

Enumerating regular languages with bounded delay

Antoine Amarilli, Mikaël Monet; STACS'23

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Inria



Context: Enumeration algorithms

Enumeration algorithms: framework for computation problems producing **many results**

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Decision problem

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Input → YES/NO

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Measure: running time

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Computation problem

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  ,
   }]

Measure: max **delay** between two consecutive results

Holy grail: Constant-delay enumeration

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On acyclic conjunctive queries and constant delay
enumeration

Guillaume Bagan *

Arnaud Durand †

Etienne Grandjean ‡

On acyclic conjunctive queries and constant delay
enumeration

Guilla **Enumeration of MSO Queries on Strings with
Constant Delay and Logarithmic Updates**

Matthias Niewerth
University of Bayreuth

Luc Segoufin
INRIA and ENS Ulm

On acyclic conjunctive queries and constant delay
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Constant delay enumeration for FO queries over databases with
local bounded expansion

Luc Segoufin
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Paris

Alexandre Vigny
Université Paris Diderot Paris 7
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Constant Delay Enumeration for Conjunctive Queries — a Tutorial

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Problem: assumes that the results to enumerate have **constant size**

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Problem: assumes that the results to enumerate have **constant size**

Ambitious goal

How can we enumerate results of **unbounded size** in **constant delay**?

Solution: Cheat!

Do not write each result from scratch, but by **editing** the previous result!

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$\frac{\quad}{1}$ $\frac{\quad}{2}$ $\frac{\quad}{3}$ $\frac{\quad}{4}$ $\frac{\quad}{5}$ $\dots$

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Results:

Put(1, );

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Do not write each result from scratch, but by **editing** the previous result!

					
—	—	—	—	—	...
1	2	3	4	5	

Results:

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Results:

Put(1, ); Put(2, );

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Put(1, ); Put(2, ); **Output()**;

Put(3, );

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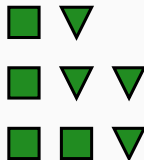


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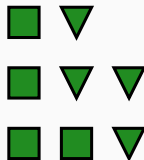


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Remark: Solutions need to be **ordered** with small **distance** between consecutive solutions

Enumeration for automata

Problem: enumerate the words accepted by a **word automaton**

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- Can we find a **distance bound** $C \in \mathbb{N}$ and **order** $L(A) = \{w_1, w_2, \dots\}$ such that $d(w_i, w_{i+1}) \leq C$ for all $i \geq 1$?
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 - Here, d is the **Levenshtein distance**
- If yes, can we **efficiently produce** the sequence of edits?

Examples

a^*

Examples

a^*

$\epsilon, a, aa, aaa, \dots$

Examples

a^* $\epsilon, a, aa, aaa, \dots$

a^*b^*

Examples

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$a^*(c + d)b^*$

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Can you characterize the **orderable languages**?

Theorem

*Given a DFA A , we can determine in **PTIME** whether its language $L(A)$ is orderable*

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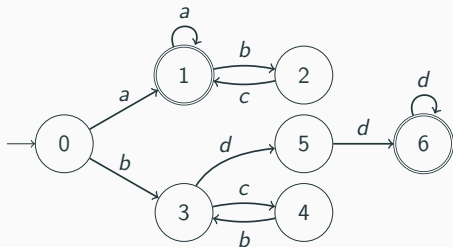
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Also:

- Characterization if we only allow edits at the *right endpoint* (= stack, not deque)
- Finding the minimal *distance bound* is NP-hard

Proof techniques

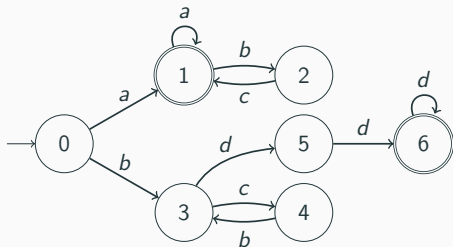
Pleasant (and elementary): orderability



- Equivalence relation on **loopable states**

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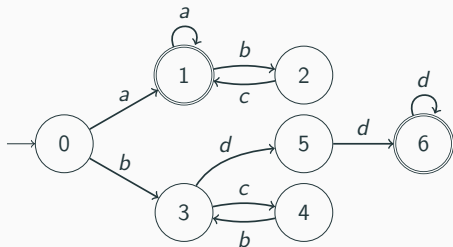
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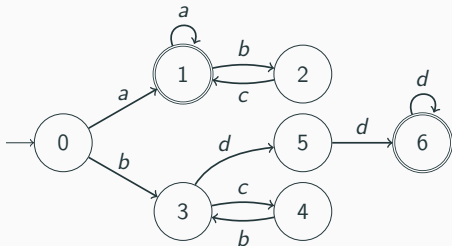
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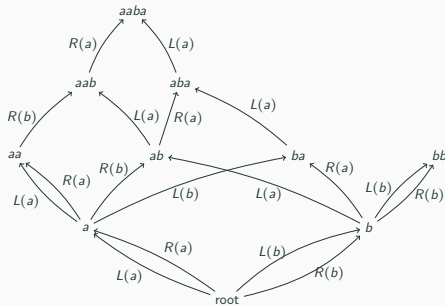
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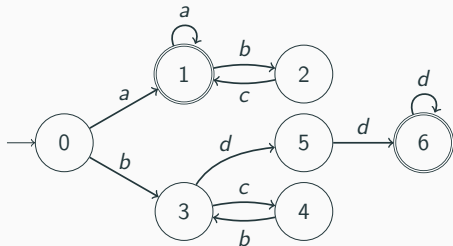
Unpleasant (and exponential): enumeration



- **Pointer machine model** because memory usage goes to infinity

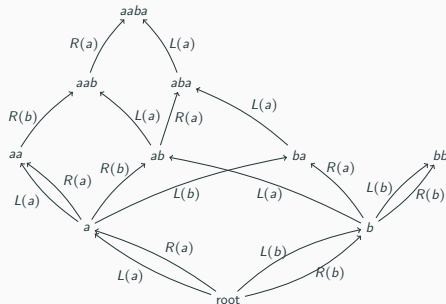
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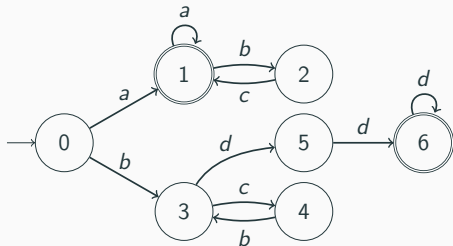
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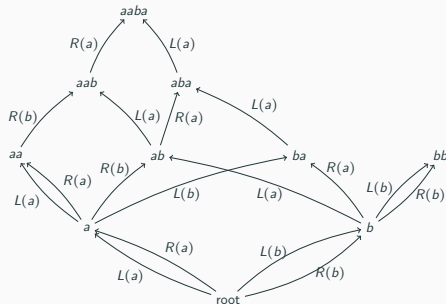
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Unpleasant (and exponential): enumeration



- **Pointer machine model** because memory usage goes to infinity
- Everything is **exponential** in the DFA
- Probably simplifiable...

Open questions and future work:

- Make the delay **polynomial** in $|A|$? (currently it is exponential)
- What about the **push-left pop-right distance**? the **padded Hamming** distance?
- What about enumeration in **radix order**?
- What about regular **tree languages**?
- Can we go beyond **regular languages**?
- Other uses of the **enumeration model**?

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Thanks for your attention!