## Random generation of deterministic automata

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### • Finite automata

- Uniform random generation
  - Bijections to transform deterministic automata into set partitions
  - Boltzmann samplers to generate set partitions
  - Complexity
- Experimental results and open problems

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Finite automata Minimal automata Accessible automata

- Finite automata : models of decision algorithms that require a finite memory.
- Examples :
  - To test whether a binary number is a multiple of 3 or not.
  - But to test whether a word can be decomposed as  $1^n 0^n$  requires to remember the numbers of 0's and 1's already red.
- In practice
  - Pattern matching
  - Lexical analysis of a text

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# Finite automata

### A finite automaton $\mathcal{A}$ is

- a directed finite graph
- whose edges are labelled on a finite alphabet
- with a set *I* of initial states (or vertices)
- and a set *F* of final states
- The language recognized by a finite automaton is the set of the labels of the paths from any initial state to any final state.
- Regular languages are the languages recognized by a finite automaton (the sets of words that label the successfull paths in a finite automaton).

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# Example



An automaton for the binary expansions of the multiples of 6.

- The state 0 is the initial and final state.
- Expansions are red most signicant digit first.

# Regular languages and minimal automata

To each regular language, one can associate in a unique way its minimal automaton.

An automaton is deterministic and complete

- if it has only one initial state
- and if for any state q and for any letter ℓ, there exists exactly one an edge labelled ℓ starting from q.

The minimal automaton of a regular language is the complete and deterministic automaton with the minimal number of states that recognizes this language.

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## The minimal automaton of the multiples of 6



Minimal automaton of the binary expansions of the multiples of 6.

- The state 0 is the initial and final state.
- Expansions are red most significant digit first.

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### Problem

Enumeration and random generation of regular languages counted by the size of their minimal automaton.

### Goal

To analyze the average space complexity of algorithms handling regular languages, the space complexity of a regular language being the number of states of its minimal automaton.

For example, estimate the average size of the intersection of two regular languages.

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## Accessible complete and deterministic automata

### Problem

Uniform random generation of accessible complete and deterministic automata with n states (on a finite alphabet).

- An automaton is accessible (or initially connected) if any state can be reached from an initial state.
- Experimentally,
  - 85% of accessible automata on a 2-letter alphabet are minimal,
  - this proportion grows fast with the size of the alphabet.
- *Conjecture* : Asymptotically a constant proportion of accessible complete and deterministic automata are minimal.

## From automata to transition structures

An accessible complete and deterministic automaton is transformed into a transition structure by

- not taking into account the final states
- labelling the states using a depth first algorithm with respect to the lexicographical order.



A complete and deterministic transition structure corresponds to  $2^n$  (choice of final states) non-isomorphic automata with *n* states.

1st bijection 2nd bijection Random generation

# k-Dyck boxed diagrams

- A diagram of width *m* and height *n* is a sequence (x<sub>1</sub>,...,x<sub>m</sub>) of weakly increasing nonnegative integers such that x<sub>m</sub> = n.
- A *k*-Dyck diagram of size *n* is a diagram of width (k 1)n + 1 and height *n* such that  $x_i \ge \lfloor i/(k 1) \rfloor$  for each  $i \le (k 1)n$ .





Diagram of width 5 and height 4

2-Dyck diagram of size 4

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# k-Dyck boxed diagrams

- A boxed diagram is a pair of sequences  $((x_1, \ldots, x_m), (y_1, \ldots, y_m))$  where  $(x_1, \ldots, x_m)$  is a diagram and for each  $i \in [\![1..m]\!]$ , the  $y_i$ th box of the column *i* of the diagram is marked.
- A diagram gives rise to  $\prod_{i=1}^{m} x_i$  boxed diagrams.



A boxed diagram



A 2-Dyck boxed diagram

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# Transition structures and k-Dyck boxed diagrams

### Theorem

The set of accessible, complete and deterministic transition structures of size n on a k-letter alphabet is in bijection with the set  $\mathcal{D}_n$  of k-Dyck boxed diagrams of size n.

- Build from the initial state a spanning tree using a depth first algorithm with respect to the lexicographical order,
- Encode each transition which is not in the tree as a column
  - whose height is equal to the number of states of the automaton that are already in the tree
  - whose marked box corresponds to the state in which arrives this transition.





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From k-Dyck boxed diagrams to transition structure



# Create the initial state $cpt < x_1$ , create a state

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## From k-Dyck boxed diagrams to transition structure



Create the initial state

 $cpt < x_1$ , create a state

 $cpt = x_1$ , create an edge

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## From k-Dyck boxed diagrams to transition structure



Create the initial state

 $cpt < x_1$ , create a state

 $cpt = x_1$ , create an edge

 $cpt < x_2$ , create a state

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## From k-Dyck boxed diagrams to transition structure











Create the initial state

 $cpt < x_1$ , create a state

 $cpt = x_1$ , create an edge

 $cpt < x_2$ , create a state









 $cpt = x_2$ , create an edge

 $cpt = x_3$ , create an

 $cpt = x_4$ , create an edge

edge Frédérique Bassino

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### Theorem

The set of boxed diagrams of width m and height n is in bijection with the set of set partitions of n + m elements into n non-empty subsets.

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### Theorem

The set of boxed diagrams of width m and height n is in bijection with the set of set partitions of n + m elements into n non-empty subsets.

- Add *n* boxed columns (c<sub>i</sub>)<sub>1≤i≤n</sub> of height *i* at the left most position that satisfies the weakly increasing condition
- Mark their highest box



From a boxed diagram to the set partition  $\{\{1,3,6\},\{2,5\},\{4,10\},\{7,9,11\},\{8\}\}$ 

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### Theorem (Bassino, Nicaud 2007)

The average time complexity of the uniform generation of complete deterministic and accessible automaton with n states using a Boltzmann sampler is  $O(n^{3/2})$ .

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## Boxed diagrams and k-Dyck boxed diagrams

### Theorem (Korshunov 1978)

The number of accessible complete and deterministic automata with n states on a k-letter alphabet is asymptotically equals to

$$C_k n 2^n {kn \atop n}$$
 where  $\frac{1}{2} < C_k < 1$ .

### Corollary

The probability for a boxed diagram of width (k - 1)n and height n to satisfy the k-Dyck condition is asymptotically equal to  $C_k$ . The average number of rejects is  $1/C_k$  (less than 2).

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# **Boltzmann** samplers

(Duchon, Flajolet, Louchard and Schaeffer 2004)

- A Boltzmann sampler generates objects with a probability distribution  $\mathbb{P}_x(\gamma) = C \frac{x^{|\gamma|}}{|\gamma|!}$  or  $(Cx^{|\gamma|})$
- The generated objects do not have a fixed size, but two objects of the same size have the same probability to be generated.
- The parameter *x* is chosen depending upon the average size required.
- A rejection algorithm can be used to generate objects of fixed size.
- Almost no precalculus, small memory space used.

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# **Boltzmann samplers**

### Goal

To uniformly generate at random set partitions of a set with kn elements into n nonempty subsets.

- Partition into *n* non-empty subsets = set of *n* non-empty sets
- Exponential generating function counting non-empty sets according to their cardinality :  $N(z) = e^z 1$ .
- In the Boltzmann model, the size of each of the *n* subsets follows a Poisson law of parameter  $x : \mathbb{P}_x(|\gamma| = s) = \frac{1}{(e^x 1)} \frac{x^s}{s!}$ .
- The average size of the generated partition is

$$\mathbb{E}_x$$
(size of partitions) =  $n x \frac{e^x}{e^x - 1}$ .

•  $\mathbb{E}_x(\text{size of partitions}) = kn \text{ for } x = \zeta_k. \text{ (saddle point of } \binom{kn}{n} \text{)}$ 

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# **Boltzmann** samplers

- Generate the size of each of the *n* subsets following a Poisson law of parameter *x* = ζ<sub>k</sub> (linear complexity).
- The probability for the generated partition to be of size exactly kn is asymptotically  $\mathcal{O}\left(\frac{1}{\sqrt{n}}\right)$ . The average number of rejects is  $\mathcal{O}(\sqrt{n})$ .
- Draw a random partition of  $\{1, \ldots, kn\}$  to label the struture (linear complexity)

The average time complexity is  $\mathcal{O}(n^{3/2})$ 

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## Minimal automata

### Proportion of minimal automata

Taille	100	500	1 000	2 000	5 000
minimaux	85.06 %	85.32 %	85.09 %	85.42 %	85.32 %

- Tests made with the C++ library REGAL.
- Tests made with 20 000 automata of each size and a binary alphabet.
- The proportion of minimal automata grows with the cardinality of the alphabet.
- Random generation algorithm for minimal automata using a rejection algorithm.

### Open problem

Counting minimal automata

## Average time complexity of minimization algorithms

The worst-case complexity of Hopcroft's algorithm is  $\Theta(n \log n)$  and the one of Moore's algoritm is  $\Theta(n^2)$ . But what are their average time complexities ?

