# Scaling limits of multi-type Markov branching trees

Robin Stephenson University of Oxford

Joint work with Bénédicte Haas.

Based on

- Scaling limits of *k*-ary growing trees. AIHP, 2015.
- Bivariate Markov chains converging to Lamperti transform Markov Additive Processes. SPA, 2018.
- On the exponential functional of Markov Additive Processes, and applications to multi-type self-similar fragmentation processes and trees. To appear in ALEA.
- Scaling limits of multi-type Markov branching trees. In preparation.

k-ary trees

MT MB trees

MT fragmentation trees

Scaling limits

## Scaling limits of k-ary growing trees

k-ary trees o●ooooooooo	MT MB trees 0000	MT fragmentation trees	Scaling limits
Construction			

Fix an integer  $k \geqslant 2$ . We define a sequence  $(T_n(k), n \geqslant 0)$  of random  $k\text{-}\mathrm{ary}$  trees by the following recursion:

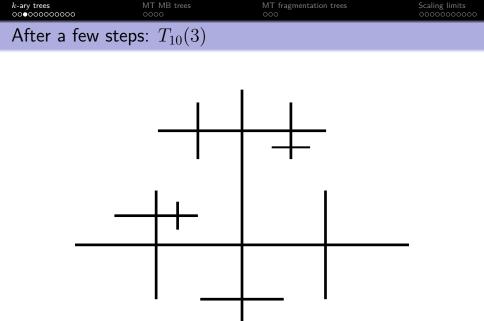
•  $T_0(k)$  is the tree with a single edge and two vertices.

k-ary trees o●oooooooooo	MT MB trees 0000	MT fragmentation trees	Scaling limits
Construction			

Fix an integer  $k \ge 2$ . We define a sequence  $(T_n(k), n \ge 0)$  of random k-ary trees by the following recursion:

•  $T_0(k)$  is the tree with a single edge and two vertices.

• given  $T_n(k)$ , to make  $T_{n+1}(k)$ , choose uniformly at random one of its edges, add a new vertex in the middle, thus splitting this edge in two, and then add k-1 new edges starting from the new vertex.



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A few observ	vations		

•  $T_n(k)$  has n internal nodes, kn + 1 edges and (k - 1)n + 1 leaves.

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A few observ	vations		

•  $T_n(k)$  has n internal nodes, kn + 1 edges and (k - 1)n + 1 leaves.

• k = 2: the algorithm constructs uniform binary trees (Rémy, 1985). It is then well-known (Aldous, 1991, 1993) that, when rescaled by  $\sqrt{n}$ , the tree  $T_n(2)$  converges in distribution to a scalar multiple of Aldous' Brownian continuum random tree.

k-ary trees 0000●0000000	MT MB trees 0000	MT fragmentation trees	Scaling limits
Scaling limit			

#### Theorem (Haas-S.,2015)

We have the following convergence as n tends to infinity

$$\frac{1}{n^{1/k}}T_n(k) \stackrel{\mathbb{P}}{\longrightarrow} \mathcal{T}_k.$$

This is a GHP convergence in probability to the measured continuum tree  $T_k$ .

k-ary trees 0000●0000000	MT MB trees 0000	MT fragmentation trees	Scaling limits
Scaling limit			

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(measure on  $T_n(k)$  = uniform measure on the leaves)

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Branching struc	ture		

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Branching structure					

Branching st			
k-ary trees 00000●000000	MT MB trees	MT fragmentation trees	Scaling limits

First, root the trees at one of the original vertices of  $T_0(k)$ .

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Let for  $n \ge 1$ :

T<sub>n</sub><sup>1</sup>,...,T<sub>n</sub><sup>k</sup> be the k subtrees rooted at the first node of T<sub>n</sub>(k).
X<sub>n</sub><sup>1</sup>,...,X<sub>n</sub><sup>k</sup> be their number of internal nodes. (sorted nonincreasingly)

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•  $T_n^1, \ldots, T_n^k$  are independent.

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Then, conditionally on  $X_n^1, \ldots, X_n^k$ ,

•  $T_n^1, \ldots, T_n^k$  are independent.

• For all *i*,  $T_n^i$  has the same distribution as  $T_{X_n^i}(k)$ .

k-ary trees MT MB trees MT fragmentation trees coordinates Scaling limits coordinates on the second second

### Proof of Markov Branching structure

Proof by induction on  $n. \ \ \, \mbox{The base case } n=1$  is immediate as everything is deterministic.

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Induction step: let e be the selected edge of  $T_{n-1}(k)$  by the algorithm.

• If  $e \in T_{n-1}^i$  for some i then apply the induction hypothesis at rank n-1 and take a step of the algorithm in  $T_{n-1}^i$ .

Proof of Markov	Branching stru	icturo	
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- If e is the "first" edge of  $T_{n-1}(k)$  then  $(T_n^1,\ldots,T_n^k)=(T_{n-1}(k),T_0(k),\ldots,T_0(k)).$  They are independent since  $T_0(k)$  is deterministic.

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This essentially ends the proof.

k-ary trees 000000000000	MT MB trees 0000	MT fragmentation trees	Scaling limits
Scaling limit			

The distribution of  $(T_n(k), n \ge 0)$  is then completely determined by the distribution of the sequences  $(X_n^1, \ldots, X_n^k)$ .

<i>k</i> -ary trees 000000000000	MT MB trees 0000	MT fragmentation trees	Scaling limits
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The distribution of  $(T_n(k), n \ge 0)$  is then completely determined by the distribution of the sequences  $(X_n^1, \ldots, X_n^k)$ . In fact, the scaling limit in distribution is also encoded in limiting properties of  $(X_n^1, \ldots, X_n^k)$ .

k-ary trees	MT MB trees	MT fragmentation trees	Scaling limits
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Scaling limit			

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Specifically, letting  $Y_n^i = \frac{X_n^i}{n}$ , we have

$$n^{1/k}\mathbb{E}[(1-Y_n^1)f(Y_n^1,\dots,Y_n^k)] \to \int_{\mathcal{S}_k} (1-x_1)f(x_1,\dots,x_k)d\nu_k(\mathbf{x})$$

where  $S_k$  is the k-1-dimensional simplex and

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$$\mathrm{d}\nu_k(\mathbf{x}) = \frac{(k-1)!}{k(\Gamma(\frac{1}{k}))^{(k-1)}} \prod_{i=1}^k x_i^{1/k-1} \left(\sum_{i=1}^k \frac{1}{1-s_i}\right) \mathbf{1}_{\{x_1 \ge x_2 \ge \dots \ge x_k\}} \mathrm{d}\mathbf{x}$$

k-ary trees 0000000000000	MT MB trees 0000	MT fragmentation trees	Scaling limits
Scaling limit			

By a theorem of Haas and Miermont ('12), this implies the convergence in distribution of  $n^{-1/k}T_n(k)$  to  $\mathcal{T}_k$ , where  $\mathcal{T}_k$  is the self-similar fragmentation tree with self-similarity index -1/k and dislocation measure  $\nu_k$ .

k-ary trees	MT MB trees	MT fragmentation trees	Scaling limits
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Informally,  $\mathcal{T}_k$  is the family tree of a branching population model where:

- individuals are characterised by their mass  $x \in (0,1]$
- for  $\mathbf{s} \in S_k$  and x > 0, an individual with mass x splits into k individuals with masses  $xs_1, \ldots, xs_k$  at rate  $x^{-1/k} d\nu_k(\mathbf{s})$ .

Generalising	the recursive of	onstruction	
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k-ary trees	MT MB trees	MT fragmentation trees	Scaling limits

How can we make the  $k\mbox{-}{\rm ary}$  construction more general?

• make k random.

Generalising the	recursive const	ruction	
k-ary trees 000000000●00	MT MB trees 0000	MT fragmentation trees	Scaling limits

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Generalising the	recursive const	ruction	
k-ary trees 000000000●00	MT MB trees 0000	MT fragmentation trees	Scaling limits

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• instead of adding a "star" at each step, add a more complex figure.

Generalising the	recursive cons	truction	
k-ary trees	MT MB trees 0000	MT fragmentation trees	Scaling limits

How can we make the k-ary construction more general?

• make k random. Can say some things, but not explicit and difficult.

• instead of adding a "star" at each step, add a more complex figure. This is interesting!

k-ary trees         MT MB trees         MT fragmentation trees         Scaling lin           00000000000         0000         0000         0000000000	

Let  $\tau$  be a fixed rooted tree. Consider the following algorithm for building random trees  $(T_n(\tau),n\geqslant 0)$ :

	growth model		
k-ary trees	MT MB trees	MT fragmentation trees	Scaling limits

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Generalised	growth model		
k-ary trees 000000000●0	MT MB trees 0000	MT fragmentation trees	Scaling limits

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Generalised growth model					

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If  $\tau$  is a star with k-1 vertices, we get the previous construction.

k-ary trees ooooooooooo	MT MB trees 0000	MT fragmentation trees	Scaling limits
Problem ?			

This sequence  $(T_n, n \in \mathbb{N})$  is not really Markov branching in the previous sense. Some vertices seem to have different roles from others.

k-ary trees	MT MB trees	MT fragmentation trees	Scaling limits
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But it is Markov branching if we take more information into account and enter the *multi-type* world.

k-ary trees	

## Multi-type Markov branching trees

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Definition			

k-ary trees	MT MB trees 0●00	MT fragmentation trees	Scaling limits 0000000000
Definition			

Consider a discrete branching population model where:

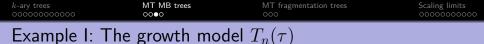
- Individuals are characterised by their size  $n \in \mathbb{N}$ , and their type  $i \in \{1, \dots, K\}$ .
- The sum of the sizes of the offspring of one individual with size  $n \in \mathbb{N}$  is at most n.

<i>k</i> -ary trees	MT MB trees	MT fragmentation trees	Scaling limits
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Definition			

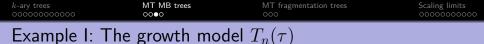
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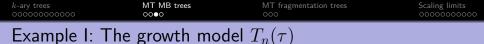
This model needs a set of offspring distributions which give, for all  $n \in \mathbb{N}$  and  $i \in \{1, \ldots, K\}$ , give the distribution of the sizes and types of the children of a (n, i) individual.



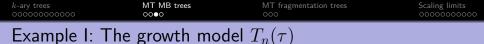
• Let K be the number of non-root vertices of  $\tau$ , and write these vertices as  $(v_i, 1 \leq i \leq K)$ .



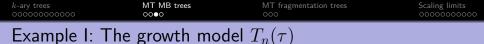
- Let K be the number of non-root vertices of  $\tau$ , and write these vertices as  $(v_i, 1 \leq i \leq K)$ .
- For all i, let T<sup>i</sup><sub>0</sub> be the subtree of τ rooted at v<sub>i</sub>, with an extra edge behind v<sub>i</sub>.



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- When an edge  $u \to v$  is broken in two, the type of the new vertex is v, and we mark it as "red".
- The size of any vertex is its number of red descendants, including itself.



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Under this notation, the sequence  $T_n^{(i)}$  is (planted) Markov branching.

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Example II. Cou	nditioned mult	i-type Galton-Wats	on troop

Consider a K-type Galton-Watson population. We will condition it on its number of individuals with a specific type, say 1.

• Let  $T_n^{(i)}$  be the family tree when we start with an ancestor of type i, and conditioned on having n vertices of type 1.

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<i>k</i> -ary trees 00000000000	MT MB trees 000●	MT fragmentation trees	Scaling limits
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This then forms a Markov Branching sequence.

k-ary trees

MT MB trees

 $\begin{array}{l} \text{MT fragmentation trees} \\ \bullet \circ \circ \end{array}$ 

Scaling limits

# The scaling limit candidates: multi-type fragmentation trees

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Definition			

k-ary trees	MT MB trees	MT fragmentation trees	Scaling limits
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Definition			

A multi-type fragmentation tree is the family tree of a branching population model where individuals are characterised by

- their mass  $x \in (0, 1]$ .
- their type  $i \in \{1, \dots, K\}$ .

<i>k</i> -ary trees	MT MB trees 0000	MT fragmentation trees ○●○	Scaling limits
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An individual with mass x and type i splits into a set of individuals with masses  $(xs_n, n \in \mathbb{N})$  and types  $(i_n, n \in \mathbb{N})$  at rate  $x^{\alpha} d\nu_i(\mathbf{s}, \mathbf{i})$ .

<i>k</i> -ary trees	MT MB trees 0000	MT fragmentation trees ○●○	Scaling limits
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The distribution of such a process is characterised by the *index of* self-similarity  $\alpha < 0$  and the dislocation measures  $\nu_i, i \in \{1, \dots, K\}$ .

Dislocation r	measures		
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Dislocation measures				

The dislocation measures are measures on the simplex-like space  $\overline{S}^{\downarrow}$  which is the space of sequences  $(\mathbf{s}, \mathbf{i}) = ((s_n, i_n), n \in \mathbb{N})$  such that

• 
$$\sum_n s_n = 1$$
 and for all  $n, s_n \ge 0$ 

- for all n,  $i_n$  is a type given to the n-th fragment
- the pairs are sorted in lexicographically decreasing order.

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The measures are allowed to have infinite total mass, however they must satisfy

$$\int_{\mathcal{S}} (1 - s_1 \mathbf{1}_{i_1 = i}) \mathrm{d}\nu_i(\mathbf{s}, \mathbf{i}) < \infty.$$

<i>k</i> -ary trees	MT MB trees	MT fragmentation trees	Scaling limits		
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We call  $\mathcal{T}_{\alpha,\nu}^{(i)}$  the tree with self-similarity index  $\alpha$  and set of dislocation measures  $(\nu_j)$ , when starting with an ancestor with characteristics (1, i).

*k*-ary trees

# Our scaling limit results

<i>k</i> -ary trees	MT MB trees	MT fragmentation trees	Scaling limits
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The general	principle		

Let  $(T_n^{(i)})$  be a K-type family of Markov branching trees,  $(X_n^{(i)},J_n^{(i)})=$  size and type of the largest individual in the first generation of  $T_n^{(i)}$ .

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 MT fragmentation trees
 Scaling limits

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## The general principle

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Assume that, for some  $\gamma>0$  and  $\beta\geqslant 0,$ 

$$\mathbb{P}[X_n^{(i)} \leqslant (1-\varepsilon)n] \underset{n \to \infty}{\sim} c_{\varepsilon}^{(i)} n^{-\gamma},$$

MT MB trees MT fragmentation trees Scaling limits 0000000000

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and

$$\forall j \neq i, \ \mathbb{P}[J_n^{(i)} = j] \underset{n \to \infty}{\sim} p_{i,j} n^{-\beta}.$$

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 $(X_n^{(i)},J_n^{(i)})={\rm size}$  and type of the largest individual in the first generation of  $T_n^{(i)}.$ 

Assume that, for some  $\gamma>0$  and  $\beta\geqslant 0,$ 

$$\mathbb{P}[X_n^{(i)} \leqslant (1-\varepsilon)n] \underset{n \to \infty}{\sim} c_{\varepsilon}^{(i)} n^{-\gamma},$$

and

$$\forall j \neq i, \ \mathbb{P}[J_n^{(i)} = j] \underset{n \to \infty}{\sim} p_{i,j} n^{-\beta}.$$

Then

$$\frac{1}{n^{\gamma}} T_n^{(i)} \xrightarrow[n \to \infty]{(d)} \mathcal{T}^{(i)}$$

where  $\mathcal{T}^{(i)}$  is a fragmentation tree with index of self-similarity  $-\gamma$  and which is:

• *K*-type if 
$$\beta = \gamma$$

• monotype is  $\beta < \gamma$ .

#### Theorem (Haas-S.,18+)

Let  $(X_n^{(i)}(k), J_n^{(i)}(k))$  be the sizes and types of the first generation in  $T_n^{(i)}$ , sorted in decreasing lexicographical ordering. Let also  $Y_n^{(i)}(k) = \frac{X_n^{(i)}(k)}{n}$ .

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 Scaling limits I: to a K-type fragmentation tree

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Assume that, for continuous f on  $\overline{\mathcal{S}}^{\downarrow}$ ,

$$n^{\gamma} \mathbb{E} \Big[ \big( 1 - Y_n^{(i)}(1) \mathbf{1}_{J_n^{(i)}(1)=i} \big) f(\mathbf{Y}_n^{(i)}, \mathbf{J}_n^{(i)}) \Big] \\ \xrightarrow[n \to \infty]{} \int_{\mathcal{S}^{\downarrow}} \big( 1 - s_1 \mathbf{1}_{i_1=i} \big) f(\mathbf{s}, \mathbf{i}) \mathrm{d}\nu_i(\mathbf{s}, \mathbf{i}) \mathrm{d}\nu$$

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 Scaling limits I: to a K-type fragmentation tree

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Then

$$\frac{1}{n^{\gamma}} T_n^{(i)} \xrightarrow[n \to \infty]{(d)} \mathcal{T}_{-\gamma,\nu}^{(i)}.$$

Application	• the growth m	odel	
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#### Theorem

Let  $k = 1 + \#\tau$ , then

$$\frac{1}{n^{1/k}}T_n(\tau) \xrightarrow[n \to \infty]{(d)} \mathcal{T}_{\tau}$$

where  $T_{\tau}$  is a multi-type fragmentation tree with index of self-similarity -1/k.

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The dislocation measures are explicit, and involve modifications of Dirichlet laws again.

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The dislocation measures are explicit, and involve modifications of Dirichlet laws again.

Actually the convergence is a.s. - see upcoming work by Sénizergues.

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 Scaling limits II: the mixing case

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 Scaling limits II: the mixing case

#### Theorem (Haas-S.,18+)

Assume this time that, if we ignore the types,

$$n^{\gamma} \mathbb{E}\Big[ (1 - Y_n^{(i)}(1)) f(\mathbf{Y}_n^{(i)}) \Big] \xrightarrow[n \to \infty]{} \int_{\mathcal{S}^{\downarrow}} (1 - s_1) f(\mathbf{s}) \mathrm{d}\nu_i(\mathbf{s}).$$

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 Scaling limits II: the mixing case

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and that, for  $j \neq i$ ,

$$n^{\beta}P(J_n^{(i)}(1) = j) \xrightarrow[n \to \infty]{} q_{i,j}$$

where  $Q = (q_{i,j})$  is the transition rate matrix of an irreducible continuous time Markov chain.

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where  $Q = (q_{i,j})$  is the transition rate matrix of an irreducible continuous time Markov chain. Then

$$\frac{1}{n^{\gamma}}T_{n}^{(i)} \xrightarrow[n \to \infty]{(d)} \mathcal{T}_{-\gamma,\nu}.$$

where  $\mathcal{T}_{-\gamma,\nu}$  is a monotype fragmentation tree.

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Scaling limits II: the mixing case

The dislocation measure  $\nu$  is given by a mixing of the  $\nu_i$ :

$$\nu = \sum_{i} \chi_i \nu_i$$

where  $\chi$  is the invariant measure of the matrix Q.

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Application I	I: Galton-Wats	on trees	

Let  $(\xi_i, i \in \{1, \dots, K\})$  be the offspring distributions of a critical *K*-type Galton-Watson process *which has finite second moments*.

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 Application II: Galton-Watson trees
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Let  $(\xi_i, i \in \{1, \dots, K\})$  be the offspring distributions of a critical K-type Galton-Watson process which has finite second moments.

Let  $T_n^{(i)}$  be a Galton-Watson tree with offspring distributions  $(\xi_j)$ , with root of type *i*, and conditioned to have *n* vertices of type 1.

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 Application II: Galton-Watson trees
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# Theorem (Haas-S., 2018+)

There exists C > 0 (which does not depend on i) such that

$$\frac{1}{\sqrt{n}}T_n^{(i)} \stackrel{(d)}{\longrightarrow} C \mathcal{T}_{\mathrm{Br}}$$

where  $\mathcal{T}_{\mathrm{Br}}$  is the Brownian continuum random tree.

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 Application II: Galton-Watson trees
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## Theorem (Haas-S., 2018+)

There exists C > 0 (which does not depend on i) such that

$$\frac{1}{\sqrt{n}}T_n^{(i)} \xrightarrow{(d)} C \mathcal{T}_{\mathrm{Br}}$$

where  $\mathcal{T}_{\mathrm{Br}}$  is the Brownian continuum random tree.

This is an improvement of a result of Miermont ('08), which gives the same convergence under exponential moments.

*k*-ary trees

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MT fragmentation trees

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# Thank you!

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Growth model:	the limiting dis	location measures	

•  $N_i =$  number of descendants of  $v_i$  in  $\tau$ 

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Growth model:	the limiting d	islocation measures	

- $N_i =$  number of descendants of  $v_i$  in  $\tau$
- $((N_{i,1}, j_{i,1}), \dots, (N_{i,p_i}, j_{i,p_i})) =$  number of descendants and types of the children of  $v_i$ .

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Growth model:	the limiting	dislocation measures	

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Growth model: the limiting dislocation measures	00

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- $\left((N_1, j_1), \ldots, (N_p, j_p)\right) =$  same for the children of the root of  $\tau.$
- $S_1$  follow  $\operatorname{Dir}(\frac{N_{i,1}}{k},\ldots,\frac{N_{i,p_i}}{k})$  and  $I_1=(j_{i,1},\ldots,j_{i,p_i})$
- $S_2$  follow  $\operatorname{Dir}(\frac{N_i}{k}, \frac{N_1}{k}, \dots, \frac{N_p}{k})$  and  $I_2 = (j_1, \dots, j_p)$

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$$\int f(\mathbf{s}, \mathbf{i}) \mathrm{d}\nu^{(i)} = \frac{\Gamma(\frac{N_i}{k})}{\Gamma(\frac{N_i-1}{k})} \mathbb{E}[f(S_1, I_1)] + \frac{\Gamma(\frac{N_i}{k})}{k\Gamma(\frac{N_i+k-1}{k})} \mathbb{E}[\frac{1}{1 - \max S_2} f(S_2, I_2)]$$

Growth model:	the limiting dis	location measures	
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- $N_i =$  number of descendants of  $v_i$  in  $\tau$
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And take the push-forward of  $u^{(i)}$  by reordering.

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GW technica	al setup		

Let  $m_{i,j} = \sum_{\mathbf{z} \in (\mathbb{Z}_+)^K} \zeta^{(i)}(\mathbf{z}) z_j$  be the average number of children of type j among the progeny of an individual of type i. Let

$$M = (m_{i,j})$$

be the *mean matrix*, which we assume irreducible in the Perron-Frobenius sense, and has largest eigenvalue 1 (= criticality).

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$$M = (m_{i,j})$$

be the *mean matrix*, which we assume irreducible in the Perron-Frobenius sense, and has largest eigenvalue 1 (= criticality). Let **a** and **b** be the left and right positive eigenvectors for the eigenvalue 1, normalised such that

$$\mathbf{a} \cdot \mathbf{1} = \mathbf{a} \cdot \mathbf{b} = 1$$

GW: the norma	lising constant		
<i>k</i> -ary trees	MT MB trees	MT fragmentation trees	Scaling limits
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Define the following quantities:

$$Q_{j,k}^{(i)} = \sum_{\mathbf{z} \in (\mathbb{Z}_+)^K} \zeta^{(i)}(\mathbf{z}) z_j z_k, \quad i, j, k \in [K], j \neq k,$$
$$Q_{j,j}^{(i)} = \sum_{\mathbf{z} \in (\mathbb{Z}_+)^K} \zeta^{(i)}(\mathbf{z}) z_j (z_j - 1), \quad i, j \in [K],$$
$$\sigma^2 = \sum_{i,j,k} a_i b_j b_k Q_{j,k}^{(i)}.$$

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Then

$$\frac{1}{\sqrt{n}}T_n^{(i)} \xrightarrow{(d)} \frac{2}{\sigma\sqrt{a_1}} \mathcal{T}_{\mathrm{Br}}$$