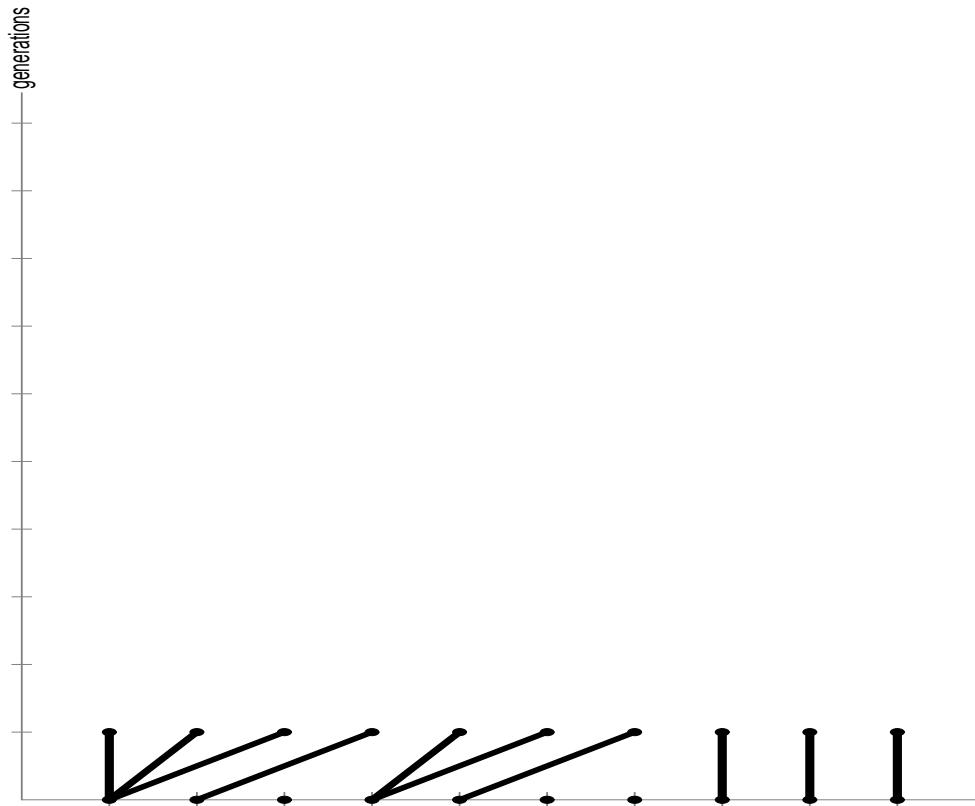
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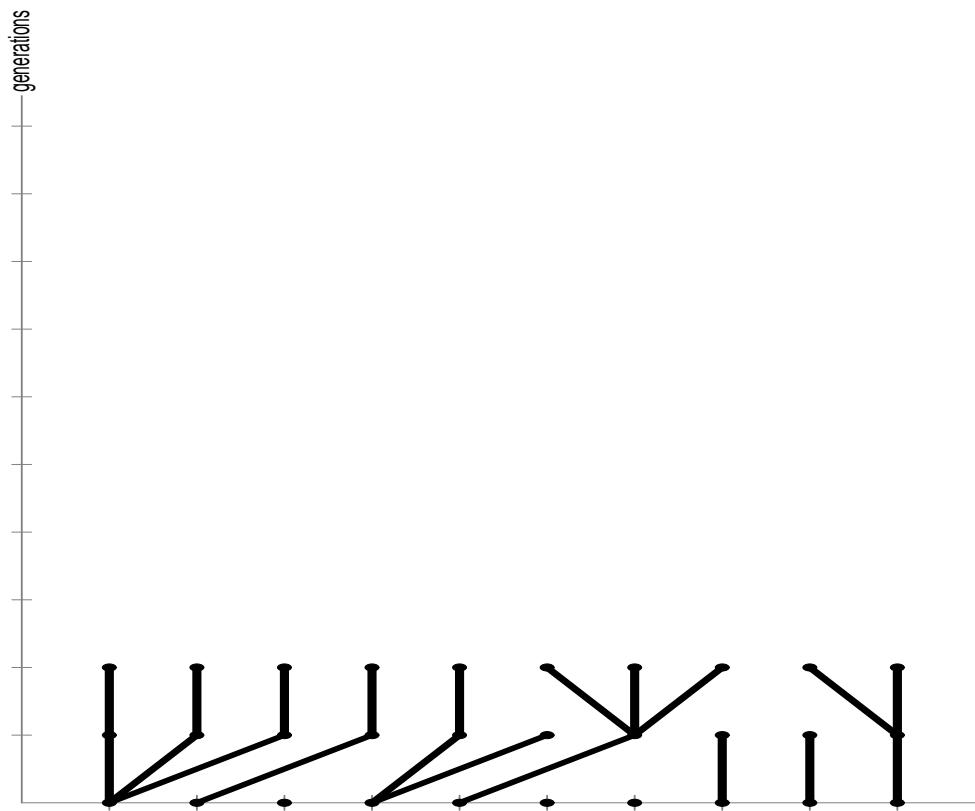
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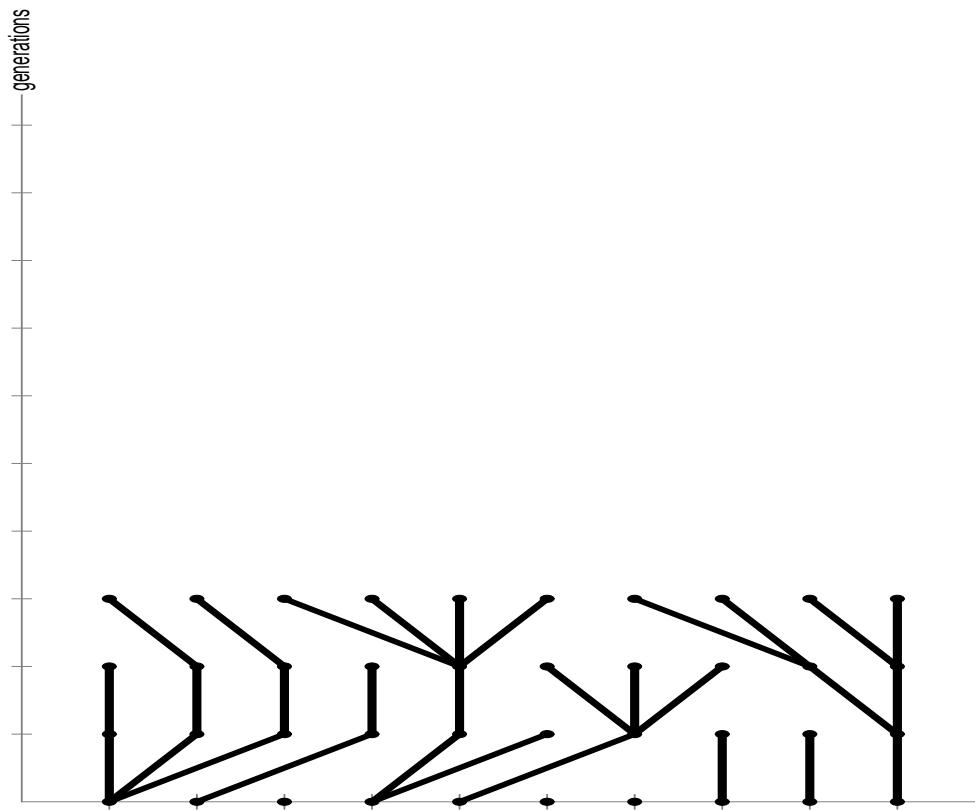
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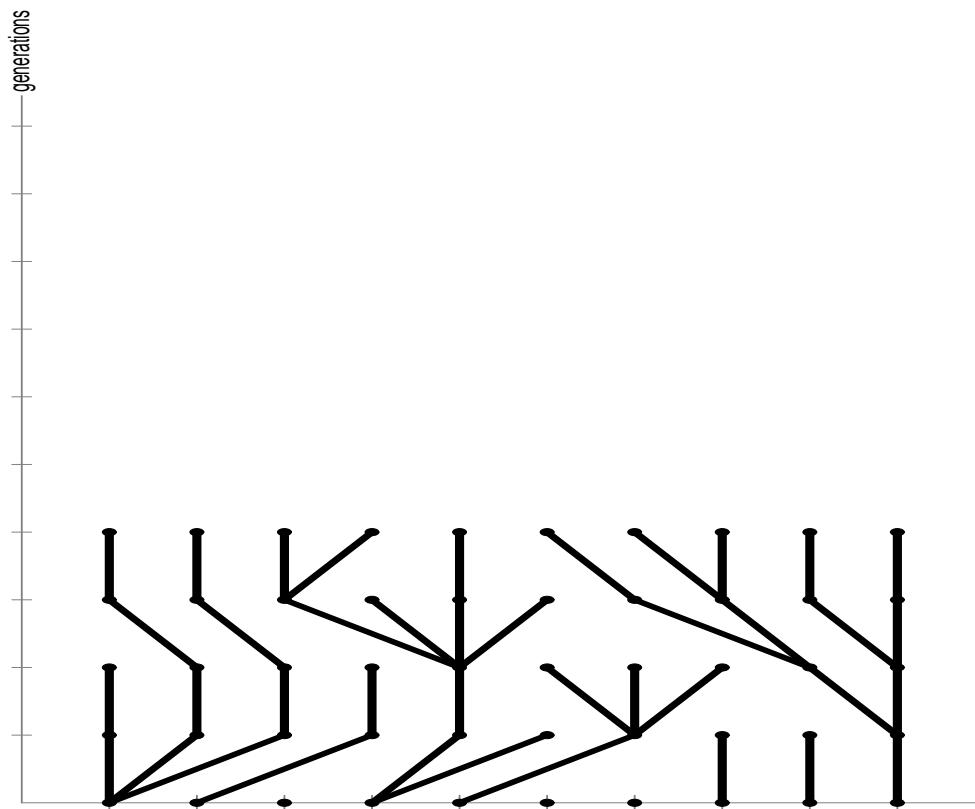
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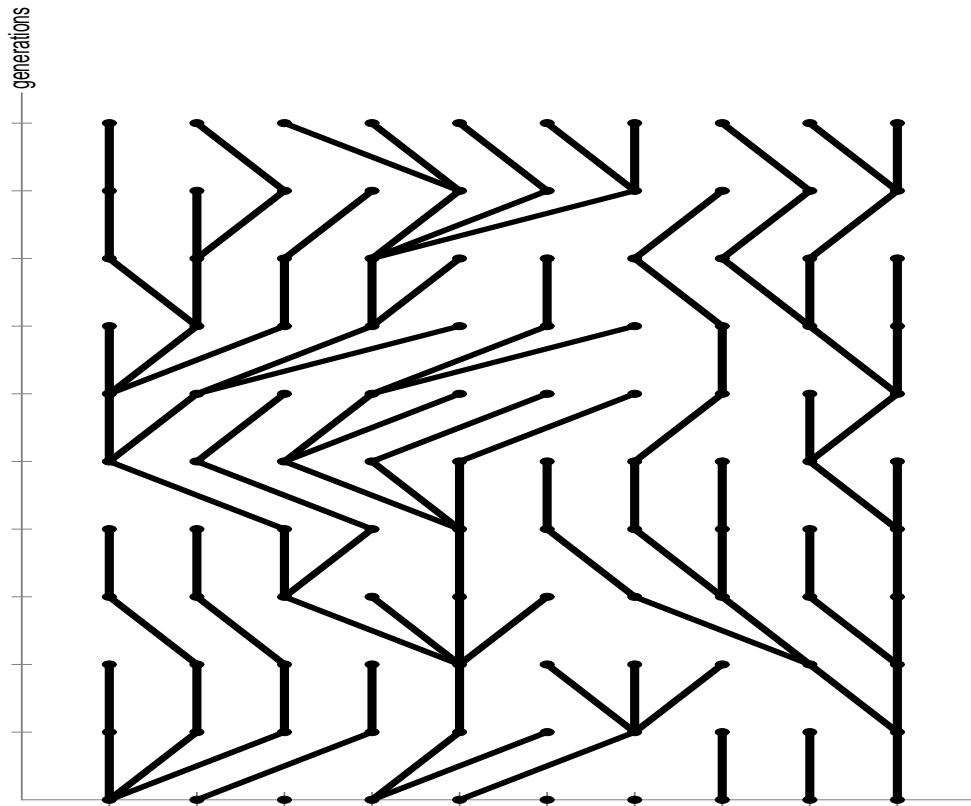
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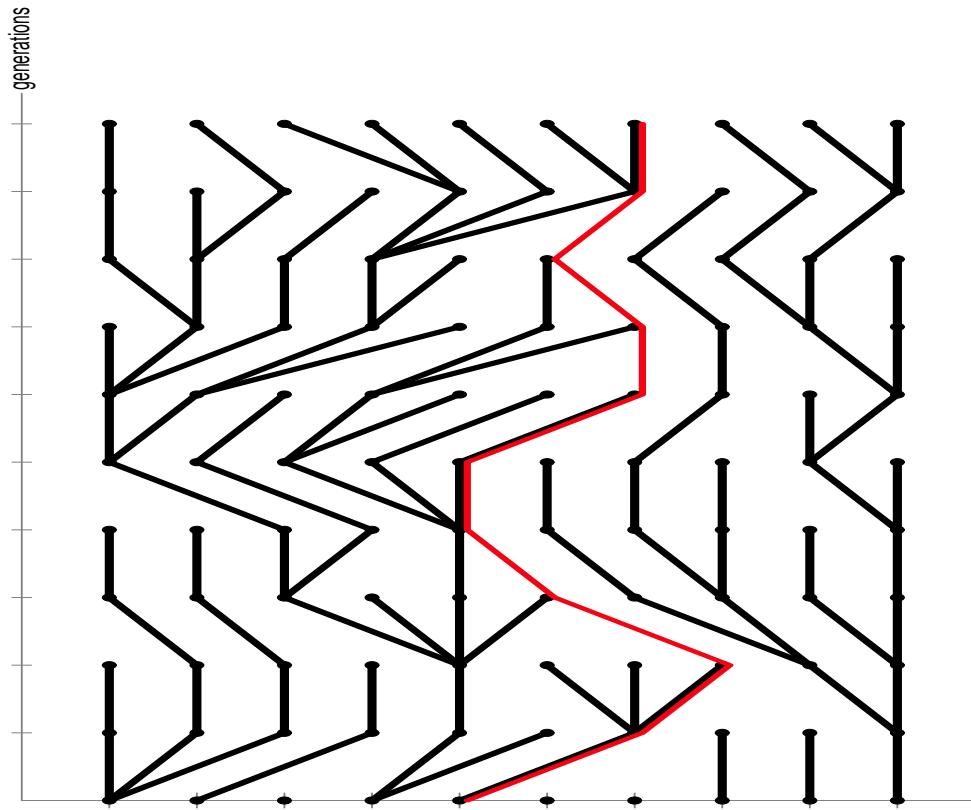
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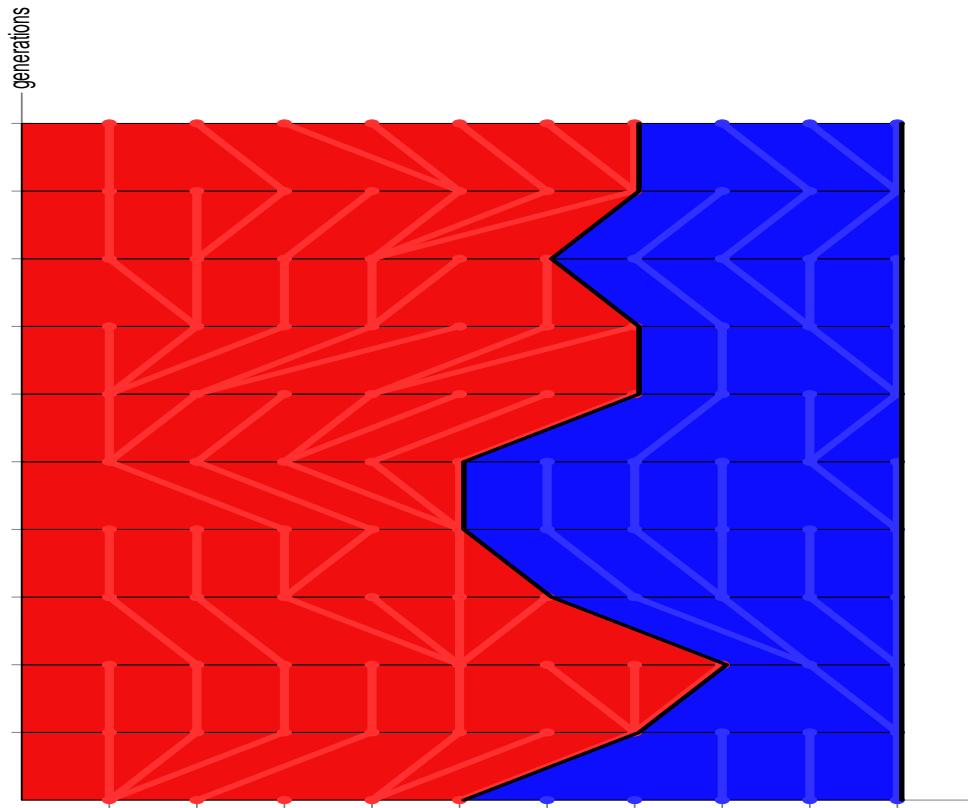
Fixed population size: Canning's model



Again: order the individuals (artificially), let

$$\eta_t(n) := \# \text{ descendants of founders } 1, \dots, n \text{ alive in generation } t .$$

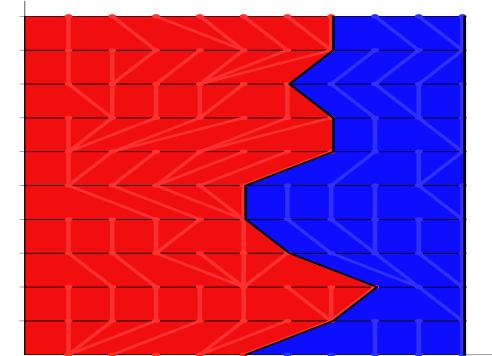
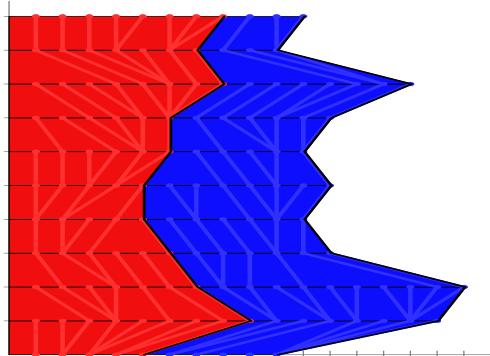
Neutral types



We could again think of neutral types (without mutation), e.g. red and blue.

Relation between

and

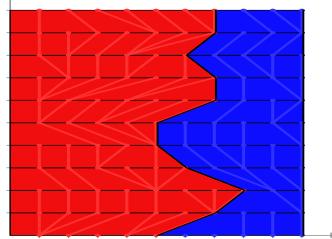


?

First answer Condition a Galton-Watson process to have *constant* population size N , obtain a model from Canning's class.

Easy, but is there more?

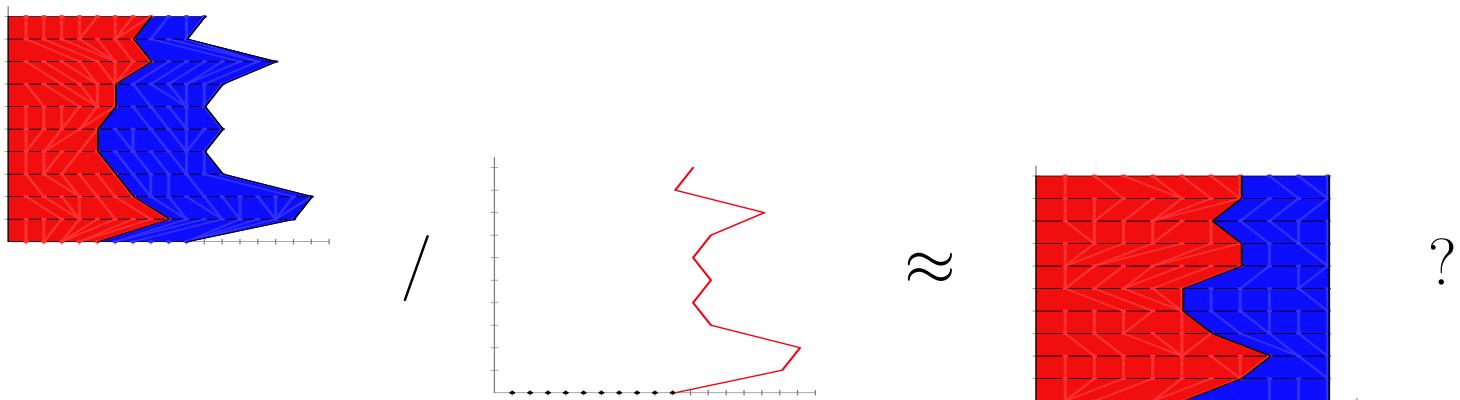
Relations?



In Canning's model, we think of *relative* frequencies of types.

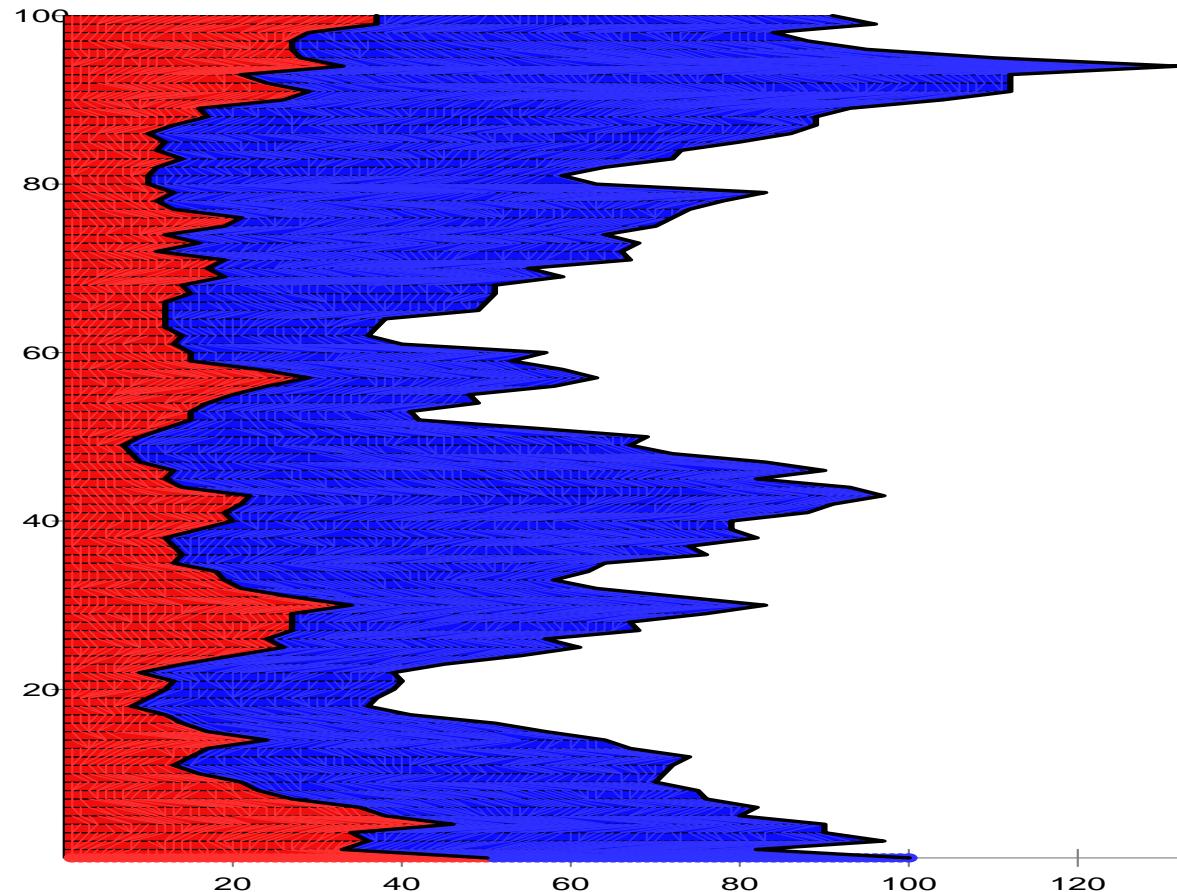
We can do the same in a free branching model by *normalising* with the current total population size (at least before extinction), i.e. considering

$$\tilde{\xi}_t(n) := \frac{\xi_t(n)}{\xi_t(N)}.$$



Relations?

Yes, in a suitable limit of population size $N \rightarrow \infty$.



Continuous state branching processes (Jiřina, Silverstein, Lamperti, ...)

$Z^{(N)} = (Z_k^{(N)})_{k=0,1,2,\dots}$, $N \in \mathbb{N}$ a sequence of Galton-Watson processes (possibly with offspring distributions depending on N),

$m_N \rightarrow 0$ mass rescaling,

$$Z_0^{(N)} = [m_N^{-1}]$$

(+ conditions ...).

$$\left(m_N Z_{[Nt]}^{(N)}\right)_{t \geq 0} \Rightarrow X,$$

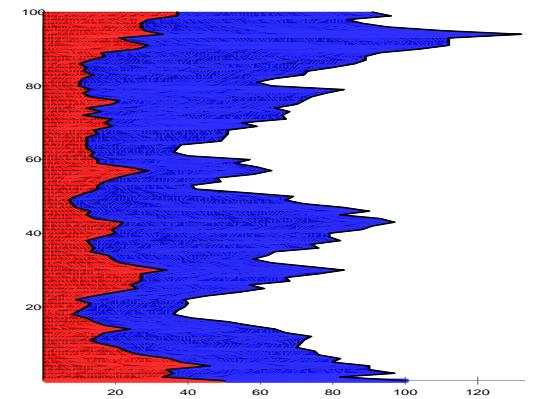
where X is a *continuous state branching process*, i.e. an \mathbb{R}_+ -valued Markov process that enjoys the *branching property*:

X, X', X'' independent copies, $X_0 = 0, X'_0 = x', X''_0 = x'', x = x' + x''$
 $\Rightarrow X \stackrel{\text{law}}{=} X' + X''.$

Continuous state branching processes: Favourite example

Example Assume the N -th offspring distribution has

- ▷ **mean** = $1 + \mu/N + o(1/N)$,
- ▷ **variance** = $\sigma^2 + o(1)$
- ▷ (and, say, uniformly bounded third moment).



$Z_0^{(N)} = N$, then $\left(N^{-1}Z_{[Nt]}^{(N)}\right)_{t \geq 0} \Rightarrow$ Feller's branching diffusion, generator

$$\mathcal{L}_{(2)}f(z) = \frac{1}{2}\sigma^2 z f''(z) + \mu z f'(z).$$

(i.e. $\text{Var}[Z_{t+\Delta t} - Z_t | Z_t] \approx \sigma^2 Z_t \Delta t$, $\text{E}[Z_{t+\Delta t} - Z_t | Z_t] \approx \mu Z_t \Delta t$.)

If the approximating offspring distributions are in the domain of attraction of a *stable law* of index $\alpha \in (0, 2)$, i.e.

$$\mathbb{P}(\text{more than } n \text{ children}) \sim \text{Const.} \times n^{-\alpha}$$

(note: in particular, no variance),
the limit process Z will have discontinuous paths. Generator

$$\mathcal{L}_{(\alpha)} f(z) = c_\alpha z f'(z) + z \int_{(0,\infty)} \{f(z+h) - f(z) - h \mathbf{1}_{(0,1]}(h) f'(z)\} h^{-1-\alpha} dh.$$

Interpretation:

if the present mass is z , a new litter of mass h is produced at rate $z \times h^{-1-\alpha}$.

Why the name?

- ▷ Lamperti's construction connects them with stable Lévy processes:

$$X_t = Y \left(\int_0^t X_s ds \right),$$

where Y is a stable process without negative jumps, stopped upon hitting 0.

- ▷ Scaling properties
- ▷ Equation for Laplace transforms

Existence of mean: $\alpha > 1 \Rightarrow \mathbf{E}_x X_t < \infty$,
 $\alpha < 1 \Rightarrow \mathbf{E}_x X_t = \infty$ for all $t > 0$.

Extinction/Explosion: $\alpha < 1 \Rightarrow X$ has growing paths, explodes in finite time,
 $\alpha > 1 \Rightarrow X$ becomes extinct in finite time.

Dawson-Watanabe superprocesses

Z a given CSBP. The corresponding *Dawson-Watanabe superprocess** is a process X with values in the measures on $[0, 1]$ such that

for $B \subset [0, 1]$: $(X_t(B))_{t \geq 0} \xrightarrow{\text{law}} Z$, started from $Z_0 = |B|$,

$X.(B_1), X.(B_2), \dots, X.(B_n)$ are independent if B_1, \dots, B_n are disjoint.

Interpretation: $X_t(B) =$ mass of descendants alive at time t whose ancestors were $\in B$

*Note: this is a “toy version”.

$(\Gamma_t)_{t \geq 0}$ with values in the equivalence relations on $\{1, 2, \dots, n\}$, exchangeable.

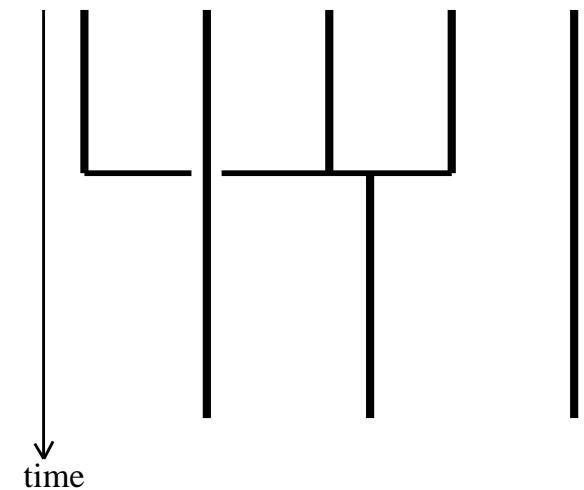
Possible interpretation: $i \sim_{\Gamma_t} j$ iff individuals i and j have a common ancestor at most t time units ago.

For restriction to any $\{1, \dots, N\}$: If there are presently p classes,

$$\text{at rate } \beta_{p,j}^{\Lambda} = \int_{[0,1]} x^{j-2}(1-x)^{p-j} \Lambda(dx)$$

any given j -tuple of classes merges to one ($j \geq 2$).

Λ is a finite measure on $[0, 1]$.

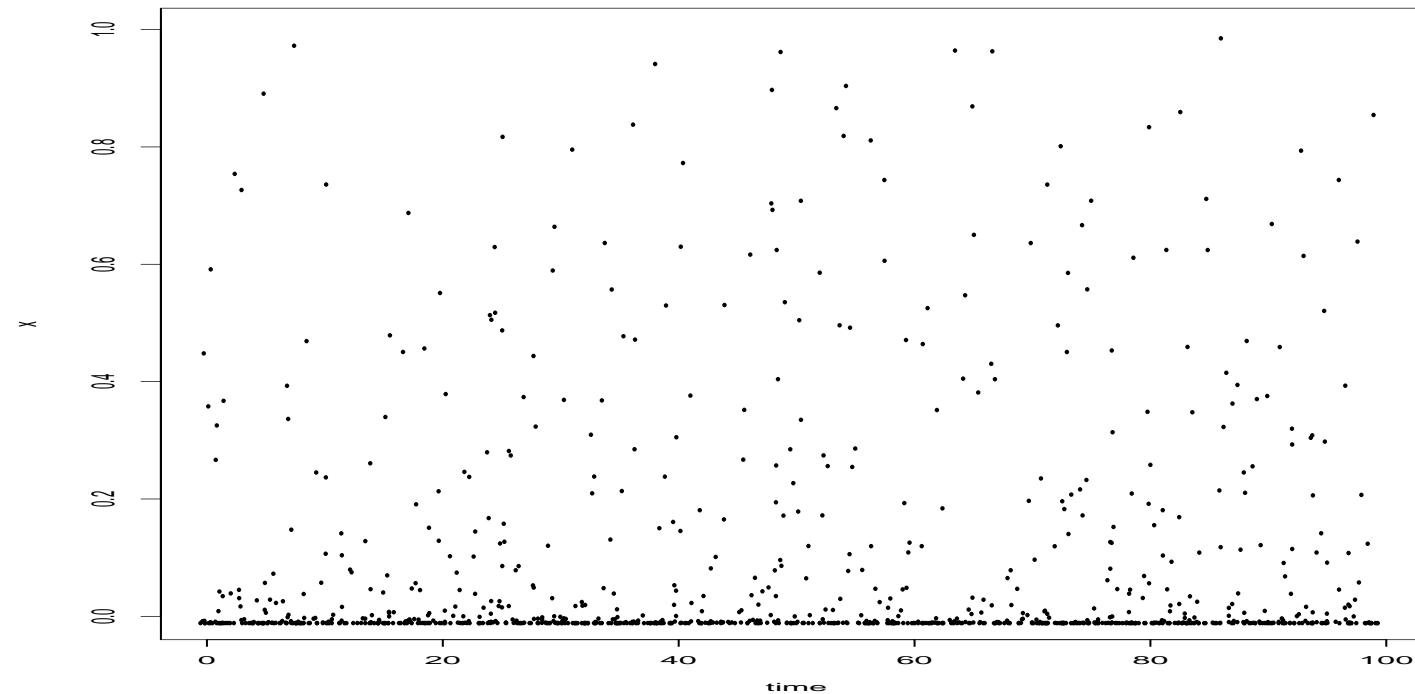


Note: $\Lambda = \delta_0$ corresponds to Kingman's coalescent,
if $\Lambda((0, 1]) > 0$, there will be *multiple mergers*.

Λ -Coalescents: Multiple mergers

Interpretation of “non-Kingman” part:

\mathcal{N} a Poisson point process on $[0, \infty) \times (0, 1]$ with intensity measure $dt \otimes x^{-2} \Lambda(dx)$.



For $(t, x) \in \mathcal{N}$: at time t each class throws a coin with success probability x . All the successful classes merge to one.

(Generalised) Λ -Fleming-Viot processes (Bertoin & Le Gall 2002)

$(\rho_t)_{t \geq 0}$ a Markov process with values in the probability measures on $[0, 1]$.

Interpretation (if ρ_0 = uniform measure):

$\rho_t(B)$ = fraction of mass alive at time t whose ancestors at time 0 where in $B \subset [0, 1]$.

On test functions of the form $F(\rho) = \int \dots \int \rho(dx_1) \dots \rho(dx_p) f(x_1, \dots, x_p)$, the generator acts as

$$\mathcal{L}_{FV,\Lambda} F(\rho) = \sum_{\substack{J \subset \{1, \dots, p\}, \\ |J| \geq 2}} \int \dots \int \rho(dx_1) \dots \rho(dx_p) \beta_{p,|J|}^{\Lambda} \left(f(a_1^J, \dots, a_p^J) - f(a_1, \dots, a_p) \right).$$

\uparrow
 $a_i^J = a_{\min J}$ if $i \in J$

Interpretation: y -jumps come with intensity $y^{-2}\Lambda(dy)$. At the instant of a y -jump, an individual X is chosen according to the current ρ , and

$$\rho \rightarrow y\delta_X + (1-y)\rho.$$

Note: alternative form of generator $\mathcal{L}_{FV,\lambda} G(\rho) = \int y^{-2}\Lambda(dy) \int \rho(dx) (G(y\delta_x + (1-y)\rho) - G(\rho))$

Duality between coalescent and FV (Bertoin & Le Gall)

For a partition γ of $\{1, \dots, p\}$ with $|\gamma|$ classes and a probability measure ρ on $[0, 1]$ consider test functions of the type

$$\Phi_f(\gamma, \rho) := \int \rho(dx_1) \dots \rho(dx_{|\gamma|}) f(\vec{y}(\gamma; x_1, \dots, x_{|\gamma|}))$$

\uparrow
 $y_j = x_i$ if $j \in i\text{-th class of } \gamma$

("assign an independent ρ -sample to each class of γ "), where $f : [0, 1]^p \rightarrow \mathbb{R}$.

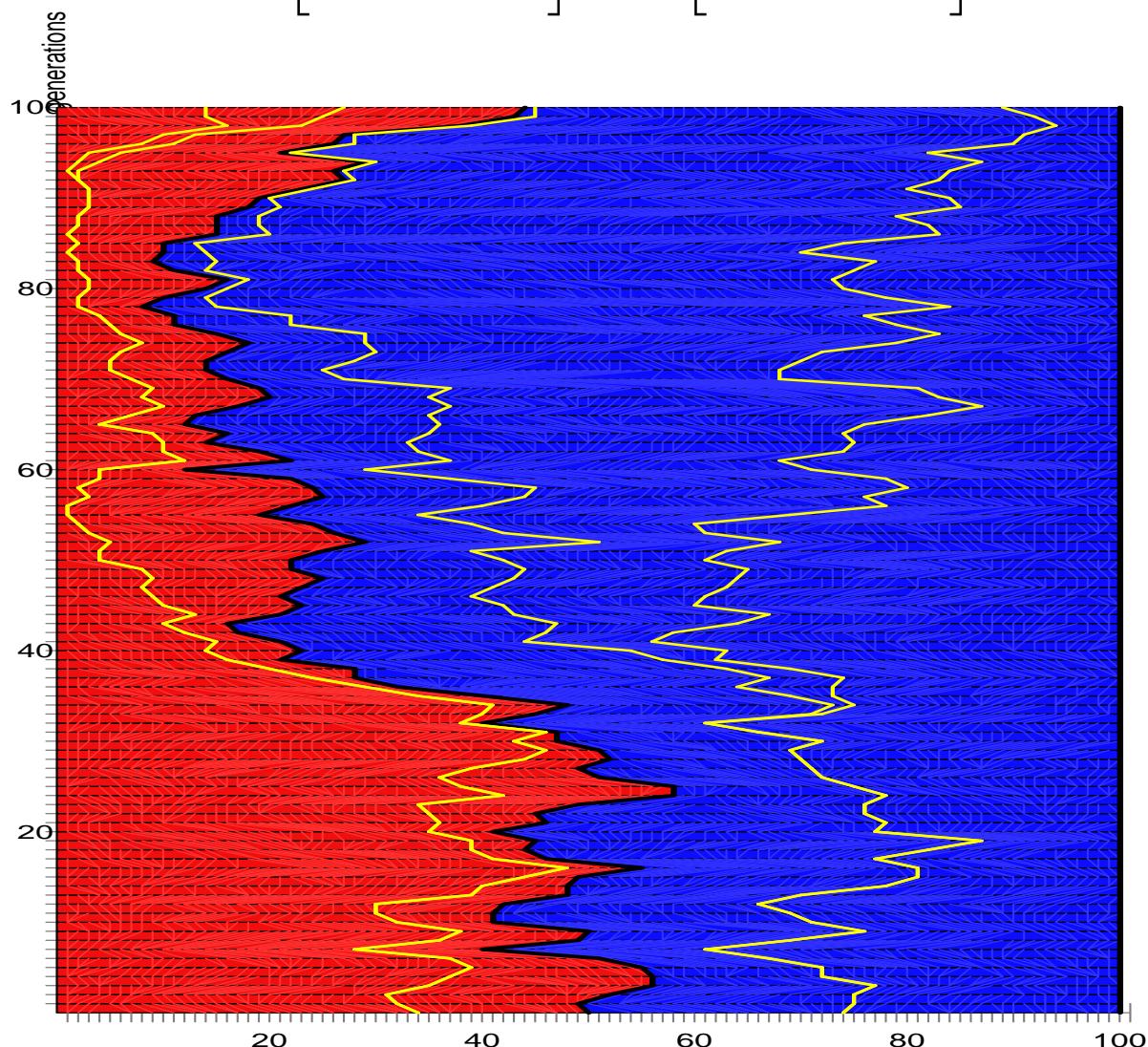
Then we have with

- $(\Gamma_t^{(p)})$ restriction of Λ -coalescent to $\{1, \dots, p\}$,
 (ρ_t) Λ -FV process

$$\mathbb{E} \left[\Phi_f(\Gamma_0^{(p)}, \rho_t) \right] = \mathbb{E} \left[\Phi_f(\Gamma_t^{(p)}, \rho_0) \right] \quad \text{for all } t \geq 0.$$

Sample interpretation of the duality

$$\mathbb{E} \left[\Phi_f(\Gamma_0^{(p)}, \rho_t) \right] = \mathbb{E} \left[\Phi_f(\Gamma_t^{(p)}, \rho_0) \right]$$



Ratio of two Feller diffusions

Let X be a finite variance DW process (on $[0, 1]$), i.e. $\alpha = 2$. Then $X([0, a))$ and $X([a, 1])$ are independent Feller diffusions.

Well known:

$$\left(\frac{X_t([a, 1])}{X_t([0, 1])} \right)_{t \geq 0} = \left(\frac{X_t([a, 1])}{X_t([0, a)) + X_t([a, 1])} \right)_{t \geq 0}$$

is a time changed Wright-Fisher diffusion

Main result

Let (X_t) be a stable DW process on $[0, 1]$ (with trivial motion) of index $\alpha \in (0, 2]$, $\tau =$ time of explosion or extinction of X . For $t < \tau$ put

$$R_t(B) := \frac{X_t(B)}{X_t([0, 1])}, \quad B \subset [0, 1].$$

Consider the additive functional

$$A_t := \int_0^t \frac{1}{(X_s([0, 1]))^{\alpha-1}} ds, \quad t < \tau$$

with inverse $\varphi(s) := A^{-1}(s)$.

Theorem *The time changed normalised process*

$$\tilde{R}_s := R_{\varphi(s)}, \quad 0 \leq s \leq A_{\tau-}$$

is a generalised Fleming-Viot process, dual to the Beta($2 - \alpha, \alpha$)-coalescent.

Note: this yields a “skew product” representation for the DW process:

$$X_t(\cdot) = X_t([0, 1])R_t(\cdot),$$

where the second component is a time-changed generalised FV process.

The time changed normalised process $\tilde{R}_s := R_{\varphi(s)}$ is dual to the $\text{Beta}(2 - \alpha, \alpha)$ -coalescent.

Remarks

- ▷ There is no such skew product representation for general, non-stable DW processes.
- ▷ (Neutral) types & mutation: pass from $[0, 1]$ to $[0, 1] \times E$, where E is the type space, mutation would correspond to a Markov motion on E for the “individual masses”.
- ▷ The case $\alpha = 2$ is Perkin’s disintegration theorem.
- ▷ The case $\alpha = 1$ corresponds to the well known relation between Neveu’s branching process and the Bolthausen-Sznitman coalescent (Bertoin & Le Gall, 2000). Note that there is no time-change in this case.
- ▷ The result suggests a relation between $R_{k,n}^*$, the genealogy connecting a k -sample from generation n in a Galton-Watson process where the individual offspring distribution has tails $\sim x^{-\alpha}$, and that generated by the $\text{Beta}(2 - \alpha, \alpha)$ -coalescent.

Sketch of proof ($\alpha < 2$)

For a finite measure μ on $[0, 1]$ ($\mu \neq 0$) denote $\rho := \mu/\mu([0, 1])$.

For test functions of the form

$$F(\mu) = G(\rho) = \int \rho(dx_1) \dots \int \rho(dx_p) \prod_{i=1}^p \mathbf{1}_{(a_i, b_i]}(x_i)$$

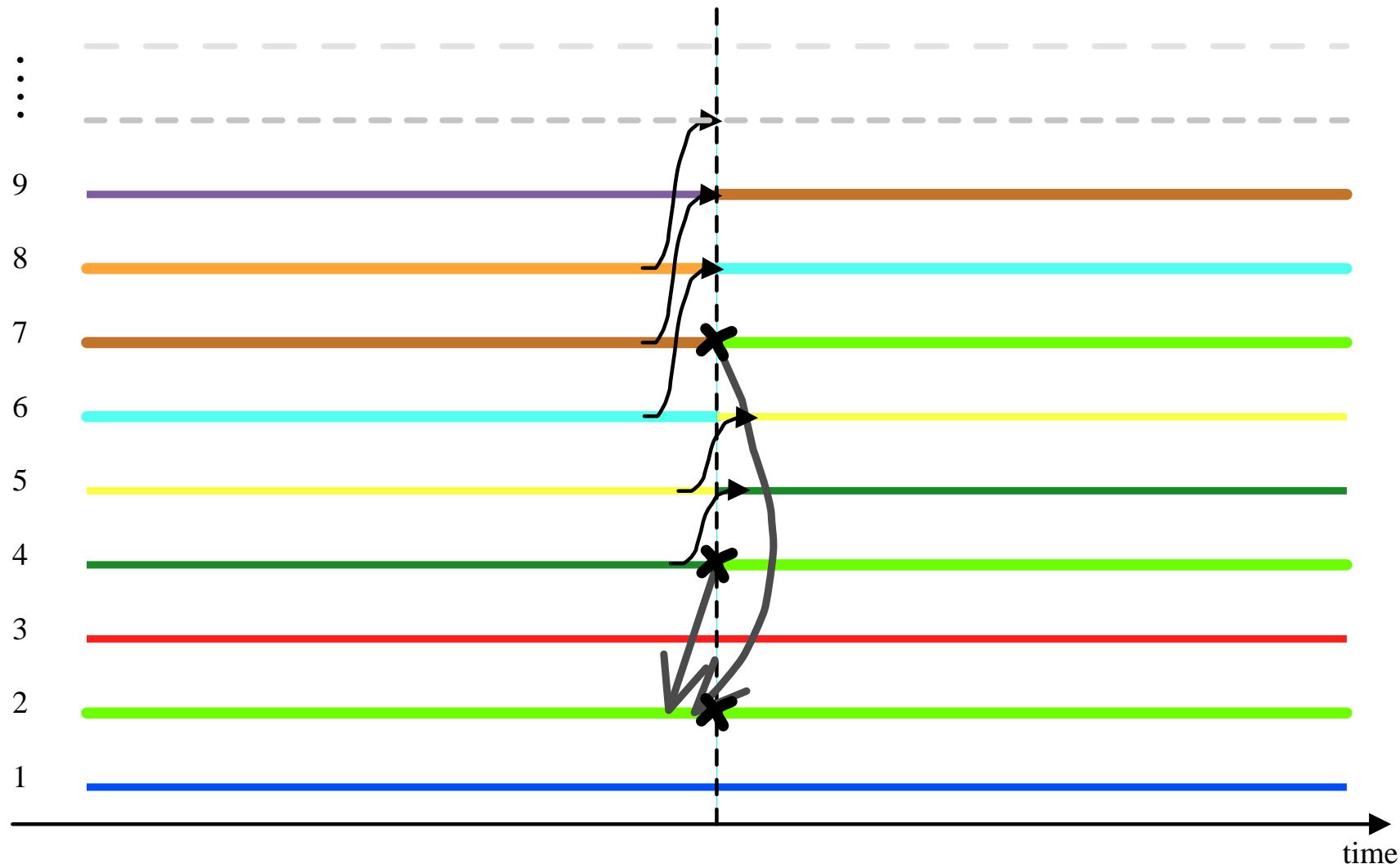
one checks that the generator of the α -stable DW process acts as

$$\begin{aligned} \mathcal{L}_{DW,\alpha} F(\mu) &= \int \mu(dx) \int_{(0,\infty)} dh h^{-1-\alpha} \left(G\left(\frac{\mu + h\delta_x}{\mu([0,1]) + h}\right) - G(\rho) \right) \\ &= C_\alpha \mu([0,1])^{1-\alpha} \int \rho(dx) \int_{[0,1]} dr r^{2-\alpha-1} (1-r)^{\alpha-1} \times \\ &\quad \frac{1}{r^2} (G(r\delta_x + (1-r)\rho) - G(\rho)) \end{aligned}$$

↑
remove via time-change

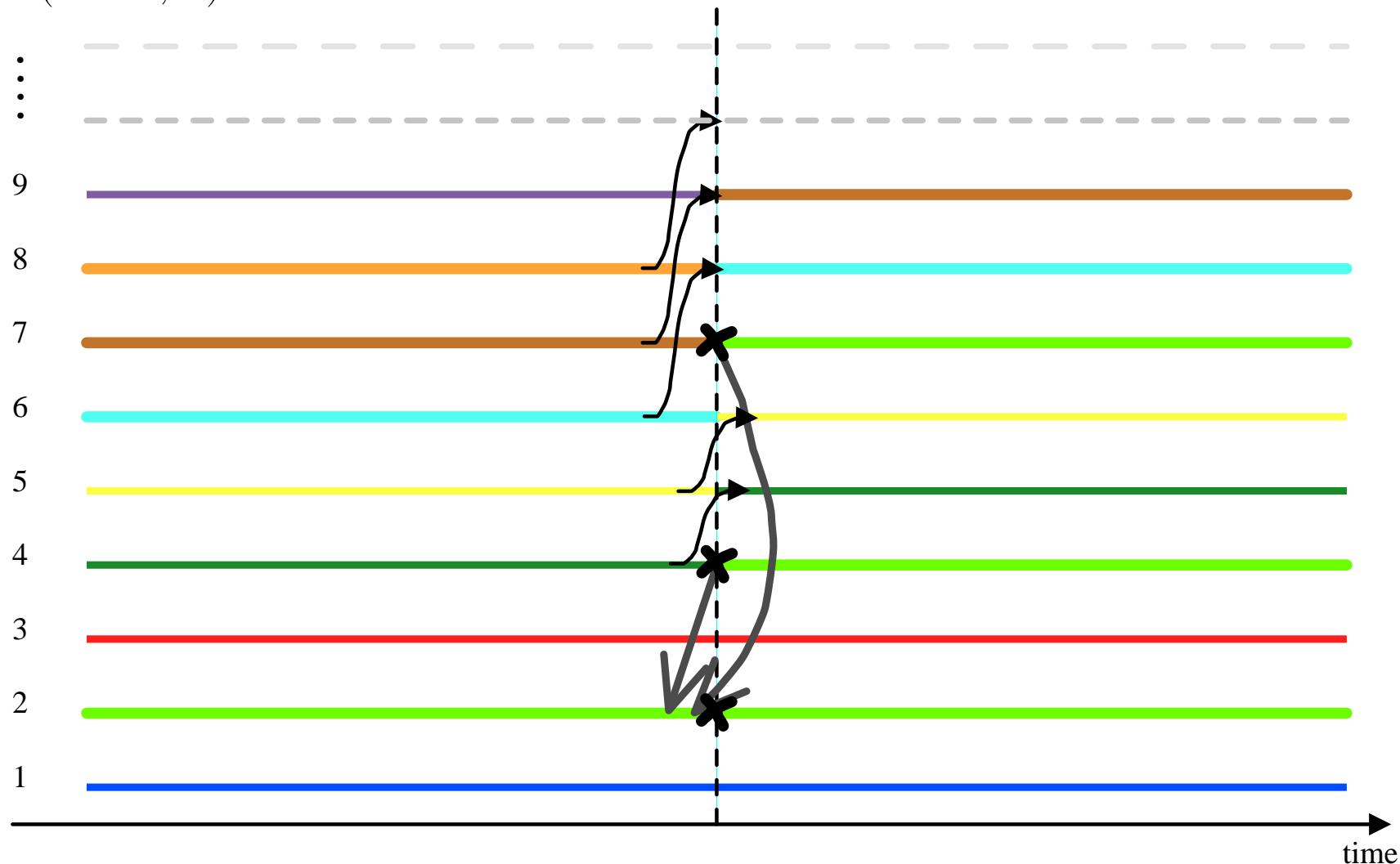
The “modified look down” point of view (Donnelly & Kurtz, 1999)

(Z_t) a stable CSBP, $\alpha < 2$. At the jump times of Z , each level throws a coin with success probability $\Delta Z_t / (\Delta Z_t + Z_{t-})$. All “successful” levels participate in this look down event, and look down to the smallest successful level.



The “modified look down” point of view (Donnelly & Kurtz, 1999)

This is a clever (alternative) way of embedding a genealogy into a CSBP. Moreover, run “backwards” and appropriately time-changed, it yields a $\text{Beta}(2 - \alpha, \alpha)$ -coalescent.



Conclusion?

- ▷ Free branching and resampling models can generate similar (neutral) genealogies.
- ▷ When will one see multiple mergers in a genealogy?
 - Under a selective sweep,
 - a bottleneck,
 - in a neutral, not exogenously controlled scenario?
- ▷ Result suggests Beta($2 - \alpha, \alpha$)-coalescents as an interesting subclass of all Λ -coalescents.