

A time reversal duality for branching processes and applications

M. Dávila Felipe, joint work with A. Lambert

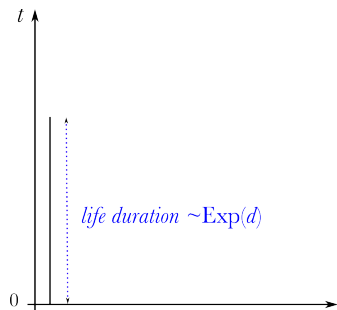
LPMA, Paris 6 - SMILE, CIRB Collège de France

École de Printemps, Aussois, April 2014

ANR **MANEGE**

- 1 Introduction
- 2 Time reversal for birth-death processes
- 3 Generalization for splitting trees
- 4 Ingredients of the proof
- 5 Bibliography

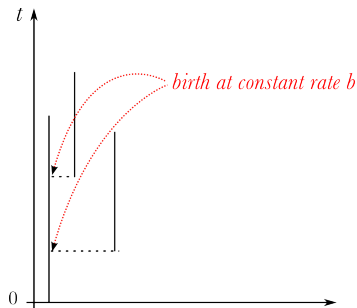
Birth-death (BD) process



Individuals

- have i.i.d. life durations $\sim \text{Exp}(d)$
- reproduce at constant rate b during their life
- behave independently from one another

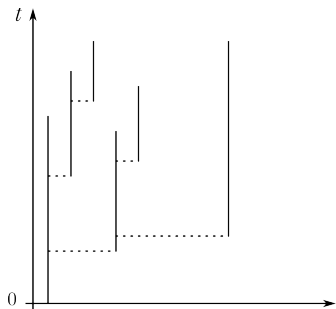
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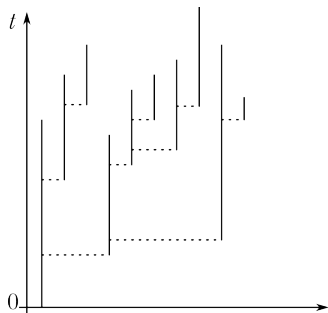
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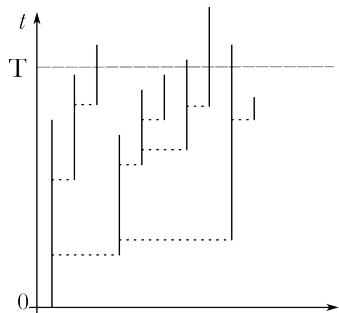
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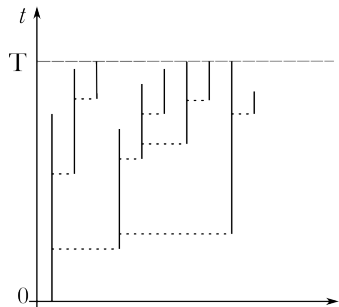
We consider for a **fixed time** T :

\mathcal{T} : the BD tree starting from **one ancestor**

$\mathcal{T}^{(T)}$: the BD tree truncated up to time T

$(\xi_t(\mathcal{T}), t \geq 0)$: the population size process

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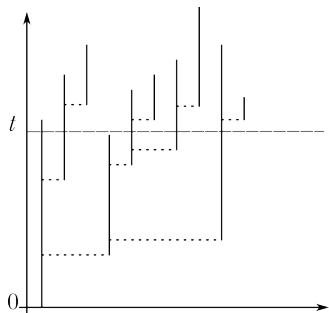
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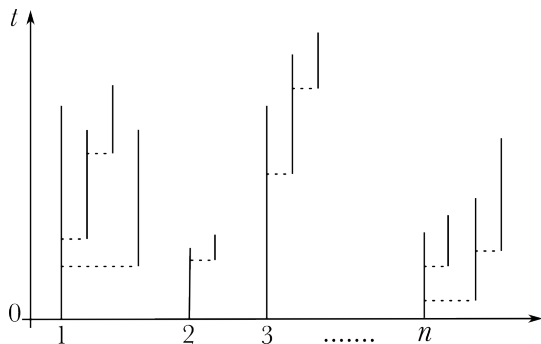
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Random forests

Forest \mathcal{F} :

A finite sequence of i.i.d BD trees $(\mathcal{T}_1, \dots, \mathcal{T}_n)$

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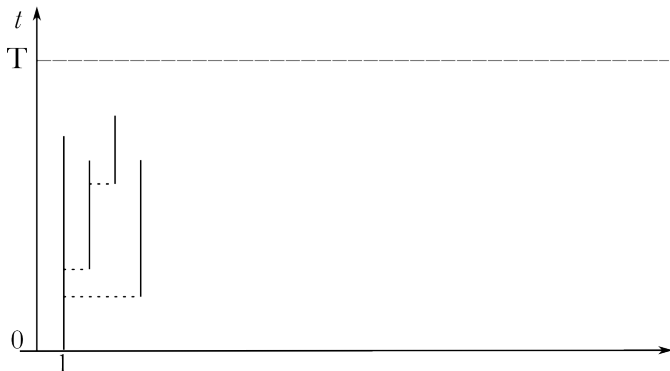
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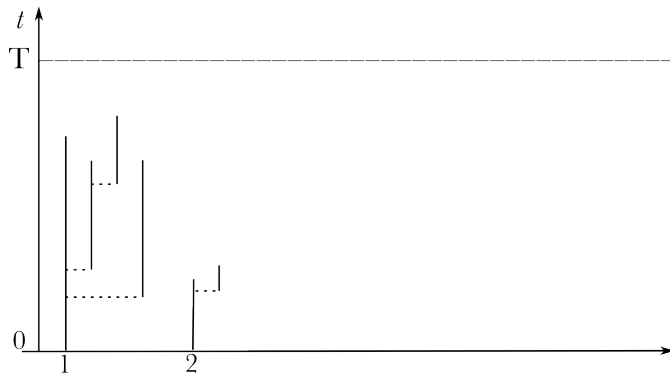
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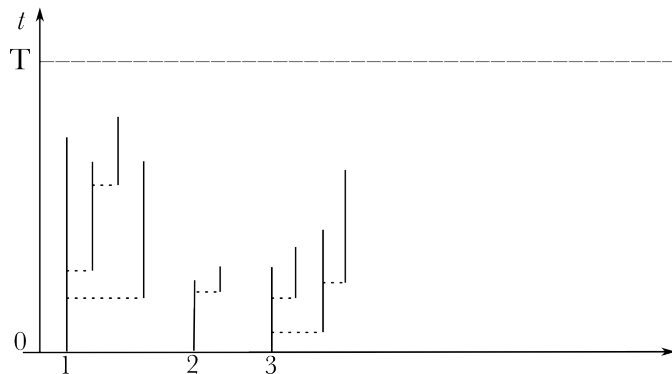
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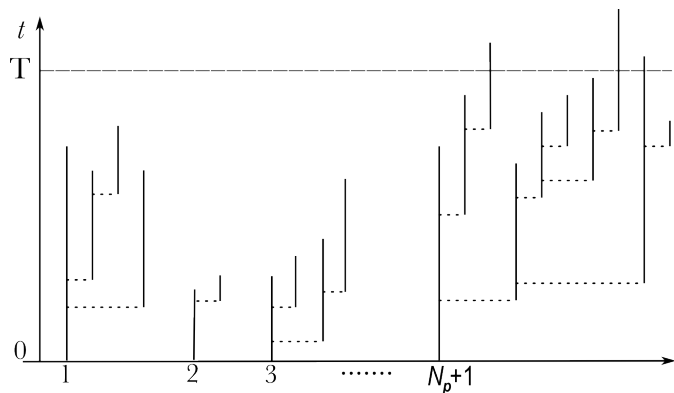
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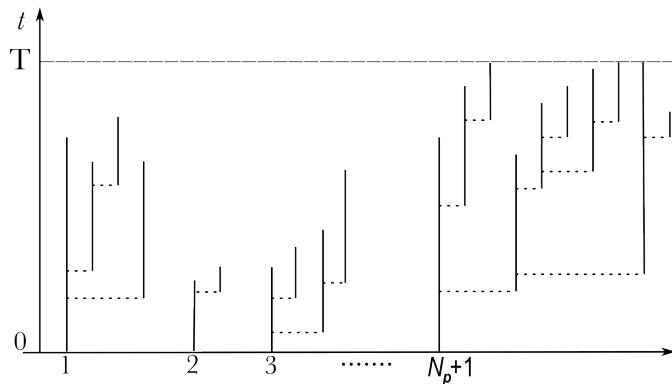
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For any forest \mathcal{F} , the population size process is denoted by,

$$(\xi_t(\mathcal{F}), t \geq 0)$$

Time-reversal duality

Fix $b \geq d$

$\mathcal{F}^* := \text{Supercritical } (b, d)$

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[Athreya and Ney 1972]

A supercritical BD process conditioned to die out is a subcritical BD process, obtained by swapping birth and death rates.

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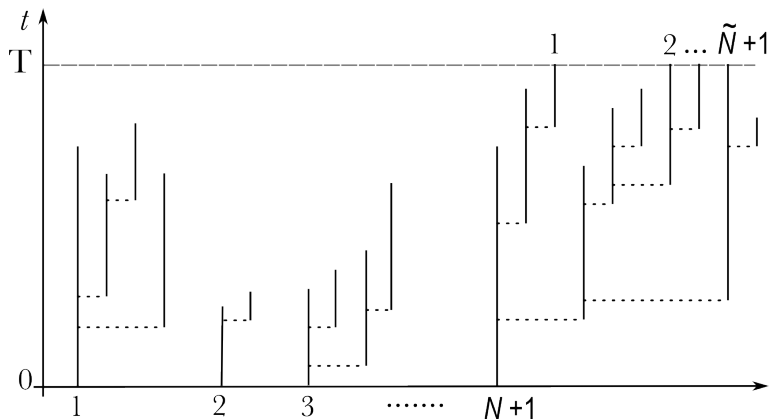
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Theorem

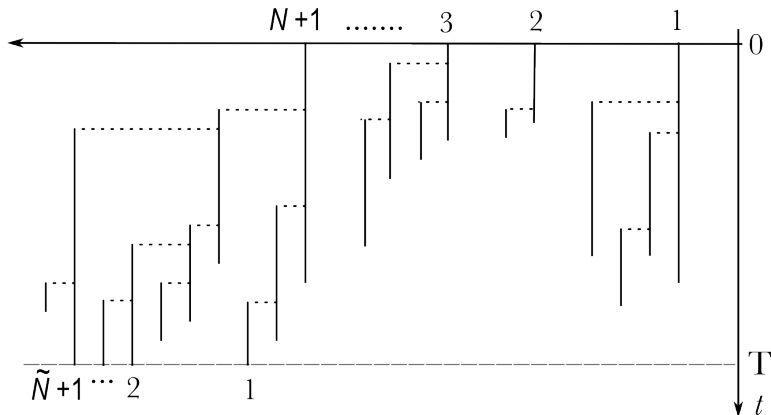
We have the following identity in distribution,

$$(\xi_{T-t}(\mathcal{F}^*), 0 \leq t \leq T) \stackrel{d}{=} (\xi_t(\tilde{\mathcal{F}}^*), 0 \leq t \leq T)$$

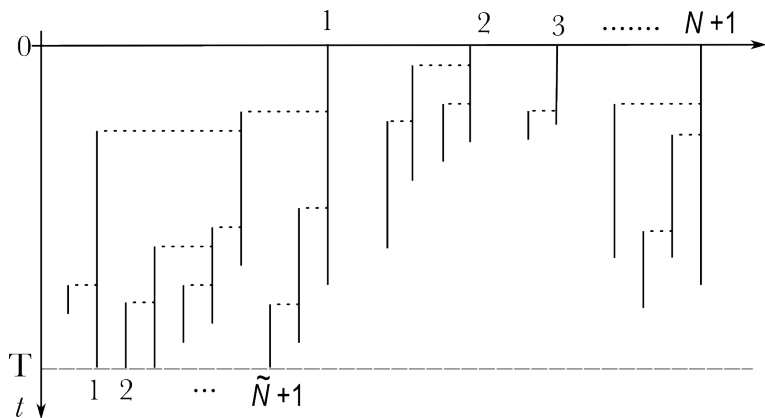
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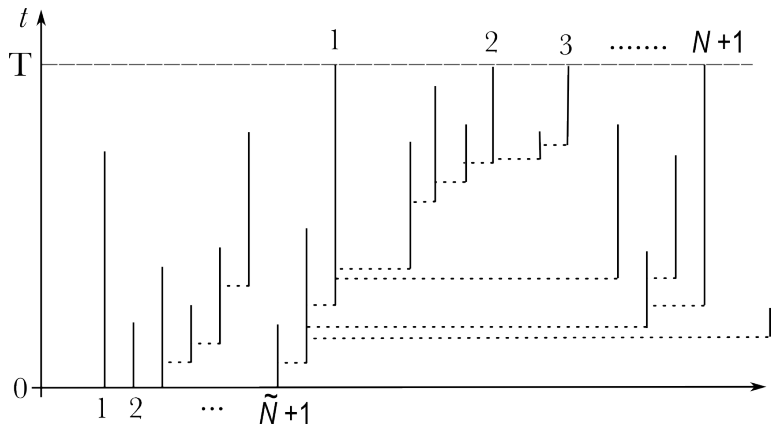
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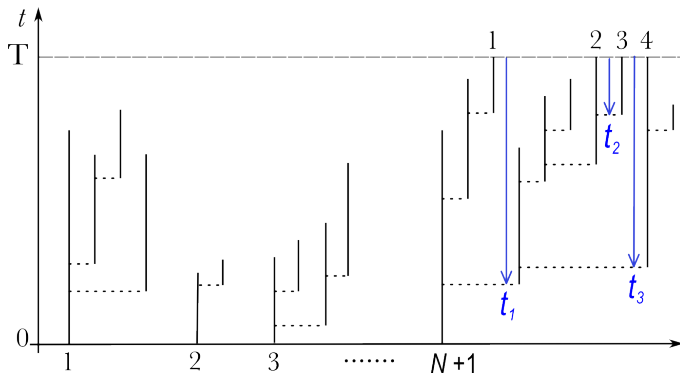


Conditional on the reduced tree: applications in epidemiology

We want to characterize the population size process conditional on the coalescence times between individuals at present time T .

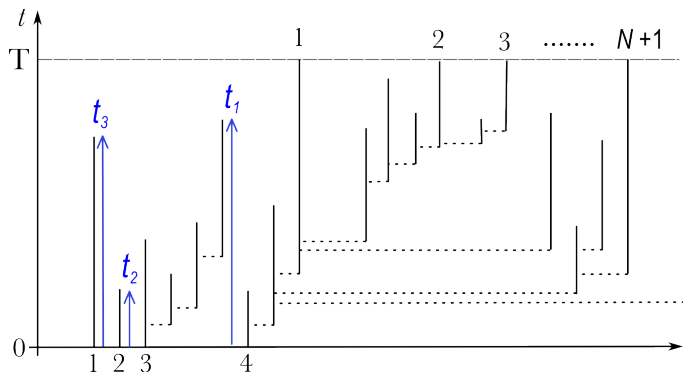
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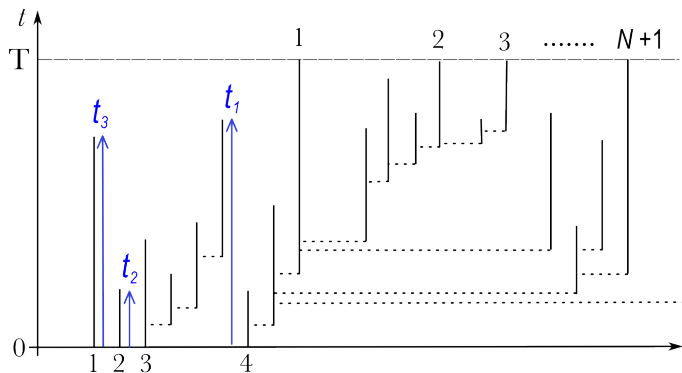


Conditional on the reduced tree: applications in epidemiology

When we return the time, thanks to the duality property, coalescence times become life durations



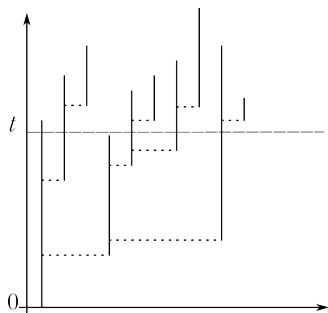
Conditional on the reduced tree: applications in epidemiology



Idea:

The population size process conditional on the coalescence times to be $t_1, \dots, t_{\tilde{N}+1}$, backward in time, is that of a sum of \tilde{N} BD trees, each conditioned on dying out before t_i for $1 \leq i \leq \tilde{N}$, plus an additional tree conditioned on surviving up until time T .

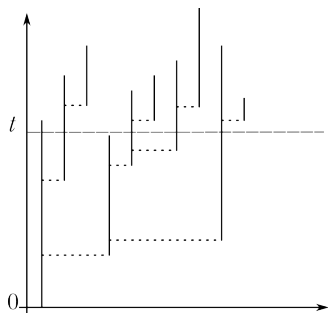
Splitting trees



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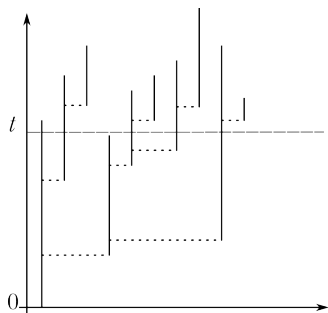


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A splitting tree is characterized by a σ -finite measure Π on $(0, \infty)$ satisfying $\int_{(0, \infty)} (1 \wedge r) \Pi(dr) < \infty$ (the *lifespan measure*).

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We consider Π *finite with mass b* : individuals give birth at rate b and have life durations distributed as $\Pi(\cdot)/b$.

Time reversal duality for splitting trees

Define for Π :

- The Laplace exponent: $\psi(\lambda) := \lambda - \int_0^\infty (1 - e^{-\lambda r}) \Pi(dr)$, $\lambda \geq 0$
- η the largest root of ψ
- A new measure $\tilde{\Pi}(dr) := e^{-\eta r} \Pi(dr)$

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Define:

$$\gamma = \frac{1}{W(T)}$$

$$\tilde{\gamma} = \frac{1}{\widetilde{W}(T)}$$

Time reversal duality for splitting trees

Forest \mathcal{F}^p :

A sequence of i.i.d. splitting trees $(\mathcal{T}_1, \dots, \mathcal{T}_{N_p}, \mathcal{T}_{N_p+1}) \perp\!\!\!\perp N_p$, where,

- N_p : a geometric random variable with $\mathbb{P}(N_p = k) = (1 - p)^k p$, $k \geq 0$
- $\mathcal{T}_1, \dots, \mathcal{T}_{N_p}$: are conditioned on extinction before T
- \mathcal{T}_{N_p+1} : is conditioned on survival up until time T

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 $\mathcal{F}_\top^p, \mathcal{F}_\perp^p$:

$\sim \mathcal{F}^p$, but lifetimes of the ancestors have a specific distribution (\top, \perp) , \neq from $\Pi(\cdot)/b$

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Claim

$\mathcal{F}_\perp^{\tilde{\gamma}}$ = a sequence of i.i.d. splitting trees (\perp, Π) stopped at the first tree having survived up to time T .

$\tilde{\mathcal{F}}_\top^{\tilde{\gamma}}$ = a sequence of i.i.d. splitting trees $(\top, \tilde{\Pi})$ stopped at the first tree having survived up to time T .

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Theorem

If the measure Π is supercritical (i.e. $m := \int_0^{\infty} r\Pi(dr) > 1$) then,

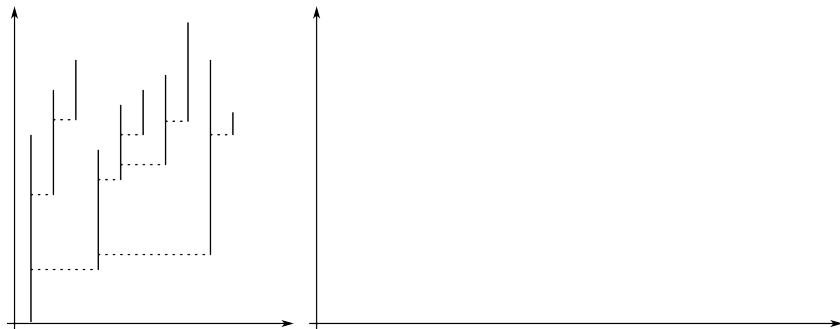
$$\left(\xi_{T-t}(\mathcal{F}_{\perp}^{\tilde{\gamma}}), 0 \leq t \leq T\right) \stackrel{d}{=} \left(\xi_t(\tilde{\mathcal{F}}_{\top}^{\gamma}), 0 \leq t \leq T\right)$$

In particular, if Π is subcritical, then,

$$\left(\xi_{T-t}(\mathcal{F}_{\perp}^{\gamma}), 0 \leq t \leq T\right) \stackrel{d}{=} \left(\xi_t(\mathcal{F}_{\top}^{\gamma}), 0 \leq t \leq T\right)$$

and actually in this case $\perp = \top$ since they have both density $\frac{\bar{\Pi}(r)}{m} dr$.

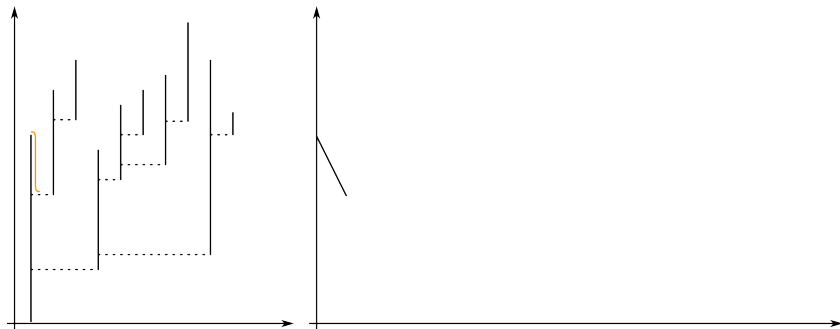
The jumping chronological contour process



Example of a finite splitting tree and its contour process¹

¹Figure from C. Delaporte - Aussois 2013

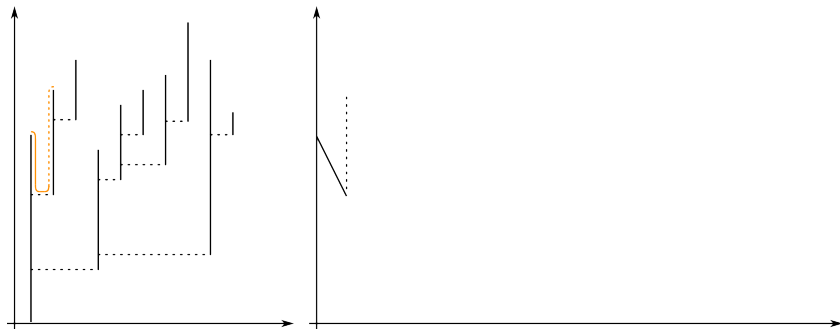
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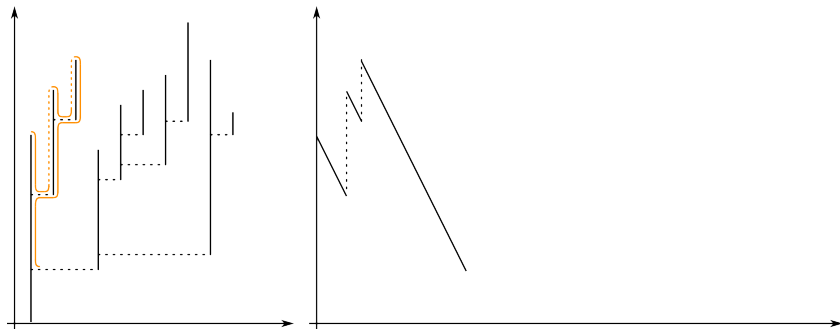
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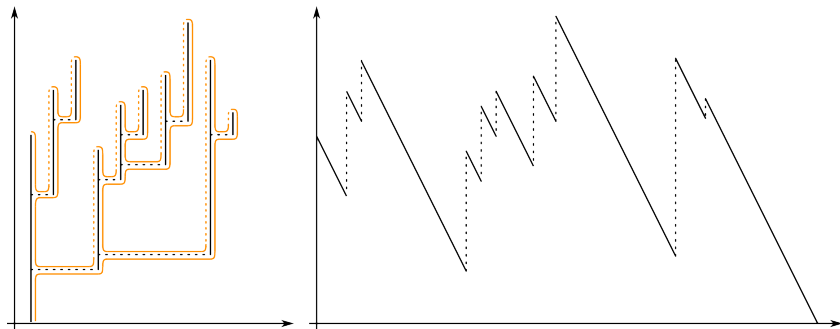
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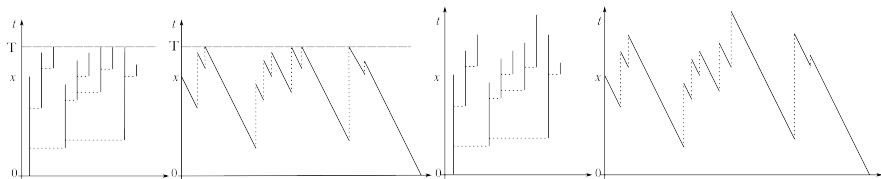


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The contour of splitting trees is a Lévy process

Let Y be a finite variation Lévy process with Lévy measure Π and drift -1 .



Theorem [Lambert 2010]

Conditional on the lifespan of the ancestor to be x , the contour of $\mathcal{T}^{(T)}$, is distributed as Y , started at $x \wedge T$, reflected below T and killed upon hitting 0.

The contour of \mathcal{T} , conditional on extinction, has the law of Y started at x , conditioned on, and killed upon hitting 0.

Time reversal duality for spectrally positive Lévy processes

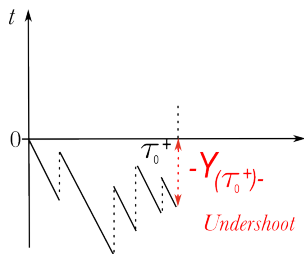
Theorem [Bertoin 1992]

The excursion measure has the following property of invariance under time reversal: under $\mathbb{P}_0 \left(\cdot \mid -Y_{(\tau_0^+)_-} = u \right)$ the reverted excursion, $(-Y_{(\tau_0-t)_-}, 0 \leq t < \tau_0)$ has the same distribution that $(Y_t, 0 \leq t < \tau_0)$ under $\mathbb{P}_u (\cdot \mid \tau_0 < +\infty)$.

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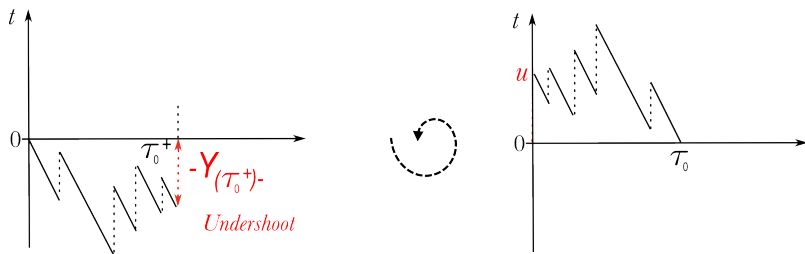
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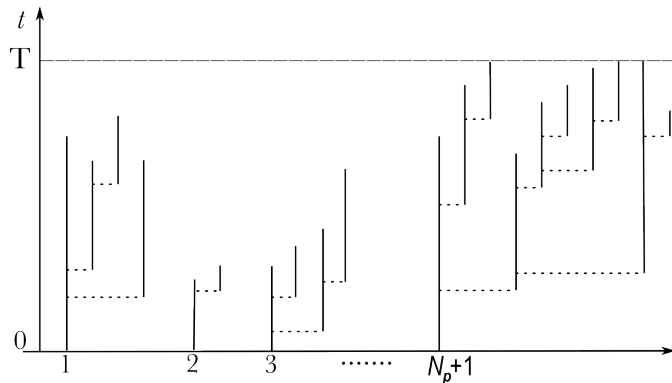
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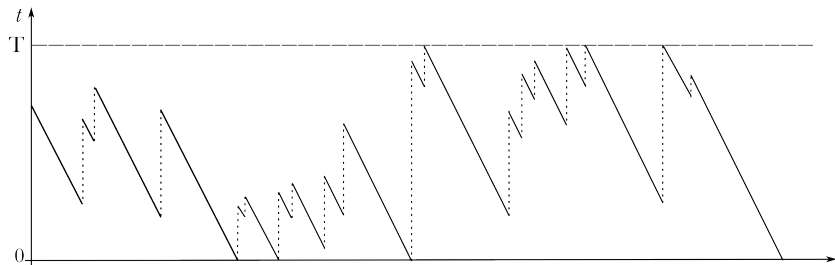
$$\gamma = \frac{1}{W(T)} = P_T(\tau_0 < \tau_T^+)$$

$$\tilde{\gamma} = \frac{1}{\tilde{W}(T)} = \tilde{P}_T(\tau_0 < \tau_T^+)$$

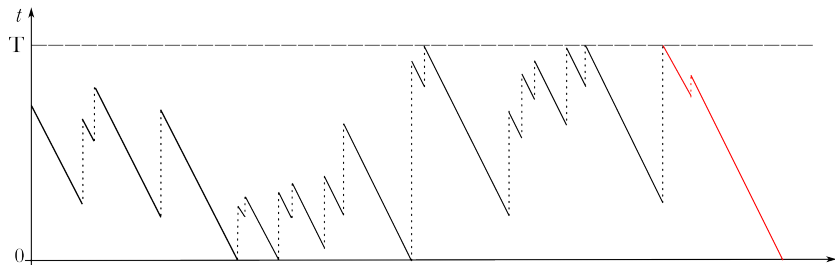
Contour of a forest



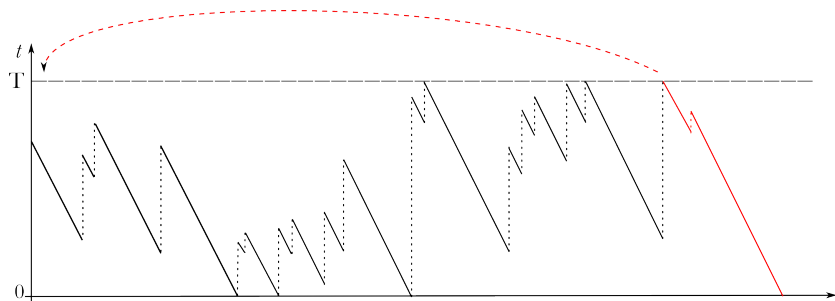
Contour of a forest



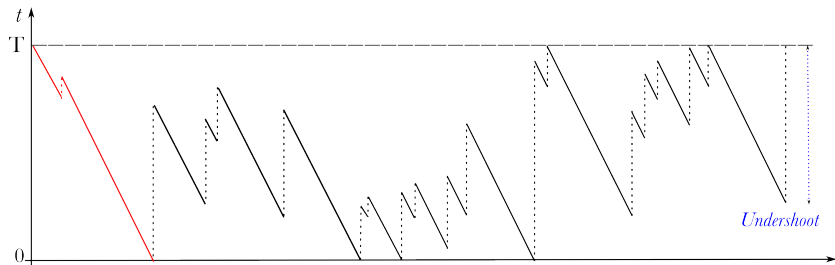
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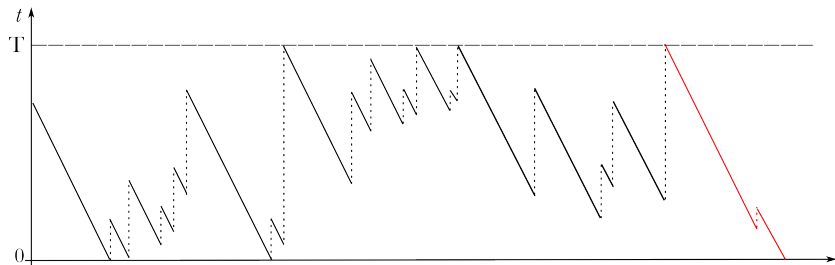
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References I

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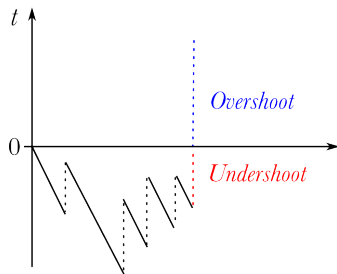
Thank You!

Undershoot and overshoot

$\mathcal{F}_\top^P, \mathcal{F}_\perp^P$:

Lifetimes of the ancestors have a specific distribution, different from $\Pi(\cdot)/b$:

The undershoot and overshoot at 0 of an excursion starting at 0 and conditional on $\tau_0^+ < +\infty$, are distributed as follows,



$$\text{Overshoot } (\perp): \sim \frac{e^{\eta r} \bar{\Pi}(r) dr}{m \wedge 1}$$

$$\text{Undershoot } (\top): \sim \frac{e^{-\eta a} \bar{\Pi}(a) da}{m \wedge 1}$$