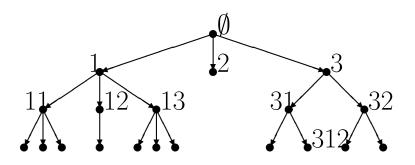
# STOCHASTIC FIXED POINTS on D

Uwe Roesler

- Weighted Branching Process
- $\bullet$  Stochastic Fixed Points on  ${I\!\!R}$
- Stochastic Fixed Points on D
- chasing all
- Example Quicksort process If necessary
- Quicksort Process
- Discrete Partial Quicksort
- Convergence results

# WEIGHTED BRANCHING PROCESS Uwe Rösler

Tree V with Ulam-Harris notation



Random weights  $L_e: \Omega \to G$  on edges e = (v, vi),

(G, \*) a semi group (with grave), often  $G \subset H^H$  with composition

Random weights  $L_e: \Omega \to G$  on pathes e = (v, vw)

Weighted Branching Process iff  $(L_{v,vi})_{i \in \mathbb{N}}, v \in V$  iid

#### Ex: BGW, BRW

Ex: Branching Processes or Markovian BP

Ex: **BP** with continuous time,  $L_{v,vi}$  as life time,

- Ex: Splitting processes,
- interval splitting
- Kolmogorov rock crushing
- application in biology (genealogical tree)
- algorithms (divide and conquer algorithms, Quicksort)

Uwe Rösler: WBP

Ex: **Kingman process** as time transformed splitting process

WBP, dynamic is splitting a subset  $A \subset \mathbb{N}$  into two – choose  $p \in [0, 1]$  uniform distribution

– take iid Bernoulli  $B_i, i \in \mathbb{N}$  to parameter p

$$-A_1 := \{ a \in A \mid B_a = 1 \} \qquad A_2 = A \setminus A_1$$

- start with  $I\!N$  on root

Symmetry of edges and vertices,  $V \ni v \mapsto (L_{v,vi})_i$ Skip root  $\emptyset$ , e.g.  $v = (v_1, v_2, \dots, v_n) \in \mathbb{N}^*, \ L_v = L_{\emptyset,\emptyset v}$ 

#### STOCHASTIC FIXED POINTS

Stochastic fixed point equation (SFPE)

$$X \stackrel{\mathcal{D}}{=} f(X_1, X_2, X_3, \ldots)$$

where X iid rvs and random variable f independent of X-rvs.

The distribution of X is a solution (SFP).

Why interested in **distribution**? Obviously exists versions of solution satisfying

$$X = f(X_1, X_2, X_3, \ldots)$$

Easier and.... For simplicity on  $I\!\!R$  and f linear or affin

$$X \stackrel{\mathcal{D}}{=} \sum_{i \in \mathbb{N}} A_i X_i \qquad X \stackrel{\mathcal{D}}{=} \sum_{i \in \mathbb{N}} A_i X_i + C$$

homogeneous sum-type and inhomogeneous sum-type. C stands for cost or toll.

Iterate inhomogeneous equation with equality

$$X = C + \sum_{i \in \mathbb{N}} A_i C_i + \sum_{i,j \in \mathbb{N}} A_i A_{i,j} X_{i,j} = \dots$$
$$= R_n + \sum_{|v|=n} L_v X_v$$
$$R_n = \sum_{|v| < n} L_v C_v$$

Choose  $((L_{v,vi})_{i \in \mathbb{N}}, C_v)$ ,  $v \in V$  as iid. Show  $R_n \to_n R$ a.e. (contraction method or martingale) and  $\Sigma_{|v|=n} L_v X_v \to$ 0 disappears in distribution. Possible. Solution is R. **Endogenous** solution. **Forward** solution. Boundary at root. Probability. Uwe Rösler: WBP

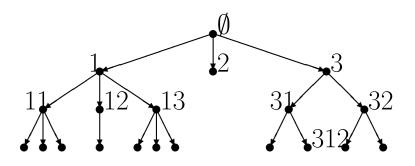
Iterate homogeneous equation with equality

$$X = \sum_{i,j \in \mathbb{N}} A_i A_{i,j} X_{i,j} = \ldots = \sum_{|v|=n} L_v X_v$$

For every n exists versions of  $X_v$ , |v| = n satisfying the above with equality. But in the limit???? If we consider only distributions then by Kolmogorovs projective limit exists a projective distribution. That does the job.

**Backward** solution. Boundary at infinity. Measure theory.

non endogenous solutions, influence of boundary



#### MOTIVATION for SFP

Ex: Divide and conquer algorithm provides

$$X_{n+1} \stackrel{\mathcal{D}}{=} \sum_{i} A_{n,i} X_{n,i} + C_n$$

assume ...

$$X \stackrel{\mathcal{D}}{=} \sum_{i} A_i X_i + C$$

Solve. Limiting object.

Ex:  $\alpha$ -stable-distributions  $\alpha \in (0, 2]$  (=Limit of sums of iid)

 $X \alpha$ -stable distribution iff  $X \stackrel{\mathcal{D}}{=} aX_1 + bX_2 + c$ for all  $a, b \in \mathbb{R}$  satisfying  $|a|^{\alpha} + |b|^{\alpha} = 1$  and exists c.

Replace for all by some specific a, b, c. Is solution  $\alpha$ -stable? Unique solution? Alsmeyer-Roesler '05

Ex: **Quicksort** Result on asymptotic running time. Recursion for running time. Limit is SFPE.

$$X \stackrel{\mathcal{D}}{=} UX_1 + (1 - U)X_2 + C(U)$$

 $C(x) = 2x \ln x + 2(1-x) \ln(1-x) + 1$ 

 $L^2$ -Solution Roesler 91,92.

# ALL SFPs on the REALS

Motivation for studying SFPs in its own arose by Quicksort. With contraction method invented there, 30-40 different divide and conquer algorithms could be treated, Neininger, Rüschendorf, ... '01, '02, '04, '06 ... Metrics Wasserstein and Zolotarev

Rueschendorf: General solution of inhomogeneous is sum of general solution of homogeneous and some special solution of inhomogeneous.

Fill and Janson '00 found all solutions for Quicksort SFE, symmetric 1-stable.

Jagers and Roesler '04 Supremums and infimums type equations

SFPE on  $I\!\!R_+$  and finitely many weights, Liggett, Liu on  $I\!\!R$  Caliebe '03, finite variance and finite first moment, (via triangle scheme)

Spitzmann: Partial results on  $I\!\!R$  and connection with inhomogeneous solutions

General solution on  $I\!\!R$  for finite number of weights, Alsmeier-Biggins-Meiners '12 Iff conditions for all solutions. These are mixtures of  $\alpha$ -stable distributions.  $\alpha$  determined by  $m(\alpha) = 1$  where  $\beta \to m(\beta) = E(\Sigma_i |L_i|^{\alpha})$ Solutions are

$$R + W^{1/\alpha}Y$$
$$W \stackrel{\mathcal{D}}{=} \sum_{i} |L_i|^{\alpha} W_i$$

Solutions in  $I\!\!R^d$  Mentemeier '12

### **CADLAG-PROCESSES** as SFPs

 $X = (X(t))_{t \in [0,1]}$  with cadlag pathes

$$X \stackrel{\mathcal{D}}{=} f(X_1, X_2, X_3, \ldots)$$

 $f, X_i, i \in \mathbb{N}$  independent, every  $X_i$  distributed as XRestrict us to affin f

$$X \stackrel{\mathcal{D}}{=} \sum_{j} T_j * X_j + C$$

where  $T_j$  is random operator on D, space and time transformation

Ex: Brownian motion

$$X \stackrel{\mathcal{D}}{=} \sqrt{U}X_1 + \sqrt{1 - U}X_2$$

U another independent rv, values in [0, 1] or

$$X \stackrel{\mathcal{D}}{=} (UX_1(\frac{t}{U} \wedge 1) + (1-U)X_2(\frac{t-U}{1-U} \vee 0))_t$$

Ex: Cauchy

$$X \stackrel{\mathcal{D}}{=} UX_1 + (1 - U)X_2$$

solved by symmetric Cauchy(b) distribution, density  $x \mapsto \frac{b}{\pi(b^2+x^2)}$  and by constants. **Or** 

$$X \stackrel{\mathcal{D}}{=} (U^2 X_1(\frac{t}{U} \wedge 1) + (1 - U)^2 X_2(\frac{t - U}{1 - U} \vee 0))_t$$

Ex: **Levy processes** Analogous space-time transformation

Ex: **Find** Analysis of algorithms, Gruebel-Roesler '96

$$X \stackrel{\mathcal{D}}{=} (\mathbbm{1}_{t < U}) U X_1(\frac{t}{U}) + \mathbbm{1}_{t \ge 1} (1 - U) X_2(\frac{t - U}{1 - U}) + 1$$

U uniformly distributed on [0, 1]

Neininger-Sulzbach '12, general functional contraction method with Zolotarev metric on  ${\cal D}$ 

# QUICKSORT on the FLY

Conrado Martinéz: Partial Quicksort

Input: sequence of length n

Output: l smallest in order

Procedure: Recall Quicksort always for left most list with 2 or more elements

Publish first smallest then second smallest and so on

**Observation:** Algorithms does only necessary comparisons

Y(n, l) number of comparisons for input  $U_{|n|}$   $X(n, \frac{l}{n}) = \frac{Y(n,l) - EY(n,l)}{n}$  **Theo** Martinéz '04 Explicit formula for E(Y(n, l))

Theo Roesler '13

 $X(n, \ldots)$  converges in Skorodhod metric almost surely to Quicksort process.

#### SEARCH for EXAMPLES

Quicksort, limit SFP, All solutions Fill-Janson '00 Quicksort process on D by contraction method

$$X \stackrel{\mathcal{D}}{=} (\mathbbm{1}_{t < U} U X_1(\frac{t}{U} \wedge 1) + (1 - U) X_2(\frac{t - U}{1 - U}) + C(U, t))_t$$

U uniform independent Discrete to continuous process, Knof '06 for finite dimensional distribution, Ragab-Roesler '11, convergence in distribution, Roesler '13 point wise in Skorodhod

Again endogenous and non endogenous solutions

Better work with caglad functions (caglad =left continuous with right limits)

Here functions on [0, 1] and X(0) = 0

$$X \stackrel{\mathcal{D}}{=} (UX_1(\frac{t}{U} \wedge 1) + (1-U)X_2(\frac{t-U}{1-U} \vee 0) + C(U,t))_t$$

#### **ALL CADLAG-PROCESSES as SFPs**

Class of processes

$$X \stackrel{\mathcal{D}}{=} \sum_{j} A_j \cdot X_j \circ \varphi + C$$

 $A_j, C$  rvs *D*-valued,  $\varphi$  random time change

How many solutions has the Quicksort process SFPE?

For Quicksort: sum of ordinary QD and symmetric Cauchy distribution, Fill-Janson '00

Theo Roesler '18

For Quicksort process: sum of QP and symmetric Cauchy process

$$R + a \mathrm{Id} + bY$$

with  $a, b \in \mathbb{R}$ ,  $b \geq 0$ , R, Y independent, R solves the inhomogeneous SFPE and Y is a standard Cauchy process.

The standard Cauchy process solves the homogeneous SFPE

$$X \stackrel{\mathcal{D}}{=} (UX_1(\frac{t}{U} \wedge 1) + (1-U)X_2(\frac{t-U}{1-U} \vee 0))_t$$

Uwe Rösler: WBP

Idea of proof: Take view of equality of random variables. and iterate via WBP

$$Y_{v} = (\mathbb{1}_{U_{v}>t}UY_{v1}(1 \wedge \frac{t}{U_{v}}) + \mathbb{1}_{U_{v} \le t}(1 - U_{v})Y_{v2}(\frac{t - U_{v}}{1 - U_{v}})))_{t}$$

Consider equations at time t = 1

$$Y_v(1) = U_v Y_{v1}(1) + (1 - U_v) Y_{v2}(1)$$

If we know all  $Y_v(1)$  then process Y uniquely defined at the points Y(t) where t are the times (places) of the pivots. These are dense in the limit and by continuity the path of Y is known.

#### DIRTY RECURSIONS

Recursion for Y

 $Y(x, l) = Y(x^{1}, l \wedge |x^{1}|) + Y(x^{2}, 0 \vee (l - |x^{1}| - 1)) + |x| - 1$ and then take  $x = U_{|n}$ . Recursion for X(n)

Real strength of contraction method shows up for 'dirty' recursions

$$X(n) \stackrel{\mathcal{D}}{=} \sum_{i} L_i(I(n)) X_i(I(n)) + C(I(n))$$

 $(L_i(\cdot))_i, C(\cdot), I(n)), X(j), \ j < n$  independent, I(n) < n

Assume:  $I(n) \to_n \infty$ ,  $L_i(n) \to_n L_i$ ,  $C(n) \to_n C$ Hope:  $X(n) \to X$  and

$$X \stackrel{\mathcal{D}}{=} \sum_{i} L_i X_i + C$$

With 'nice' metric d on distributions

d(X(n), X) function of  $d(L_i(I(n)), L_i), d(X_i(I(n)), X_i), d(C(I_n shows convergence to 0.$ 

# CONVERGENCE of finite dimensional DISTRIBUTIONS

#### **Theorem** Martinez-Roesler

The one-dimensional distributions of X(n) converge.

### Theorem Ragab-Roesler

All finite dimensional distributions of X(n) converge to the ones of the Quicksort process.

As consequence exists versions of X(n) converging in Skorodhod metric to version of QP

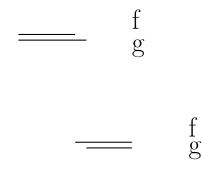
Find algorithmic versions.

**Theorem** Roesler Let  $U_i$ ,  $i \in \mathbb{N}$ , be independent uniformly distributed. Then  $X(n, \cdot)$  converges almost surely to a version of the Quicksort process X in Skorodhod metric on D.

Deterministic algorithm, but random input.

#### SKORODHOD SPACE D

D equipped with Skorodhod metric d $d(f,g) = \inf\{\epsilon > 0 \mid \exists \lambda \in \Lambda : \|f-g \circ \lambda\|_{\infty} < \epsilon, \|\lambda-\operatorname{id}\|_{\infty} < \epsilon\}$ where  $\Lambda$  is the set of all bijective increasing functions  $\lambda : [0,1] \to [0,1].$ 



Big distance in supremum metric, small in Skorodhod metric

**Theo:** Alsmeyer-Biggins-Meiners

 $N = \Sigma_i \mathbbm{1}_{L_i \neq 0} < \infty$  a.e., distribution on  $\mathbb{R}$ 

 $-(0,\infty)$  is smallest closed multiplicative group generated by strictly positive factors

$$-m(0) > 1$$

$$-\exists \alpha \in (0,2] : m(\alpha) = 1$$

$$-\forall 0 < \beta < \alpha : 1 < m(\beta)$$

Then  $\psi(t) = \prod_{|v|=n} \psi_v(L_v t)$  *L*-a.e. for all *t* by martingale argument for Fourier transform. For given *L* – infinitely divisible distribution,

– parameters in Levy representation satisfy fixed point equation,

– then stable.

$$\ln \psi(t) = \begin{cases} -cW|t|^{\alpha}(1-i\beta\frac{t}{|t|}\tan(\frac{\pi\alpha}{2})) & \text{if } \alpha \notin \{1,2\} \\ i\gamma Wt - cW|t| & \text{if } \alpha = 1 \\ -\sigma^2 Wt^2 & \text{if } \alpha = 2 \end{cases}$$

Remark:  $N = \infty$ ?

#### Mixtures of stable distributions

### **INHOMOGENOUS SFE**

Best result on the reals **Theo** Meiners '10 Assumptions as before and on CSet of **all** solution are distributions of

$$W^* + W^{1/\alpha}Y$$

where

 $-(W^*, W), Y$  are independent,

- $-W^*$  is one solution of inhomogeneous SFE,
- $-W \ge 0$  solves  $W \stackrel{\mathcal{D}}{=} \Sigma_j |L_j|^{\alpha} W_j$

-Y has stable distribution to parameters

$$(\gamma, c, \beta) \in \begin{cases} \{0\} \times [-1, 1] \times [0, \infty) & \text{if} \quad \alpha \notin \{1, 2\} \\ I\!R \times \{0\} \times [0, \infty) & \text{if} \quad \alpha = 1 \\ \{0\} \times \{0\} \times [0, \infty) & \text{if} \quad \alpha = 2 \end{cases}$$

### SFE of SUPREMUM TYPE

On positive reals

$$X \stackrel{\mathcal{D}}{=} \sup_{j} L_j X_j + C$$

Jagers-Roesler, more than those expected by SFE of sum type

Rueschendorf, Alsmeyer

'complete' results