

Uniform generation of infinite concurrent runs

The case of trace monoids

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Contents

- 1 Introduction: Heaps of pieces and trace monoids
- 2 Simulating Bernoulli distributions
- 3 Step-by-step simulation and pyramids
- 4 Conclusion

Heaps of pieces and trace monoids

Heap of pieces^[2]

- Pieces:



Trace monoid^[1]

- Alphabet:

$$\Sigma = \{a, b, c, d\}$$

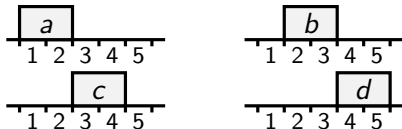
Heaps of pieces and trace monoids

Heap of pieces^[2]

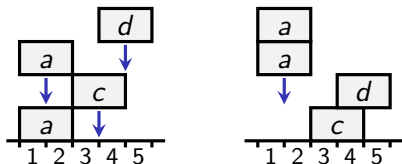
- Pieces:



- Horizontal layout:



- Vertical heaps:



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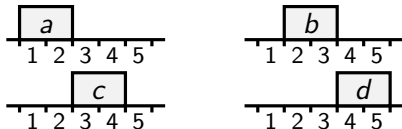
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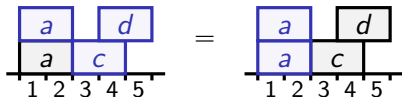
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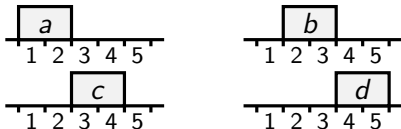
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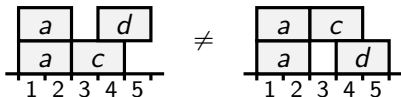
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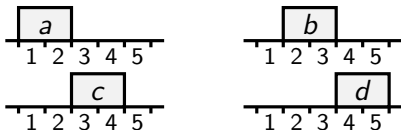
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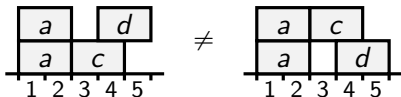
- Pieces:



- Horizontal layout:



- Vertical heaps:



Trace monoid^[1]

- Alphabet:

$$\Sigma = \{a, b, c, d\}$$

- Dependence relation:

$$D = \{\{a, b\}, \{b, c\}, \{c, d\}\}$$

- Trace monoid:

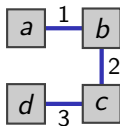
$$\mathcal{M} = \left\langle a, b, c, d \left| \begin{array}{l} ac = ca \\ ad = da \\ bd = db \end{array} \right. \right\rangle^+$$



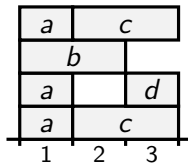
Dependency graph

Heaps of pieces and dependency graph

Dependency graph

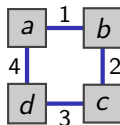
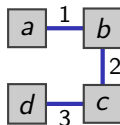


Heap of pieces

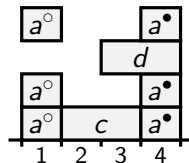
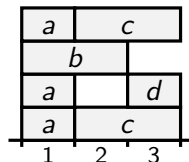


Heaps of pieces and dependency graph

Dependency graph



Heap of (disconnected) pieces



Fragments of large heaps

What do **random large** heaps of pieces look like?

Fragments of large heaps

What do **random large** heaps of pieces look like?

- 1 Define your preferred notion of heap length
- 2 Focus on finite-horizon / stopping-time events
- 3 Study uniform distributions μ_k on heaps of length k : what if $k \rightarrow \infty$?

Fragments of large heaps

What do **random large** heaps of pieces look like?

- ① Heap length $|\xi| = \# \text{pieces in the heap } \xi$
- ② Consider events $E_x = \{\xi \text{ starts with } x\}$
- ③ **Weak convergence** of distributions:

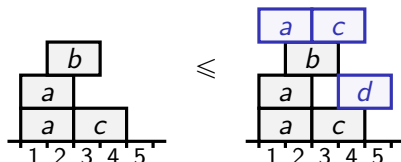
$$\mu_k \rightarrow \nu \Leftrightarrow (\forall x \in \mathcal{M}, \mathbb{P}_{\mu_k}[E_x] \rightarrow \mathbb{P}_{\nu}[E_x])$$

Fragments of large heaps

What do **random large** heaps of pieces look like?

- 1 Heap length $|\xi| = \#\text{pieces in the heap } \xi$
- 2 Consider events $E_x = \{x \leq \xi\}$
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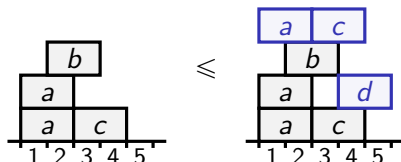


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Theorem^[3] — not constructive!

If μ_k is the uniform measure on $\mathcal{M}_k = \{\xi \in \mathcal{M} : |\xi| = k\}$,
 ν **exists** and is the **critical Bernoulli** distribution of \mathcal{M} .

Bernoulli distributions

Definition

A probability measure μ on \mathcal{M} is:

- **uniform Bernoulli** of parameter p if

$$\forall x \in \mathcal{M}, \forall \sigma \in \Sigma, \mathbb{P}_\mu[x \sigma \leq \xi \mid x \leq \xi] = p$$

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$$\text{Uniform Bernoulli} \Rightarrow \mathbb{P}_\mu[x = \xi] \propto p^{|x|}.$$

Bernoulli distributions

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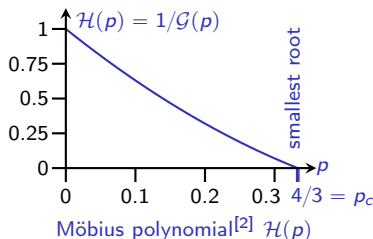
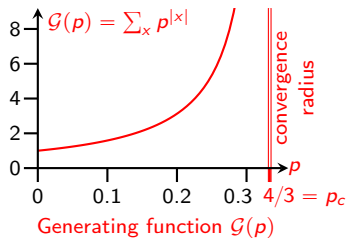
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Which are the **possible values** of the parameter p ?

$$0 \leq p < p_c$$

$$\text{Uniform Bernoulli} \Rightarrow \mathbb{P}_\mu[x = \xi] = p^{|x|} \mathcal{H}(p).$$



Bernoulli distributions

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A probability measure μ on $\overline{\mathcal{M}}$ is:

- **uniform Bernoulli** of parameter p if

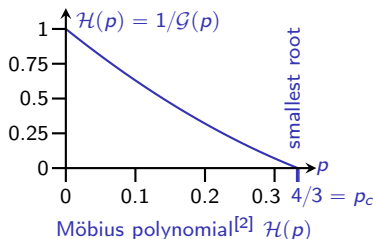
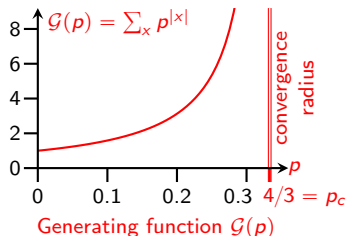
$$\forall x \in \mathcal{M}, \forall \sigma \in \Sigma, \mathbb{P}_\mu[x \sigma \leq \xi \mid x \leq \xi] = p$$

- **critical Bernoulli** if $p = p_c$ (requires **infinite** heaps)

Which are the **possible values** of the parameter p ?

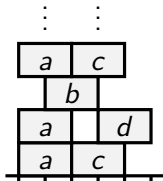
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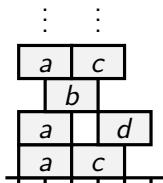
Infinite heaps

Heap of pieces

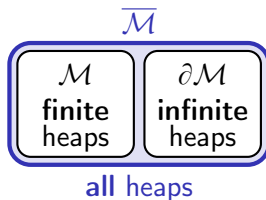


Infinite heaps

Heap of pieces



Sets of interest



Fact #1^[3]

The limit ν is a distribution **on the set** $\overline{\mathcal{M}}$ with **support** $\partial\mathcal{M}$. ⚠

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Simulating the limit ν

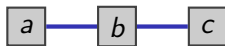
Idea #1: Pick $\xi_k \sim \mu_k$, pick a piece x **wisely** and set $\xi_{k+1} = \xi_k \cdot x$

Simulating the limit ν

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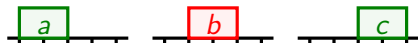
Problem: In general, ξ_{k+1} **cannot** be distributed according to μ_{k+1}

Example in the monoid $\langle a, b, c \mid ac = ca \rangle^+$



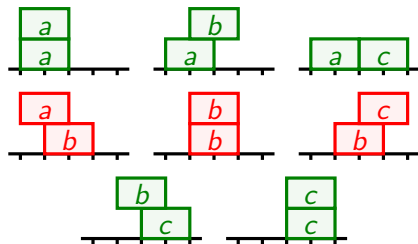
Dependency graph

$$\mu_1(\uparrow a \cup \uparrow c) = 2/3$$



>

$$\mu_2(\uparrow a \cup \uparrow c) = 5/8$$



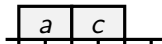
Simulating the limit ν

Idea #2: Simulate $\xi \sim \nu$, **floor by floor**



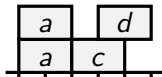
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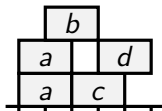
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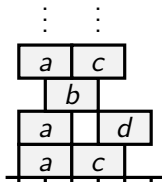
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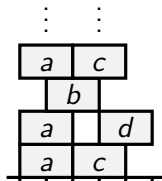
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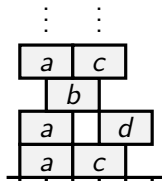


Fact #2^[3]

This approach works because ν is **Bernoulli**!

Simulating the limit ν

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Fact #2^[3]

This approach works because ν is **Bernoulli**!

Problem: Huge state space (exponential number of possible floors)

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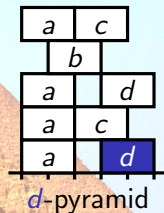
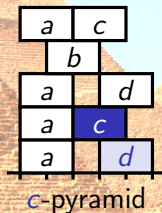
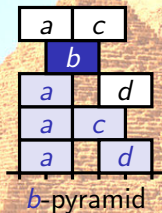
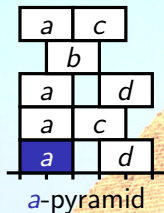
Simulating the limit ν piece by piece[⚠]

Idea #3: Decompose heaps recursively by using **pyramids**



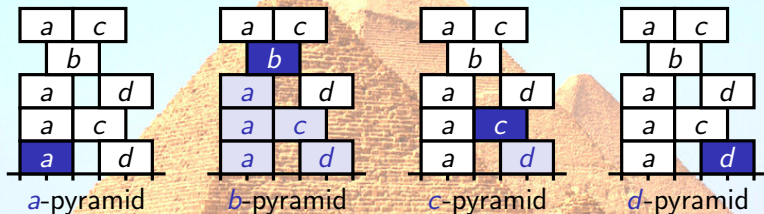
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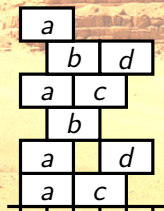


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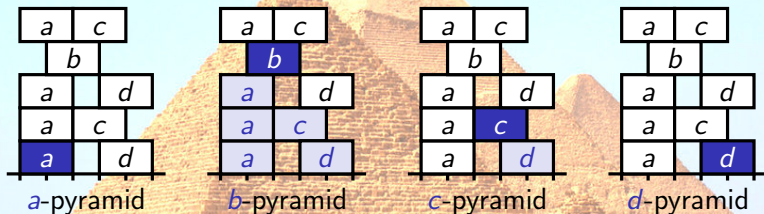


Example: Recursive decomposition using *b*-pyramids



Simulating the limit ν piece by piece[⚠]

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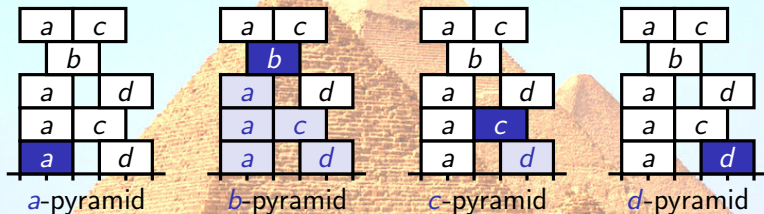


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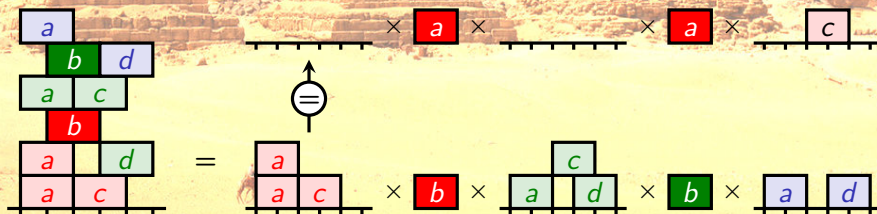


Simulating the limit ν piece by piece[⚠]

Idea #3: Decompose heaps recursively by using **pyramids**



Example: Recursive decomposition using *b*-pyramids, then *a*-pyramids...



Simulating the limit ν piece by piece[!]

Idea #3: Decompose heaps recursively by using **independent** pyramids

Theorem^[4]

If $a \in \Sigma$ and ν is **Bernoulli** on $\overline{\mathcal{M}}(\Sigma)$, then



=



×



+



Heap

a-pyramid

Heap

a-free heap

where right-hand side random variables are **independent**.

Simulating the limit ν piece by piece[⚠]

Idea #3: Decompose heaps recursively by using **independent** pyramids

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If $a \in \Sigma$ and ν is **Bernoulli** on $\overline{\mathcal{M}}(\Sigma)$, then



The diagram illustrates the decomposition of a heap into a pyramid and a free heap. It shows a large heap of gold coins on the left, followed by an equals sign, then a pyramid of gold coins, followed by a multiplication sign, then a smaller heap of gold coins, followed by a plus sign, and finally another smaller heap of gold coins. Below each image is a label: 'Heap', 'a-pyramid', 'Heap', and 'a-free heap' respectively.

Heap = a-pyramid × Heap + a-free heap

where right-hand side random variables are **independent**.



a-pyramid

=



a-free heap ξ s.t.

$R(\xi) \subseteq D(a)$

×



- $R(\xi) = \{\sigma \in \Sigma : \xi \in \mathcal{M} \cdot \sigma\}$
- $D(a) = \{\sigma \in \Sigma : \sigma \cdot a \neq a \cdot \sigma\}$

Simulating the limit ν piece by piece[⚠]

Idea #3: Decompose heaps recursively by using **independent** pyramids

Theorem^[4]

If $X \subseteq \Sigma$, $a \in \Sigma$ and ν is **Bernoulli** on $\overline{\mathcal{M}}(\Sigma)$, then

$$\begin{array}{ccccccc}
 \text{Heap } \xi \text{ s.t.} & = & \sum_{k=1}^{\infty} & \text{a-pyramid} & \times & \text{a-free heap } \xi \text{ s.t.} & + & \text{a-free heap } \xi \text{ s.t.} \\
 R(\xi) \subseteq X & & & & & R(a \cdot \xi) \subseteq X & & R(\xi) \subseteq X
 \end{array}$$

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Our algorithm: Generating heaps distributed according to ν

Refined goal: Generate a heap $\xi \in \mathcal{M}$ with $R(\xi) \subseteq X$:

- ① Generate an a-free heap $\xi \in \mathcal{M}$ with $R(\xi) \subseteq X$
- ② How many pieces a should ξ contain? ($k \leftarrow$ **Geometric law**)
 - if $k = 0$: output $\xi = \xi$
 - if $k \geq 1$ and $R(a \cdot \xi) \not\subseteq X$: go back to step #1 (anticipated rejection)
 - if $k \geq 1$ and $R(a \cdot \xi) \subseteq X$: generate a-pyramids ξ_1, \dots, ξ_k
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Variant: Choose $a \in X$ and avoid rejection

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Running time/piece: nq or n **Read-only memory usage:** n or 2^n
where $\mathcal{M}' = \mathcal{M}(\Sigma \setminus \{a\})$ and $q = \mathcal{G}_{\mathcal{M}'}(p_c) \leq 1/p_c^n$ ($q = n^{\Theta(n)}$ is possible)

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A distributed simulation algorithm

Algorithm based on:

- precomputing and storing **Möbius polynomials** of sub-monoids
- decomposing heaps into **independent** pyramids/heaps in sub-monoids
- outputting pieces **one by one** with little synchronisation

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Two variants (mixtures are possible):

- small storage – anticipated rejection – rather low efficiency
- huge storage – no rejection – high, guaranteed efficiency

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Very efficient on graphs with:

- few cycles (small storage/high efficiency for a mix between variants)
- small tree-width (no preprocessing/storage)

Some references

- [1] *Problèmes combinatoires de commutation et réarrangements*,
Cartier & Foata (1969)
- [2] *Heaps of pieces I*, Viennot (1986)
- [3] *Uniform generation in trace monoids*, Abbes & Mairesse (2015)
- [4] *Uniform generation of infinite traces*, Abbes & Jugé (2022)

Thank
you

