

# Interval Partition Evolutions and Applications

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Joint work with

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Douglas Rizzolo (Delaware)



Matthias Winkel (Oxford)

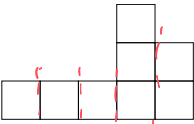


- ▶ Integer compositions and interval partitions
- ▶ Main results: self-similar interval partition evolutions
- ▶ Applications
  - ▶ Ray–Knight type theorems
  - ▶ Population-genetics models
  - ▶ Evolution of (discrete and continuum) trees

## 1. Integer compositions and interval partitions

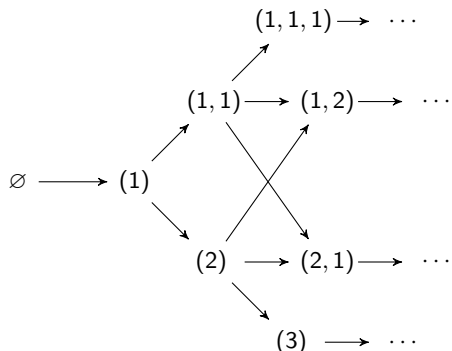
## Integer Compositions

A **composition of integer**  $n \in \mathbb{N}$  is a tuple  $\sigma = (\sigma_1, \dots, \sigma_k)$  of **ordered** positive integers with  $n = \sigma_1 + \dots + \sigma_k$ .

- ▶ A composition  $(1, 1, 1, 3, 2)$  of 8  $\Leftrightarrow$  a diagram 
- ▶ Keeping track of only the sizes of parts, and not their order: a **partition** of an integer/ Young diagram

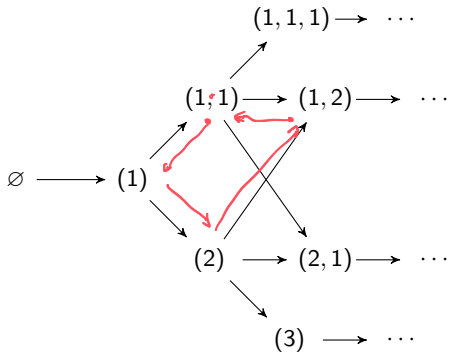
### The (directed) graph of compositions

- ▶ An edge from  $\sigma$  to  $\lambda$ :  
if  $\lambda$  can be obtained from  $\sigma$  by stacking or inserting one box.



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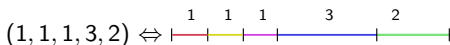
- ▶ Scaling limit of random walks on the graph of **partitions**:  
Diffusion on the Kingman simplex (Borodin, Olshanski, Petrov)  
Applications in **algebraic combinatorics** and **representation theory**.

**Question:** Scaling limits of random walks on the graph of compositions?

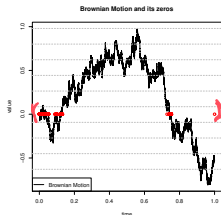
## The Space of Interval Partitions

$L \geq 0$ . We say  $\beta$  is an interval partition of the interval  $[0, L]$ , if

- ▶  $\beta = \{(a_i, b_i) \subset (0, L) : i \geq 1\}$  a collection of disjoint open intervals
- ▶ The **total mass** (sum of lengths) of  $\beta$  is  $\|\beta\| := \sum_{i \geq 1} (b_i - a_i) = L$ .
- ▶ a composition  $(1, 1, 1, 3, 2)$  of integer 8  
an interval partition  $\{(0, 1), (1, 2), (2, 3), (3, 6), (6, 8)\}$  of  $[0, 8]$



- ▶ Zero points  $\mathcal{Z}$  of a Brownian motion on  $(0, 1)$ : interval components of the open set  $(0, 1) \setminus \mathcal{Z}$  form an interval partition  $\beta$  of  $[0, 1]$



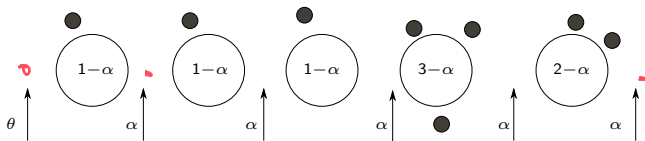
- ▶ The space  $\mathcal{I}$  of all interval partitions is equipped with the **Hausdorff metric**  $d_H$  (between the endpoint sets  $[0, L] \setminus \beta$ ).
- ▶  $(\mathcal{I}, d_H)$  is not complete but the induced topological space is Polish.

## 2. Chinese Restaurant Processes and Interval Partition Evolutions



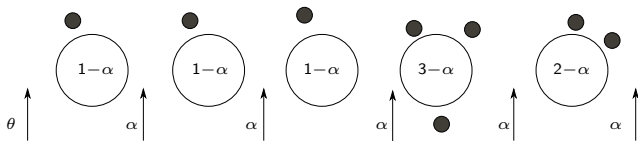
# Up-Down Ordered Chinese Restaurant Processes

- ▶ Tables are **ordered** in a line.
- ▶ Fix  $\alpha \in (0, 1)$  and  $\theta \geq 0$ . We construct a **continuous-time** Markov chain.
- ▶ **Arriving (up-step):**
  - ▶ For each occupied table, say there are  $m \in \mathbb{N}$  customers, a new customer comes to join this table at rate  $m - \alpha$
  - ▶ At rate  $\theta$ , a new customer enters to start a new table at the leftmost position.
  - ▶ Between each pair of two neighbouring occupied tables or at the rightmost position, a new customer enters and begins a new table there at rate  $\alpha$ ;

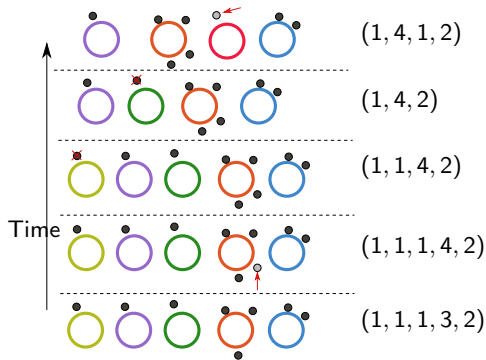


# Up-Down Ordered Chinese Restaurant Processes

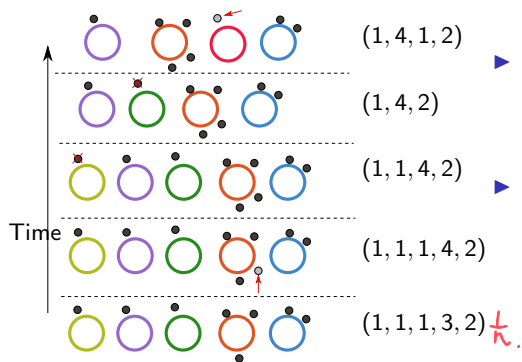
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- ▶ **Leaving (down-step)**: Each customer leaves at rate **1**.



- ▶ At each time  $t \geq 0$ , list the numbers of customers of occupied tables, from left to right, by a composition  $C(t)$ .
- ▶ The process  $(C(t), t \geq 0)$  is a random walk on the graph of compositions. (determined by two parameters  $\alpha \in (0, 1), \theta \geq 0$ )



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Theorem (S.-Winkel 2020+)

Let  $\alpha \in (0, 1), \theta \geq 0$ .

$$\left( \frac{C(2nt)}{n}, t \geq 0 \right) \xrightarrow[n \rightarrow \infty]{} (\beta(t), t \geq 0) \quad \text{in distribution.}$$

The **scaling limit**  $(\beta(t), t \geq 0)$  is an **interval-partition-valued process**. We call it an  **$(\alpha, \theta)$ -Self-Similar Interval-Partition Evolution, SSIPE $(\alpha, \theta)$** .

- ▶ A related scaling limit result: [Rivera-Lopez and Rizzolo AIHP2022+]

## Interval-Partition Evolutions

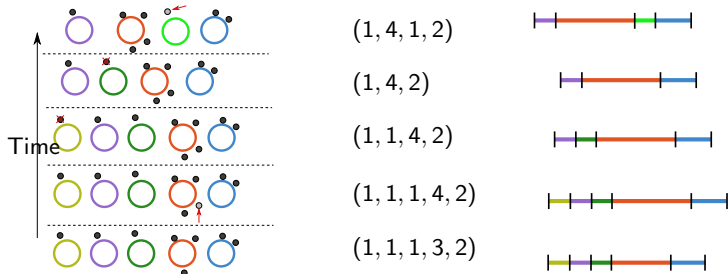
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► Composition  $(1, 1, 1, 3, 2) \Leftrightarrow$  Interval Partition 

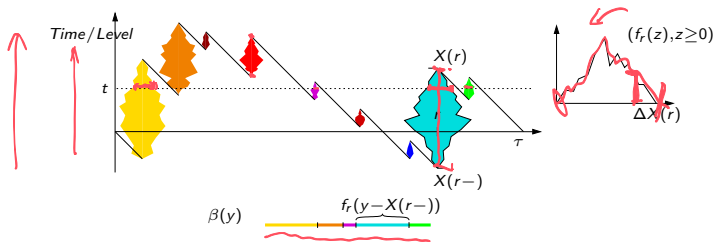


Interval-Partition Evolution:

[http://www.stats.ox.ac.uk/~winkel/5\\_sim\\_skewer.gif](http://www.stats.ox.ac.uk/~winkel/5_sim_skewer.gif)

## Construction of SSIPE

- ▶ Ideas from [Forman-Pal-Rizzolo-Winkel, EJP2020]
- ▶ A process  $(X(s), s \geq 0)$  with only positive jumps stopped at a random time  $\tau$
- ▶ Mark each jump by an excursion  $(f_r(z), z \geq 0)$ , whose length satisfies  $\inf\{z > 0: f_r(z) = 0\} = \Delta X(r) = X(r) - X(r-)$
- ▶ A table is add at position  $r$  at time/level  $X(r-)$ , whose size evolves according to  $f_r$
- ▶ **Skewer** at level  $y$ : the sizes of ordered tables at level  $y$  form an interval partition  $\beta(y)$



A simulation: [http://www.stats.ox.ac.uk/~winkel/5\\_sim\\_skewer.gif](http://www.stats.ox.ac.uk/~winkel/5_sim_skewer.gif)

## Properties of SSIPE

- ▶ Squared Bessel process  $Z$  with dimension parameter  $\delta \in \mathbb{R}$ , BESQ( $\delta$ ):

$$\underline{dZ_t = 2\sqrt{|Z_t|}d\beta_t + \delta dt.}$$

- ▶ a BESQ( $\delta$ ) is a continuous state branching process with branching mechanism  $\lambda \mapsto 2\lambda^2$  and immigration mechanism  $\lambda \mapsto \delta\lambda$

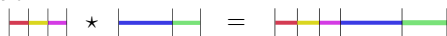
Theorem (Forman, Rizzolo, S., Winkel 2020+, F.-Pal-R.-W. AOP2021)

For  $\alpha \in (0, 1)$  and  $\theta \geq 0$ , let  $(\beta(t), t \geq 0)$  be an SSIPE( $\alpha, \theta$ ).

- ▶ It is a path-continuous strong Markov process
- ▶ (*Self-similar with index 1*) For  $c > 0$ , the space-time rescaled process  $(c\beta(t/c), t \geq 0)$  is also an SSIPE( $\alpha, \theta$ )
- ▶ The total length of intervals  $(\|\beta(t)\|, t \geq 0)$  is a *squared Bessel process* with dimension parameter  $2\theta$ , denoted by BESQ( $2\theta$ ).
- ▶ There are three phases:
  - ▶ when  $\theta \geq 1$ , it a.s. never hits  $\emptyset$
  - ▶ when  $\theta \in (0, 1)$ , it is reflected at  $\emptyset$
  - ▶ when  $\theta = 0$ , it is absorbed at  $\emptyset$

# The branching property of SSIPE

- ▶ Concatenation  $\star$ :



## Proposition (F.–Pal–R.–W. AOP2021)

Let  $\alpha \in (0, 1)$ . Consider two independent processes:

- ▶  $(\beta_1(t), t \geq 0)$ : an SSIPE( $\alpha, 0$ ) starting from  $\beta_1(0)$ ;
- ▶  $(\beta_2(t), t \geq 0)$ : an SSIPE( $\alpha, 0$ ) starting from  $\beta_2(0)$ .

Then  $(\beta_1(t) \star \beta_2(t), t \geq 0)$  is an SSIPE( $\alpha, 0$ ) starting from  $\beta_1(0) \star \beta_2(0)$ .

- ▶ The parameter  $\theta \geq 0$ : **immigration** rate.



## De-Poissonized process and Stationary Distribution

Theorem (Forman, Rizzolo, S., Winkel 2020+, F.–Pal–R.–W. AOP2021)

For an SSIPE( $\alpha, \theta$ ) ( $\beta(t), t \geq 0$ ), introduce a Lamperti/Shiga-type time change

$$\tau(u) := \inf \left\{ t \geq 0 : \int_0^t \|\beta(r)\| dr > u \right\}, \quad u \geq 0.$$

The *de-Poissonized SSIPE*( $\alpha, \theta$ ) (renormalized and time-changed)

$$\bar{\beta}(u) := \|\beta(\tau(u))\|^{-1} \beta(\tau(u)), \quad u \geq 0$$

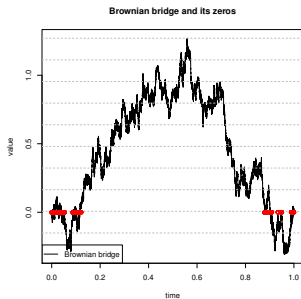
is a continuous strong Markov process on the space of unit interval partitions.

The process  $\bar{\beta}$  is stationary with Poisson–Dirichlet Interval Partition PDIP( $\alpha, \theta$ ).

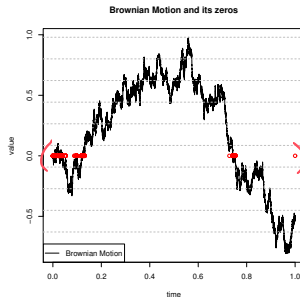
## Poisson–Dirichlet Interval Partition PDIP( $\alpha, \theta$ ) of $[0, 1]$

- ▶ PDIP( $\alpha, \theta$ ) is introduced by (Gnedin–Pitman, Pitman–Winkel).
- ▶ The ranked lengths of intervals in a PDIP( $\alpha, \theta$ ) has the law of Poisson–Dirichlet distribution ( $\alpha, \theta$ ) on the Kingman simplex.
- ▶ Stick-breaking construction
- ▶ Related to regenerative composition structures [Gnedin–Pitman].
- ▶ Examples:

PDIP( $1/2, 1/2$ ): zero points of a Brownian bridge on  $[0, 1]$  from zero to zero.



PDIP( $1/2, 0$ ): zero points of a Brownian motion on  $[0, 1]$ .



### 3. Applications

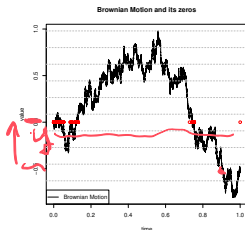
## Application I: Ray–Knight Type Theorems

- ▶ Ray–Knight theorems for Brownian motion  $B$  with local time  $(\ell_t(y), t \geq 0, y \in \mathbb{R})$ : for suitable stopping times, the total local time up to this stopping time, as a process indexed by level, is a certain **squared Bessel process**.
- ▶ Squared Bessel process  $Z$  with dimension parameter  $\delta \in \mathbb{R}$ , **BESQ**( $\delta$ ):

$$dZ_t = 2\sqrt{|Z_t|}d\beta_t + \delta dt.$$

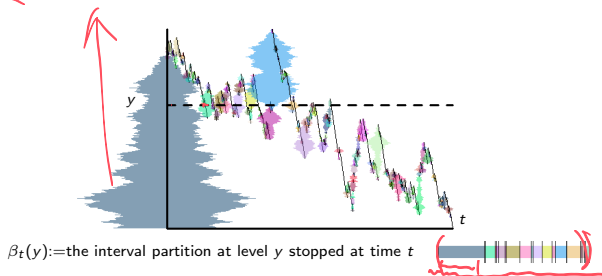
### Theorem (Ray–Knight Theorems)

1.  $x \geq 0$ .  $T_{-x}$ : the first hitting time of  $B$  at  $-x$   
The process indexed by level  $(\ell_{T_{-x}}(-x+y), y \in [0, x])$ : **BESQ**(2) starting from 0.
  2.  $z \geq 0$ .  $\tau_z$ : the first time  $\ell(\cdot, 0)$ , the local time at level 0, exceeds  $z$   
The process indexed by level  $(\ell_{\tau_z}(y), y \geq 0)$ : **BESQ**(0) starting from  $z$ .
- ▶ [LeGall–Yor1986, Carmona–Petit–Yor1994] Generalisations for Brownian motion perturbed at its past or future infimum yield general **BESQ**( $\delta$ ).



## Application I: Ray–Knight Type Theorems (conti.)

- ▶  $X$ : spectrally positive stable Lévy process of index  $1 + \alpha$ ,  $\alpha \in (0, 1)$   
Laplace exponent  $\psi(\lambda) = \frac{\lambda^{1+\alpha}}{2^\alpha \Gamma(1+\alpha)}$
- ▶  $\theta \geq 0$ .  $\underline{X} = (\underline{X}_t = \inf_{r \leq t} X_r, t \geq 0)$  and  $X^{(\theta)} = X - (1 - \frac{\alpha}{\theta})\underline{X}$ .
- ▶ Mark each jump  $(t, \Delta X_t^{(\theta)})$  of  $X^{(\theta)}$ , by an independent squared Bessel bridge, of dimension parameter  $4 + 2\alpha$  from 0 to 0, of length  $\Delta X_t^{(\theta)}$ .

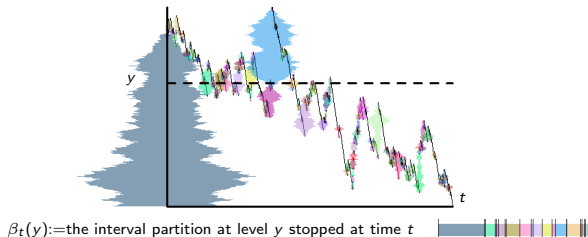


Theorem (Forman–Rizzolo–S.–Winkel 2020+, F.–Pal–R.–W. AOP2021)

1. Let  $x > 0$ ,  $T_{-x}^{(\theta)} = \inf\{t \geq 0: X_t^{(\theta)} < -x\}$ . Then the interval partition evolution  $(\beta_{T_{-x}^{(\theta)}}(-x + y), y \in [0, x])$  is an SSIPE $(\alpha, \theta)$  starting from  $\emptyset$ , with total length BESQ $(2\theta)$  starting from 0.

## Application I: Ray–Knight Type Theorems (conti.)

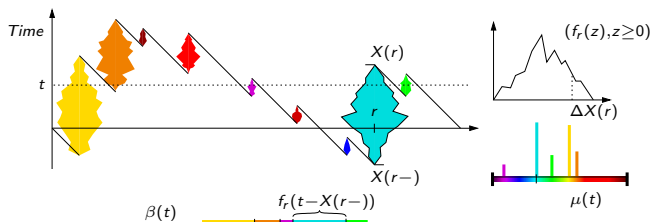
- ▶  $X$ : spectrally positive stable Lévy process of index  $1 + \alpha$ , Laplace exponent  $\psi(\lambda) = \frac{\lambda^{1+\alpha}}{2^\alpha \Gamma(1+\alpha)}$
- ▶  $\underline{X} = (\underline{X}_t = \inf_{r \leq t} X_r, t \geq 0)$  and  $Y := X - \underline{X}$ .
- ▶ Mark each jump  $(t, \Delta Y_t)$  of  $Y$ , by an independent squared Bessel bridge, of dimension parameter  $4 + 2\alpha$  from 0 to 0, of length  $\Delta Y_t$ .



## Theorem (Forman–Rizzolo–S.–Winkel 2020+)

- 2 Let  $z \geq 0$ ,  $T_{-z} = \inf\{t \geq 0: X_t < -z\}$ . the interval partition evolution  $((\beta_{T_{-z/2\alpha}}(y), y > 0))$  is an SSIPE( $\alpha, 0$ ) starting from **dust** of mass  $z$ . Its total length process is  $\text{BES}\Omega(0)$  starting from  $z$ .

## Application II: A Related Population-Genetic Model

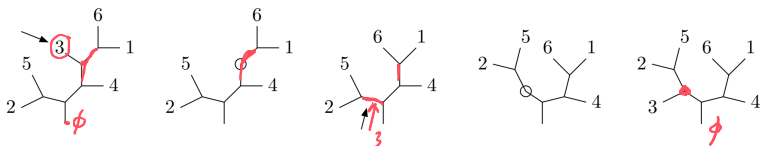


(Forman, Rizzolo, S., Winkel, AAP2022)

- ▶ A Lévy process with each jump marked by a pair  $(f_r, U_r)$ : an excursion  $f_r$  and an independent allelic type  $U_r \sim \nu_0$  (colour).
- ▶ Statistic of alleles: a measure-valued process  $(\mu(t), t \geq 0)$  associated with an SSIPE  $(\alpha, \theta)$   $(\beta(t), t \geq 0)$ .
- ▶ The **de-Poissonized** process has a stationary distribution: the Pitman–Yor distribution  $\text{PY}(\underline{\alpha}, \theta, \nu_0)$  with  $\alpha \in [0, 1)$  and  $\theta \geq 0$ .
- ▶ This two-parameter family, conjectured by (Feng–Sun, PTRF2010), generalizes the **labelled infinitely-many-neutral-alleles model** ( $\alpha = 0$ ) by (Ethier–Kurtz).

## Application III: Tree-Valued Processes

- ▶ For  $n \in \mathbb{N}$ , a random walk (Markov chain) on the space of rooted binary labelled trees with  $n$  leaves:

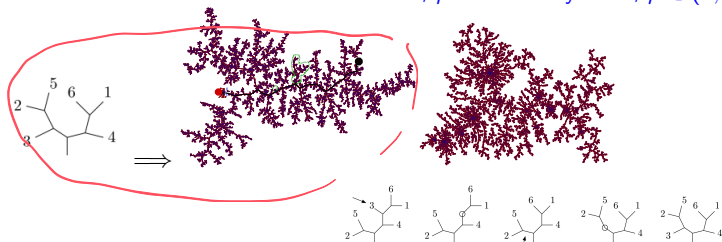


- ▶ Biological background: reconstructing phylogenetic trees from DNA data (MCMC method).
- ▶ The law of a uniform binary tree with  $n$  leaves is the stationary distribution of this random walk.
- ▶ **Question:** As  $n \rightarrow \infty$ , the scaling limits of tree-valued random walks?



# Continuum-Tree-Valued Diffusions

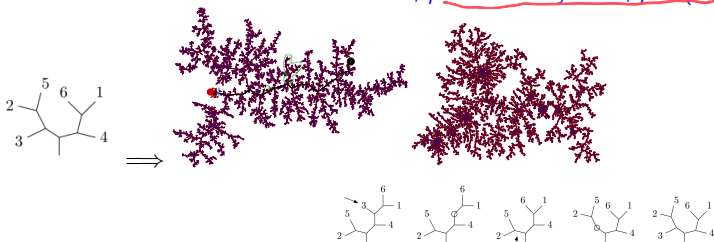
- Scaling limits of (discrete) random trees [Aldous, Duquesne–Le Gall]:  
Continuum random trees: **Brownian tree**,  $\rho$ -**Stable Lévy trees**,  $\rho \in (1, 2]$



- Scaling limits of random walks:  
**Aldous' conjecture**: there exists a limiting diffusion on the space of continuum trees, with the stationary distribution given by the **Brownian tree**.

# Continuum-Tree-Valued Diffusions

- ▶ Scaling limits of (discrete) random trees [Aldous, Duquesne–Le Gall]:  
Continuum random trees: Brownian tree,  $\rho$ -Stable Lévy trees,  $\rho \in (1, 2]$



- ▶ Scaling limits of random walks:  
**Aldous' conjecture:** there exists a limiting diffusion on the space of continuum trees, with the stationary distribution given by the Brownian tree.
- ▶ Two different approaches: (Löhr–Mytnik–Winter AOP2020) and (Forman–Rizzolo–Pal–Winkel in progress)
- ▶ **Further question:** Stable trees (S.–Winkel in progress)

## PDIPs in Continuum Random Trees [Pitman-Winkel, Rembart-Winkel]

- ▶ A  $\rho$ -stable tree is a metric space equipped with a mass measure of total mass 1.

With  $\alpha = 1 - 1/\rho$ :

masses of spinal bushes  $(M_i)_{i \geq 1}$   
 distances to the root  $(\ell_i)_{i \geq 1}$

law  $\iff$

$\beta = \{U_i, i \geq 1\} \sim \text{PDIP}(\alpha, \alpha)$ ,  
 $\alpha$ -diversity  $(\mathcal{D}_\alpha(\inf U_i), i \geq 1)$ .

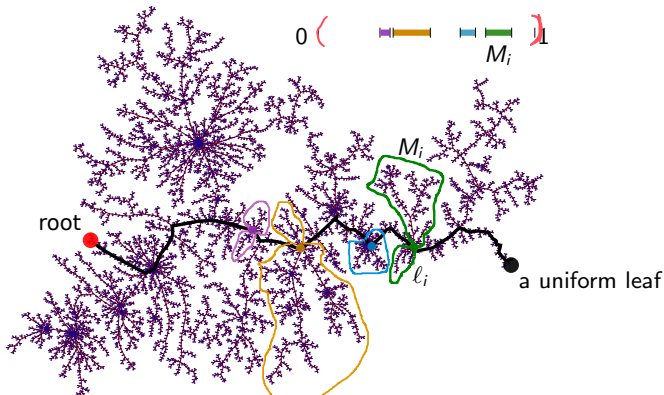
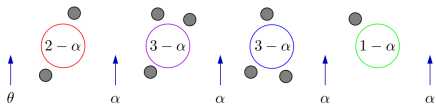


Figure: (coarse) spinal decomposition of a 1.5-stable tree © Kortchemski

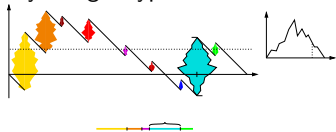
- ▶ Difficulty in the non-Brownian case: branch point with infinite degree (S., Winkel): [nested SSIPE](#)

## Summary

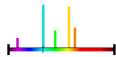
- ▶ A two-parameter family of interval-partition evolutions as scaling limit of random walks on the graph of compositions



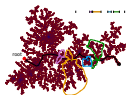
- ▶ Ray–Knight type theorems for marked Lévy processes



- ▶ Generalised labelled infinitely-many-neutral-alleles model



- ▶ Future work: scaling limit of tree-valued random walks





Q. Shi and M. Winkel.

Up-down ordered Chinese restaurant processes with two-sided immigration, diffusion limits and emigration.

[arXiv:2012.15758](https://arxiv.org/abs/2012.15758).



N. Forman, D. Rizzolo, Q. Shi and M. Winkel.

A two-parameter family of measure-valued diffusions with Poisson–Dirichlet stationary distributions.

*Ann. Appl. Probab.* 2022, 32(3), 2211–2253.



N. Forman, D. Rizzolo, Q. Shi and M. Winkel.

Diffusions on a space of interval partitions: the two-parameter model.

[arXiv:2008.02823v3](https://arxiv.org/abs/2008.02823v3) (version 3: 2022/07).

# Thanks!