

The QUICKSORT PROCESS

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- Online Quicksort streaming
- Mathematical formulation
- Results: Quicksort process in D
- Abstraction and Reflection
- Embedding into weighted branching process

QUICKSORT STREAMING

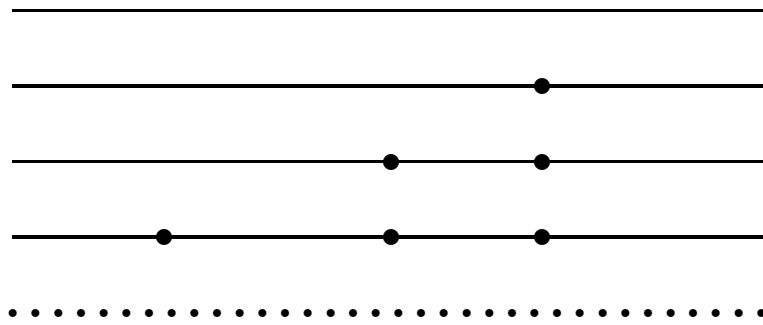
Algorithm: QUICKSORT STREAMING

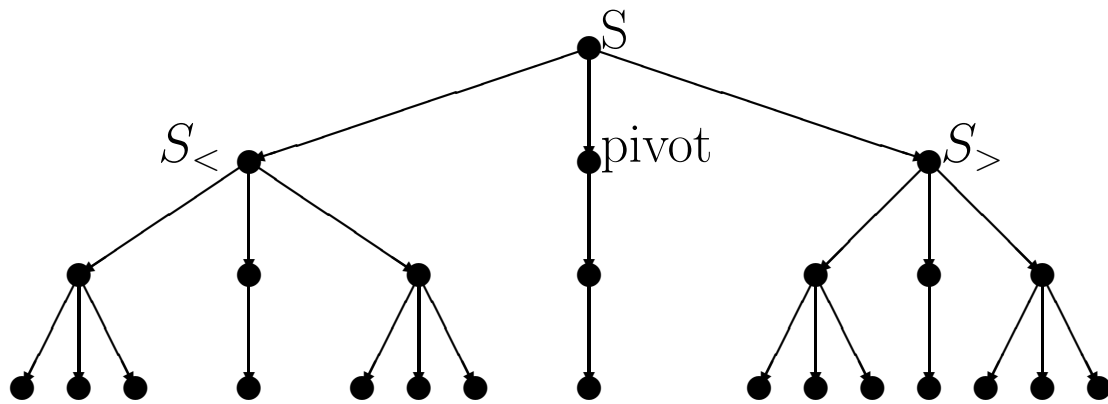
Input: Set S of n different reals.

Output: Online the smallest, then second smallest and so on.

Procedure: Divide like in Quicksort, continue with left list.

- Choose random pivot within S
- Split S into $S_{<}$, $\{ \text{pivot} \}$, $S_{>}$, stored in this order.
- Continue with $S_{<}$ recursively unless empty.
- If $|S_{<}| = 1$ output the element. Continue with next list.





78, 90, 46, 60, 88, 24, 95, 47, 98

78, 46, 60, 24, 47, **88**, 90, 95, 98

24, **46**, 78, 60, 47, **88**, 90, 95, 98

publish 24 and 46

60, 47, **78**, **88**, 90, 95, 98

47, 60, **78**, **88**, 90, 95, 98

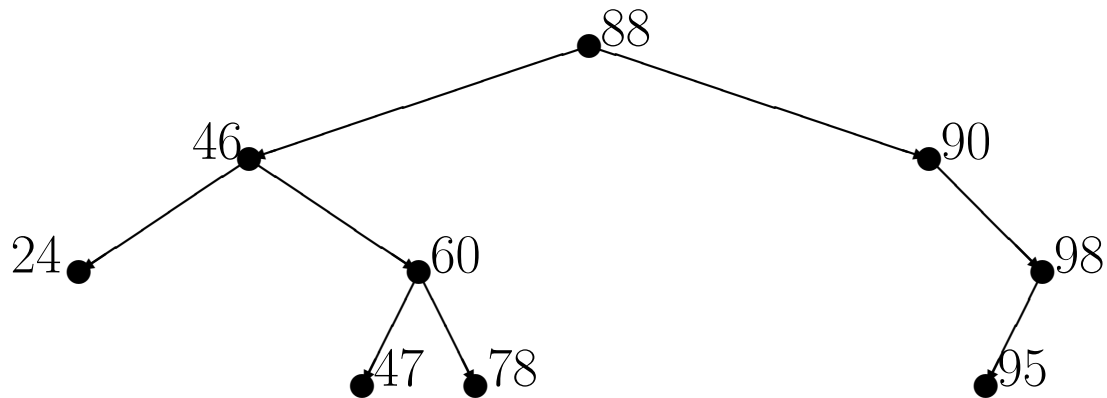
publish 47, 60, 78, 88,

90, 95, 98

publish 90

95, **98**

publish 95 and 98



RECURSION

Let $X(S, l)$ be number of comparisons up to l -th smallest

$$(X(S, l))_l = (n - 1 + \mathbb{1}_{I < l}(X(S_{<}, I - 1) + X(S_{>}, l - I)) \\ + \mathbb{1}_{l < I} X_1(S_{<}, l))_l$$

$l = 1, 2, \dots, |S|$. I uniform distribution and independent of all X -rvs. $I = |S_{<}| + 1$ denotes rank of pivot after comparisons.

$X(S, |S|)$ has Quicksort distribution.

Replace S by permutation.

Internal randomness: $X(S, \cdot)$ has distribution $X(|S|, \cdot)$ depending on cardinality.

External randomness: Input permutation with uniform distribution or iid rvs taking the first as pivot. Randomness in input, performance deterministic.

In either case $(X(S, l))_l \stackrel{\mathcal{D}}{=} (X(|S|, l))_l$ and

$$(X(n, l))_l \stackrel{\mathcal{D}}{=} (n - 1 + \mathbb{1}_{I \leq l+1}(X_1(I - 1, I - 1) + X_2(n - I, l - I)) \\ + \mathbb{1}_{I > l+1} X_1(I - 1, l))_l$$

where $I = I(n)$. This determines the distribution.

EXPECTATION

$$a(n, l) = EX(n, l)$$

$$a(n, l) = fct(n, (a_i)_{i < n}).$$

C. Martinez, Partial Quicksort

$$a(n, l) = 2n + 2(n + 1)H_n - 2(n + 3 - l)H_{n+1-l} - 6l + 6.$$

H_n n -th harmonic number $\sum_{i=1}^n \frac{1}{i}$.

DISTRIBUTION

$$Y(n, \frac{l}{n}) := \frac{X(n, l) - a(n, l)}{n + 1}$$

$$I = I(n)$$

$$\begin{aligned} Y(n, \cdot) \stackrel{\mathcal{D}}{=} & (\mathbb{1}_{I \leq l+1} (\frac{I}{n+1} Y_1(I-1, I-1) + \frac{n-I+1}{n+1} Y_2(n-I, \frac{l-I}{n-I})) \\ & + \mathbb{1}_{I > l+1} \frac{I}{n+1} Y_1(I-1, \frac{l}{I-1}) + C(n, \frac{l}{n}, I))_l \end{aligned}$$

where

$$\begin{aligned} C(n, \frac{l}{n}, I) = & \frac{1}{n+1} (\mathbb{1}_{I \leq l+1} (a(I-1, I-1) + a(n-I, l-I)) \\ & + \mathbb{1}_{I > l+1} a(I-1, l) - a(n, l) + n - 1) \end{aligned}$$

WISHFUL THINKING

Extend $Y(n, \cdot)$ nicely (piece wise constant or linear) to a rv Y_n with values in D

If $Y_n \rightarrow Y$ in some sense

$$(Y(t))_{t \in [0,1]} \stackrel{\mathcal{D}}{=} (\mathbb{1}_{U \leq t}(UY_1(1) + (1-U)Y_2(\frac{t-U}{1-U})) + \mathbb{1}_{U > t}UY_1(\frac{t}{U}) + C(U, t))$$

on D . Y_1, Y_2, U independent, U uniformly on $[0, 1]$.

$$\begin{aligned} C(x, t) = & 1 + 2x \ln x + 2(1-x) \ln(1-x) \\ & + 2\mathbb{1}_{x \geq t}((1-t) \ln(1-t) + (1-x) \ln(1-x) + 1) \\ & - (x-t) \ln(x-t) \end{aligned}$$

where $C(n, \cdot, I) \rightarrow_n C(U, \cdot)$

QUICKSORT PROCESS

Theorem Ragab-R.

There exists a fixed point Y as above with values in D .

Y is Quicksort process. Observation is a path, ω fixed

$$[0, 1] \ni t \mapsto Y(\omega)(t)$$

Proof via weighted branching process (plus some trick) on $(D, \|\cdot\|_\infty)$ and L_2 . Neininger via Zolotarev ζ_2 .

DISCRETE QP

Theorem Ragab-R.

There are nice versions of Y_n converging in Skorodhod metric on D to Y . a.e.

$$d(f, g) = \inf\{\epsilon > 0 \mid \exists \lambda \in \Lambda : \|f - g \circ \lambda\|_\infty < \epsilon, \|\lambda - \text{id}\|_\infty < \epsilon\}$$

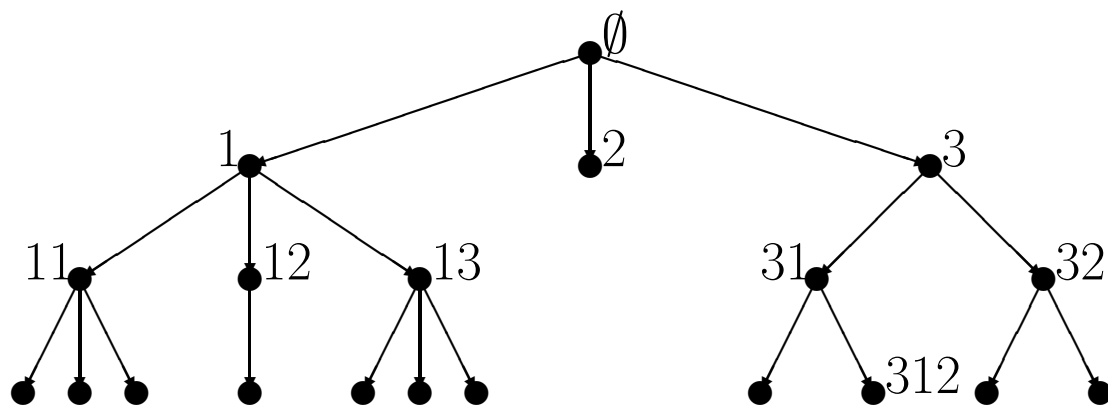
where Λ is the set of all bijective increasing functions $\lambda : [0, 1] \rightarrow [0, 1]$.

$$\underline{\underline{=}} \quad \frac{f}{g}$$

$$\underline{\underline{=}} \quad \frac{f}{g}$$

Convergence: $E(f(Y_n)) \rightarrow E(f(Y))$ for all bounded continuous functions on D .

WEIGHTED BRANCHING PROCESS



MEASURES versus FUNCTIONS

Structure: V rooted tree

$v \mapsto Z^v$ defined via tree vV .

Transformation φ^v such that

$$Z^v = \varphi^v((Z^{vi})_i)$$

Objects $(Z^v, \varphi^v)_v$ as tree indexed process

$$(Z_n^v, \varphi_n^v)_v \rightarrow_n (Z^v, \varphi^v)_v$$

Measure theory: Z^v a measure μ^v ,

- Dynamics φ^v deterministic function
- Methods: contraction method, generating function
- Convergence $\stackrel{\mathcal{D}}{=}$,

In many examples $\mu_n^\emptyset \rightarrow_n \mu^\emptyset$ like contraction method

Probability theory: Z^v a random variable

- Dynamics φ^v is itself a random function
- Methods: martingales, functional analysis
- Convergence: almost everywhere, stochastic convergence, L_p

In many examples $Z_n^\emptyset \rightarrow_n Z^\emptyset$

like in FIND Gruebel-Roesler 96, Monday Fill, Gruebel, Meiners,

COMPLEMENTARY

Which method is better?

Both help to analyse and are **complementary**.

Example: Fern $X_n = A_n X_{n-1} + B_n$ in \mathbb{R}^2

plotting of $(X_n)_n$ provides picture Fern.



Fern

Analysis, X_n does not converge in probabilistic sense.

But $\mu_n = X_n$ converges weakly to μ .

Argument by version $Y_n \rightarrow Y$ a.e. as rvs. (Kesten 73)

Fern is support of μ , a fixed point of stochastic fixed point equation, Burton-R 95

WEIGHTED BRANCHING PROCESS

WBP Roesler 93

A weighted branching process (WBP) is tuple $(V, (T^v, C^v)_{v \in V}, (G, *, H)$

- V a rooted tree. Ulam-Harris notation.
- $v \mapsto C^v, \quad (v, vi) \mapsto T_i^v$
- $(T^v = (T_1^v, T_2^v, \dots), C^v), v \in V$, independent with values in $G \times H$.
- $(G, *)$ is measurable semi group ($* : G \times G \rightarrow G, *(g, h) = g*h$ associative and measurable) with neutral element e and grave Δ
- $(G, *)$ operates transitive and measurable on H via $*_1 : G \times H \rightarrow H$.

Define the path weights $(v, vw) \mapsto L_v^w$ with values in G recursively by $L_\emptyset^v = e$ and

$$L_{wi}^v = L_w^v * T_i^{vw}.$$

Suppress \emptyset .

For our purposes, H has additional structure +

$$R_n = \sum_{|v| < n} L_v *_1 C^v$$

and $\varphi : G^{\mathbb{N}} \times H \times H^{\mathbb{N}} \rightarrow H$ like

$$\varphi(t, c, r) = \sum_i t_i *_1 r_i + c$$

affine linear function.

WEIGHTED BRANCHING PROCESS

Quicksort: G is multiplicative semi group \mathbb{R} with neutral element $e = 1$ and grave $\Delta = 0$. G operates transitive on $H = \mathbb{R}$ by multiplication. Let $U^v, v \in V$ be independent rvs with a uniform distribution on $[0, 1]$. Put

$$T_1^v = U^v, \quad T_2^v = 1 - U^v, \quad T_3^v \equiv 0 \equiv T_4^v \dots \quad C^v = C(U^v)$$

where

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

Then $R_n := \sum_{|v| < n} L_v C^v$ is L_2 -martingale.

$$R_n \rightarrow_n Q$$

a.e. and in L_2 . Quicksort distribution

$$Q = UQ^1 + (1 - U)Q^2 + C(U)$$

with expectation 0 and finite variance.

$R_n^v \rightarrow Q^v$ a.e. on tree vV and

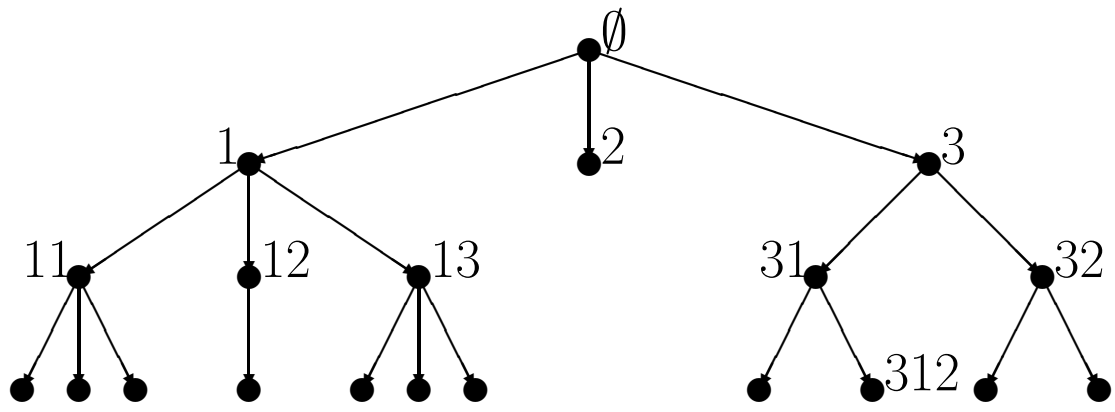
$$Q^v = U^v Q^{v1} + (1 - U^v) Q^{v2} + C(U^v)$$

for every $v \in V$.

Distribution:

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

$$K^n(\delta_0) = \mathcal{L}(R_n) \rightarrow \mathcal{L}(Q)$$



QUICKSORT PROCESS as WBP

$G = D \times D_{\uparrow}$, neutral element $(1, \text{id})$ and grave identically 0.

$$(f_1, g_1) * (f_2, g_2) := (f_1 \cdot f_2 \circ g_1, g_1 \circ g_2).$$

$$H = D \text{ and } (f, g) *_1 h := f \cdot h \circ g.$$

Let (U^v, Q^v) , $v \in V$ be as in the Quicksort example. Define $T = (T_1, T_2, \dots)$, $T_i = (A_i, B_i)$, C by

$$A_1 = U \mathbb{1}_{[0, U)}, \quad A_2 = (1 - U) \mathbb{1}_{[U, 1)}, \quad A_3 \equiv 0 \equiv A_4 \equiv 0$$

$$B_1(t) = 1 \wedge \frac{t}{U}, \quad B_2(t) = 0 \vee \frac{t - U}{1 - U}, \quad B_3 = \text{id} = B_4 \dots$$

$$C = A_1 Q + C(U, \cdot)$$

$C(x, t)$ as before.

$$(T^v, C^v) \text{ via } (U^v, Q^v)$$

Define

$$R_n^v := \sum_{w \in V_{<n}} L_w^v *_1 C^{vw}$$

and

$$\varphi(t, c, r) = \sum_{i \in \mathbb{N}} t_i r_i + c.$$

Then $R_n \rightarrow_n R$ in sense $\| \| R_n - R \|_\infty \|_2$.

DISCRETE QP as WBP

Choose $I^v(n) = \lfloor nU^v \rfloor + 1$. That's it