#### Asymptotic expansions for the profile of random trees



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#### Trees of interest

- data structures
- analysis of algo.
- real-world networks



**Comparison-based:** binary (*m*-ary) search trees, random recursive trees, preferential attachment trees

Multidimensional: quadtrees, K-d trees

Digital: digital search trees, tries

Trees are **flat** (i.e. logarithmic) and **wide**.

# Quantities of interest

**Global** quantities:

- typical depths and distances,
- maximal depths and distances,
- total pathlength (sum over all node depths),
- mode and width.

Local quantities:

- degree distribution,
- fringe subtrees.

Put simply, the profile.

# Outline

 $1. \ \, {\rm One-split} \ \, {\rm branching} \ \, {\rm random} \ \, {\rm walks}$ 

2. Profile of binary search trees: a summary

3. Main result: an asymptotic profile expansion

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**Model:** Use iid unif[0, 1] random variables  $U_1, U_2, U_3, \ldots$ 























 $X_n(k) = #\{ \text{nodes with depth } k \}, \quad k \ge 0,$  $U_n(k) = \#\{ \text{boxes with depth } k \}, \quad k \ge 0.$ 



 $X_n = (1, 2, 4, 6, 5, 0, 0, \ldots)$  $U_n = (0, 0, 0, 2, 7, 10, 0, \ldots)$ 

#### The binary search tree - three simulations



 $n = 10^{10}$ , heights between 87 and 91.

#### The binary search tree - Logplot



 $n = 10^{10}$ , heights between 87 and 91.














### The random recursive tree - three simulations



 $n = 10^{10}$ , heights between 57 and 62.













weight of  $v: 1 + d_v$ 

degree profile:  $j^{-2}$ 

**Input:** random point process  $\zeta$  on  $\mathbb{Z}$ 

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 $Z_n(k)$ : # of particles at k at time n

 $Z_0(k) = \delta_{0,k}$ 



$$Z_0 = (\ldots, 0, 0, 1_*, 0, 0, \ldots)$$

- $1 \leq \zeta(\mathbb{Z}) \leq C, \mathbb{P}(\zeta(\mathbb{Z}) > 1) > 0$  and  $\zeta$  has bounded support,
- $\mathbb{P}\left(\zeta(c\mathbb{Z}) < \zeta(\mathbb{Z})\right) > 0$  for all  $c \geq 2$ . (wlog)

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$$Z_1 = (\ldots, 0, 1, 0_*, 0, 1, 1, 0, \ldots)$$

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$$Z_2 = (\ldots, 0, 1, 1_*, 0, 0, 1, 1, 0 \ldots)$$

- $1 \leq \zeta(\mathbb{Z}) \leq C$ ,  $\mathbb{P}(\zeta(\mathbb{Z}) > 1) > 0$  and  $\zeta$  has bounded support,
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$$Z_3 = (\dots, 0, 2, 0_*, 0, 0, 2, 1, 0 \dots)$$

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BST: 
$$\zeta = (..., 0, 0_*, 2, 0, ...) = 2\delta_1$$
  
RRT:  $\zeta = (..., 0, 1_*, 1, 0, ...) = \delta_0 + \delta_1$ 

**Note:**  $\zeta$  is deterministic.

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#### 2. Profile of binary search trees: a summary

3. Main result: an asymptotic profile expansion

### Binary search tree - a rough picture



For  $k = \alpha \log n + o(\log n)$ , as  $n \to \infty$ ,

$$U_n(k) = n^{\eta(\alpha) + o(1)}, \quad \alpha_- < \alpha < \alpha_+.$$

As  $n \to \infty$ ,

$$\frac{D_n - 2\log n}{\sqrt{2\log n}} \stackrel{d}{\to} \mathcal{N}$$

and

Height  $\sim \alpha_+ \log n$ , Fill-up level  $\sim \alpha_- \log n$ .

Devroye '86 -'88

### Profile - central regime



With

$$x_n(k) := \frac{k - 2\log n}{\sqrt{2\log n}},$$

uniformly over  $k \in \mathbb{N}$ , almost surely and in mean,

$$U_n(k) = \frac{n}{\sqrt{2\pi \cdot 2\log n}} \cdot e^{-\frac{1}{2}x_n^2(k)} \cdot (1+o(1)).$$

HWANG '95, CHAUVIN, DRMOTA AND JABBOUR-HATTAB '01

## Width and mode



$$W_n := \max\{U_n(k) : k \ge 1\}$$
$$m_n := \max\{k : U_n(k) = W_n\}$$

$$W_n = \frac{n}{\sqrt{4\pi \log n}} \cdot (1 + o(1))$$

**Open**: Limit theorem for  $W_n$ 

The sequence

$$(m_n - 2\log n)_{n\geq 1}$$

is tight.

Devroye and Hwang '06

Open: Limit theorem for  $m_n - 2 \log n$ 

Theorem (HWANG '95)

For C > 0, uniformly in  $0 \le k \le C \log n$ , as  $n \to \infty$ ,

$$\mathbb{E}\left[U_n(k)\right] \sim \frac{1}{\Gamma(\alpha_k) \cdot \sqrt{2\pi\alpha_k}} \cdot \frac{n^{\eta(\alpha_k)}}{\sqrt{\log n}}, \quad \alpha_k = \frac{k}{\log n}.$$

Theorem (Chauvin, Klein, Marckert and Rouault '05)

There exists a random analytic function X on a complex domain G with  $(\alpha_{-}, \alpha_{+}) \subseteq G$  with  $\mathbb{E}[X(\alpha)] = 1$  and X > 0 on  $(\alpha_{-}, \alpha_{+})$ :

$$\sup_{\alpha_k\in(\overline{\alpha_-},\overline{\alpha_+})}\left|\frac{U_n(k)}{\mathbb{E}\left[U_n(k)\right]}-X(\alpha_k)\right|\xrightarrow{a.s.}0.$$

## The special regimes

The limit  $X(\alpha)$  is random if  $\alpha \notin \{1, 2\}$ .

Theorem (Fuchs, Hwang and Neininger '06)

Let  $c \in \{1, 2\}$ . For  $k = c \log n + c_n$  with  $c_n = o(\log n)$  and  $|c_n| \to \infty$ , we have

 $U_n(k)^* \stackrel{d}{\longrightarrow} (X'(c))^*.$ 

 $(U_n(k)^*)_{n\geq 1}$  does not converge in distribution if  $c_n = O(1)$ .

For  $P_n := \sum_k k \cdot U_n(k)$ :

 $P_n^* \xrightarrow{a.s.} (X'(2))^*.$ 

Régnier '89, Rösler '91

### The internal profile



$$2^{k} - X_{n}(k) = n^{\eta(\alpha) + o(1)}, \quad \alpha_{-} < \alpha < 1.$$

Analogous mean expansions and limit theorems for

$$X_n(k) \qquad \text{for } \frac{k}{\log n} \in (\overline{1}, \overline{\alpha_+}),$$
  
$$2^k - X_n(k) \quad \text{for } \frac{k}{\log n} \in (\overline{\alpha_-}, \overline{1}).$$

HWANG '95, CHAUVIN, DRMOTA AND JABBOUR-HATTAB '01

## Techniques and references

#### FORWARD

- JABBOUR-HATTAB '01
- Chauvin, Drmota and Jabbour-Hattab '01
- Chauvin, Klein, Marckert and Rouault '05
- Katona '05
- LABARBE '08
- Schopp '10
- Mailler and Marckert '17



#### BACKWARD

- Drmota and Hwang '04
- Drmota and Hwang '05
- Fuchs, Hwang and Neininger '06
- Devroye and Hwang '06
- Hwang '07
- Drmota, Janson Neininger '08



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## Classical Chebyshev-Edgeworth-Cramér expansion

Let  $Z_1, Z_2, \ldots$  be iid integer random variables with

- $\mathbb{E}\left[e^{tZ_1}\right] < \infty$  in a neighbourhood of 0,
- $\mathbb{E}[Z_1] = 0$ ,  $Var(Z_1) = 1$ ,
- $Z_1$  is not concentrated on a non-trivial sublattice.

Then, with  $S_n = Z_1 + \cdots + Z_n$ ,  $x_n(k) = \frac{k}{\sqrt{n}}$  and  $r \in \mathbb{N}_0$ :

$$n^{\frac{r+1}{2}} \sup_{k \in \mathbb{Z}} \left| \mathbb{P}(S_n = k) - \frac{e^{-\frac{1}{2}x_n^2(k)}}{\sqrt{2\pi n}} \sum_{s=0}^r \frac{Q_s(x_n(k))}{n^{s/2}} \right| \to 0,$$

where  $Q_s$  is a polynomial of degree 3s expressed through the cumulants  $\kappa_2, \ldots, \kappa_{s+2}$ .  $Q_0 = 1$  and

$$Q_1(x) = \frac{\kappa_3}{6} \operatorname{He}_3(x), \quad Q_2(x) = \frac{\kappa_4}{24} \operatorname{He}_4(x) + \frac{\kappa_3^2}{72} \operatorname{He}_6(x).$$

## Profile expansion for the binary search tree

Theorem (KABLUCHKO, MARYNYCH AND S. '16)

Let  $U_n(k)$  be the external profile of a sequence of random binary search trees. Set

$$x_n(k) = x_n(k; \alpha) = \frac{k - \alpha \log n}{\sqrt{\alpha \log n}}, \quad \frac{\alpha_k}{\log n} = \frac{k}{\log n}.$$

*Fix*  $r \ge 0, K \subseteq (\alpha_-, \alpha_+)$  *compact. Uniformly in*  $k \in \mathbb{N}$  *and*  $\alpha \in K$ 

$$\left(\log n\right)^{\frac{r+1}{2}} \left| \frac{U_n(k)}{n^{\alpha-1-\alpha_k \cdot \log \alpha/2}} - \frac{e^{-\frac{1}{2}x_n^2(k)}}{\sqrt{2\pi \cdot \alpha \log n}} \sum_{s=0}^r \frac{F_s(x_n(k);\alpha)}{(\log n)^{s/2}} \right| \xrightarrow{a.s.} 0,$$

where  $F_s(x; \alpha)$  is a polynomial in x of degree 3s whose coefficients are linear combinations of

 $X(\alpha),\ldots,X^{(s)}(\alpha).$ 

## Profile expansion for the binary search tree

$$\left(\log n\right)^{\frac{r+1}{2}} \left| \frac{U_n(k)}{n^{\alpha-1-\alpha_k \cdot \log \alpha/2}} - \frac{e^{-\frac{1}{2}x_n^2(k)}}{\sqrt{2\pi \cdot \alpha \log n}} \sum_{s=0}^r \frac{F_s(x_n(k);\alpha)}{(\log n)^{s/2}} \right| \xrightarrow{a.s.} 0,$$

where  $F_0(x; \alpha) = X(\alpha)$  and

$$F_{1}(x;\alpha) = \frac{X'(\alpha)}{\sqrt{\alpha}}x + \frac{X(\alpha)}{6\sqrt{\alpha}}\mathsf{He}_{3}(x),$$

$$F_{2}(x;\alpha) = \frac{X''(\alpha)}{2\alpha}\mathsf{He}_{2}(x) + \left(\frac{X(\alpha)}{24\alpha} + \frac{X'(\alpha)}{6\alpha}\right)\mathsf{He}_{4}(x)$$

$$+ \frac{X(\alpha)}{72\alpha}\mathsf{He}_{6}(x),$$

and the first Hermite polynomials are

$$\begin{aligned} &\mathsf{He}_2(x) = x^2 - 1, &\mathsf{He}_3(x) = x^3 - 3x, \\ &\mathsf{He}_4(x) = x^4 - 6x^2 + 3, &\mathsf{He}_6(x) = x^6 - 15x^4 + 45x^2 - 15. \end{aligned}$$

### External BST profile - central regime

**Recall:** For  $k = 2 \log n + c_n$  and  $c_n = O(1)$ , the sequence  $\left(\frac{U_n(k) - \mathbb{E}[U_n(k)]}{\sqrt{\operatorname{Var}(U_n(k))}}\right)_{n \ge 1}$ 

does not converge in distribution.

Corollary (KABLUCHKO, MARYNYCH AND S. '16)

Let  $k = \lfloor 2 \log n \rfloor + a$  with  $a \in \mathbb{Z}$ . Then, as  $n \to \infty$ ,

$$\frac{(\log n)^{3/2}}{n} (U_n(k) - \mathbb{E}[U_n(k)]) - \frac{\chi'(2)}{4\sqrt{\pi}} (\{2\log n\} + a + 1/2)$$
$$\xrightarrow{a.s.}{\rightarrow} -\frac{\chi - \mathbb{E}[\chi]}{8\sqrt{\pi}},$$

where  $\{x\} := x - \lfloor x \rfloor$  and  $\chi = X''(2) - X'(2)^2$ .

## External BST profile - mode

**Recall:**  $m_n - 2 \log n, n \ge 1$  is a tight sequence.

Corollary (KABLUCHKO, MARYNYCH AND S. '16)

For all *n* sufficiently large,  $m_n$  takes its value(s) in the set

 $\{\lfloor 2 \log n + X'(2) - 1/2 \rfloor, \lceil 2 \log n + X'(2) - 1/2 \rceil\}.$ 

For a set of asymptotic frequency 1,  $m_n$  is equal to the integer closest to

 $2 \log n + X'(2) - 1/2.$ 

### The width - more periodicities

**Recall:**  $W_n \sim \frac{n}{\sqrt{4\pi \log n}}$  almost surely.

Corollary (KABLUCHKO, MARYNYCH AND S. '16)

Let

$$\overline{W}_n := 4 \log n \left( 1 - \frac{\sqrt{4\pi \log n} W_n}{n} \right).$$

Then,

$$\overline{W}_n - \theta_n^2 \xrightarrow{a.s.} \chi - \frac{1}{12}$$

where

$$\chi = X''(2) - X'(2)^2,$$
  

$$\theta_n = \min_{k \in \mathbb{Z}} |2 \log n + X'(2) - 1/2 - k|.$$

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## Discussion - the proof

Fourier inversion using

$$W_n(\lambda) = \sum_{k \in \mathbb{N}} U_n(k) \cdot e^{\lambda k}, \quad \lambda \in \mathbb{C}.$$

Then,

$$\mathbb{E}\left[W_n(\lambda)\right] = rac{n^{2e^{\lambda}-1}}{\Gamma(2e^{\lambda})} \cdot (1+o(1)), \quad \Re(\lambda) > 0.$$

BROWN AND SHUBERT '84, JABBOUR-HATTAB '01

Theorem (CHAUVIN, KLEIN, MARCKERT, ROUAULT '05)

There exists a complex domain G with  $(\log \frac{\alpha_{-}}{2}, \log \frac{\alpha_{+}}{2}) \subseteq G$  such that, almost surely, uniformly on compact sets  $K \subseteq G$  with polynomial rate of convergence,

$$\frac{W_n(\lambda)}{\mathbb{E}\left[W_n(\lambda)\right]} \to W(\lambda),$$

and  $X(\alpha) = W(\log \frac{\alpha}{2})$ .

BIGGINS '77, '92

## Discussion - generalisations

Analogous expansions for

• general profiles  $A_n(k), k \in \mathbb{Z}, n \ge 1$  with

$$e^{-w_n\cdot arphi(\lambda)}\cdot \sum_{k\in\mathbb{Z}} A_n(k)\cdot e^{\lambda k} o \Psi(\lambda),$$

with an analytic function  $\boldsymbol{\Psi},$  where

- $w_n o \infty$ ,
- $\varphi$  is strictly convex on  $\mathbb{R}$ ,
- the convergence is exponential in w<sub>n</sub> on compact subsets of a domain close to the real axis,
- $e^{-w_n \cdot \varphi(\theta)} \cdot \sum_{k \in \mathbb{Z}} A_n(k) \cdot e^{(\theta + i\eta)k} \to 0$  for  $\varepsilon < |\eta| < \pi$  with exponential rate of convergence.
- the profile of one-split branching random walks,
- the expected profile if  $\zeta(\mathbb{Z})$  is deterministic,
- standard lattice BRWs

Grübel and Kabluchko '15

## Summary and conclusion

- full uniform asymptotic profile expansion,
- precise information on occupation numbers, mode and width can be extracted almost automatically,
- extends to more general profiles  $A_n(k), k \in \mathbb{Z}, n \ge 1$  upon controlling

$$\sum_{k\in\mathbb{Z}}^{\infty}A_n(k)\cdot e^{\lambda k}.$$

• martingale-free trees? Split trees?

## THANK YOU