



Enumerating m -Length Walks in Directed Graphs with Constant Delay

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March 17, 2024

Motivation

- There are many settings in which we wish to enumerate every object within a class of combinatorial objects.
- As such classes are often of exceptional size relative to the description of the class.
- One such example is **regular languages**, where a deterministic, finite automaton can describe a class of possibly unbounded size.
 - We are motivated particularly by the class of *prefix closed languages* avoiding a set of forbidden substrings, via a problem originating in chemistry.

Our Results

Theorem 1. There is an algorithm which, given a number m , enumerates, without repetitions, all walks of length m in a (directed) graph $G = (V, E)$ with a worst-case delay of $O(1)$, after preprocessing taking $O(|E|)$ time.

Overview

Given the number of walks in a graph (up to n^n), there are two main objectives with the output of our algorithm:

- **Reconstructability:** The output must allow the most recently enumerated walk to be reconstructed “efficiently”.
 - Lower Bound: $O(m)$ (for an m -length walk).
 - Upper Bound $O(n^n)$.
- **Efficient:** The algorithm needs to minimise the delay between outputs.
 - Lower Bound $O(1)$.
 - Upper Bound $O(n^n)$.

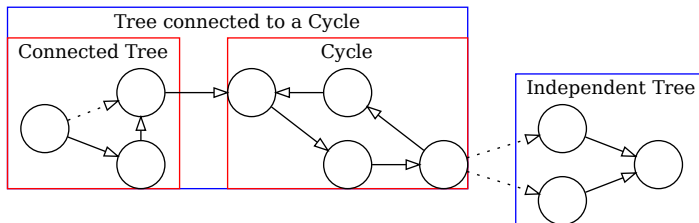
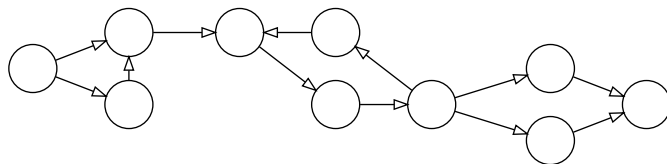
We match the lower bound for both conditions by introducing the data structures of **default edges**, **default paths**, and the **default graph**.

Default Edges, Paths, and Graphs

Definition

Given a graph $G = (V, E)$ and vertex $v \in V$, the **Default Edge** from v is the edge from v in the longest walk starting at v in \mathcal{G} . The **Default Path** from v is the path formed by following default edges from each state starting at v . The **Default Graph** of \mathcal{G} , $D(\mathcal{G})$, is the graph induced by the default edges.

Default Graph Example

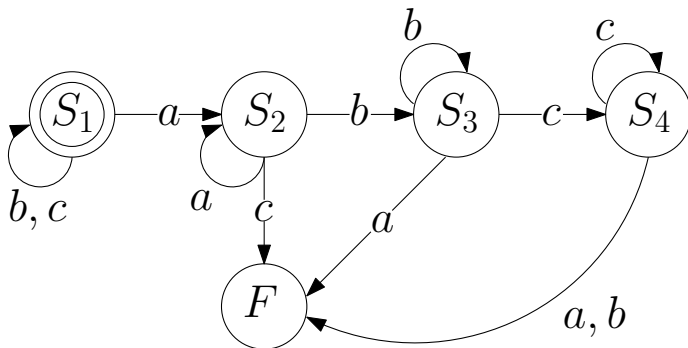


Using the Default Graph to represent walks

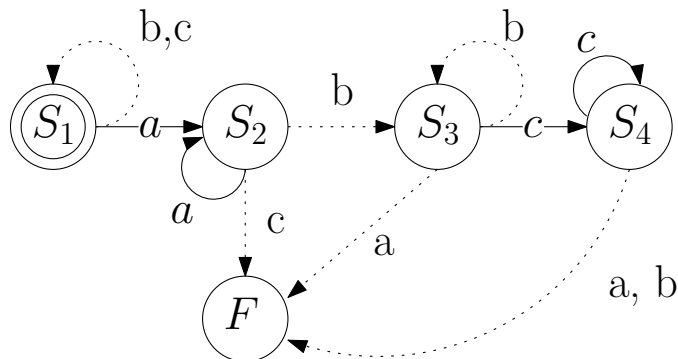
Key Idea. We represent each walk as a list of vertex-length pairs, each representing a sub walk. The tuple (v, ℓ) represents the walk on the default path from v for ℓ steps.

For **strings** accepted by a given automaton \mathcal{A} , each walk represents a string, and the tuples in the representation represent *substrings*

Representation example



Representation example

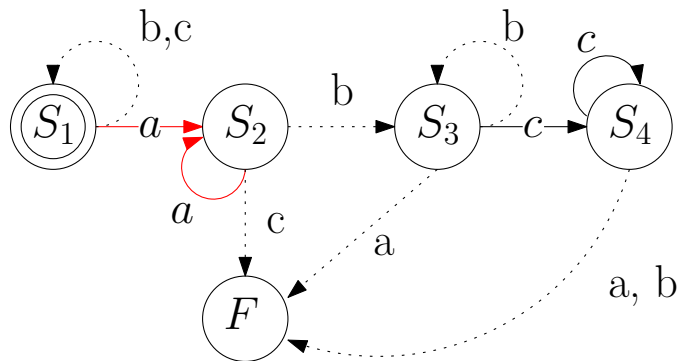


String	default path representation
<i>aaaabbbbcccc</i>	$[(S_1, 4), (S_3, 0), (S_3, 0), (S_3, 0), (S_3, 0), (S_3, 4)]$
<i>aaaaaabcccc</i>	$[(S_1, 6), (S_3, 5)]$
<i>abcccccccc</i>	$[(S_1, 1)(S_3, 10)]$

Output

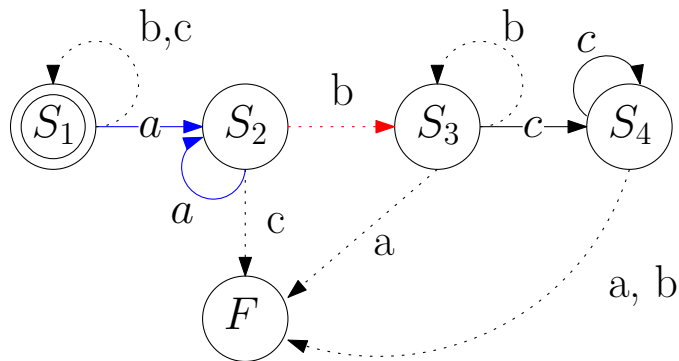
- At each step, we assume that we have a stack of state-length pairs, allowing the full word to be reconstructed in $O(n)$ time.
- Our goal now is to **edit** the stack with a constant number of operations in order to represent the next string.
- At each step, the output is a representation of the edit operations, allowing the strings to be explicitly output on demand.

Representation example



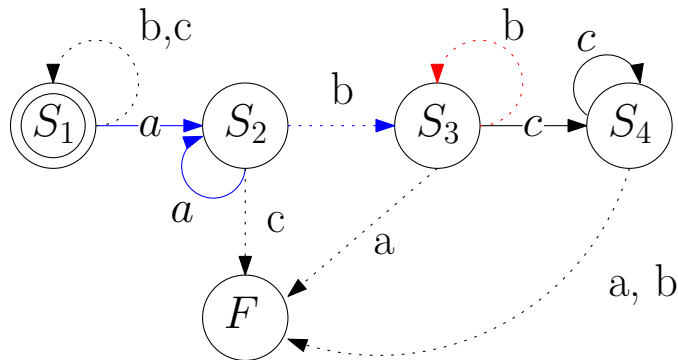
$(S_1, 4) \mapsto aaaa$

Representation example



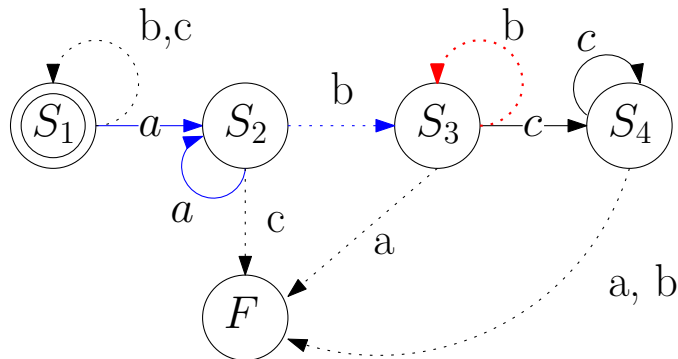
$(S_1, 4)(S_3, 0) \mapsto aaaab$

Representation example



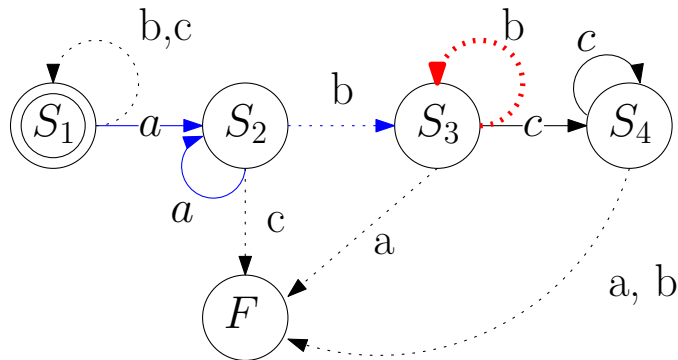
$(S_1, 4)(S_3, 0)(S_3, 0) \mapsto aaaabb$

Representation example



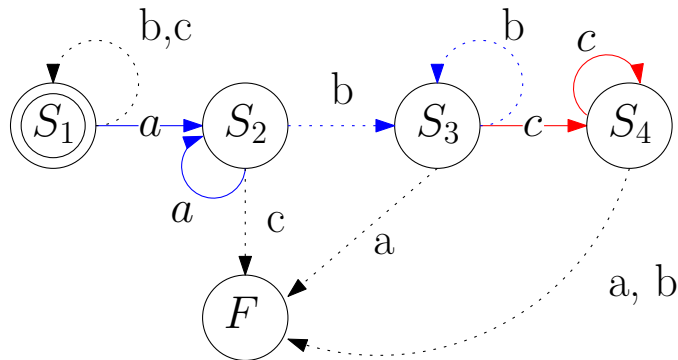
$(S_1, 4)(S_3, 0)(S_3, 0)(S_3, 0) \mapsto aaaabbb$

Representation example



$(S_1, 4)(S_3, 0)(S_3, 0)(S_3, 0)(S_3, 0) \mapsto aaaabbbb$

Representation example



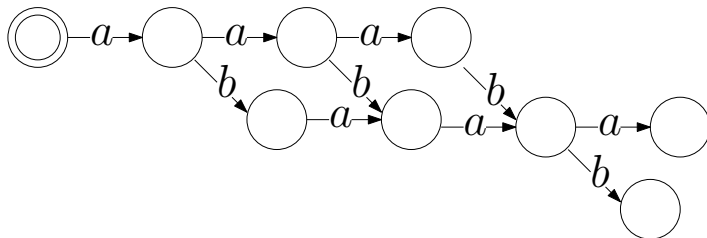
$(S_1, 4)(S_3, 0)(S_3, 0)(S_3, 0)(S_3, 0)(S_3, 4) \mapsto aaaabbbbccccc$

High Level Idea

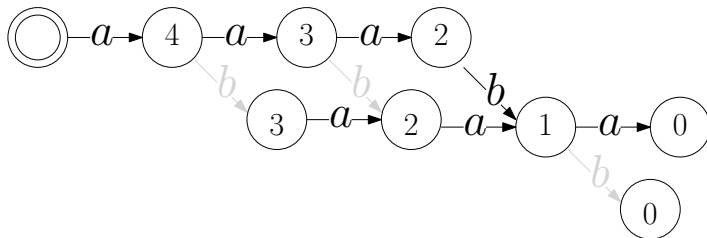
Our algorithm operates as follows:

- Starting with a walk W (which we assume has been output) we find the the possible ways of *branching* from this walk.
- Each node on the path is weighted by the depth of the node in the default path, and the length of the **second** longest walk from the node.
- Using these weights, we do a **range maximum query** on the graph, and choose the best state on the walk to branch from.

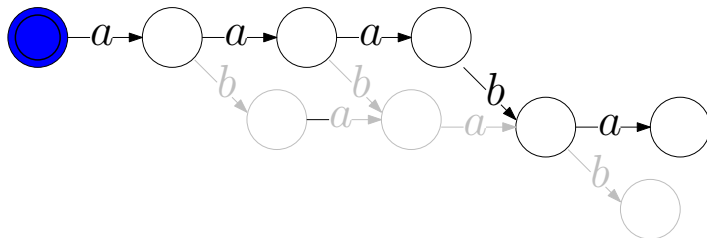
Example



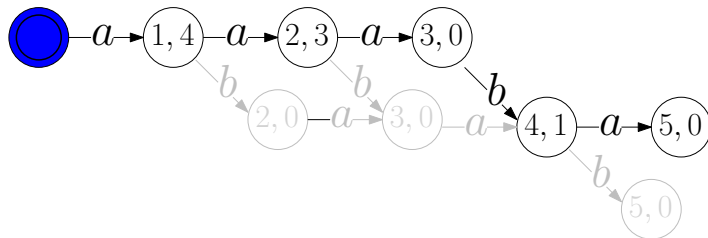
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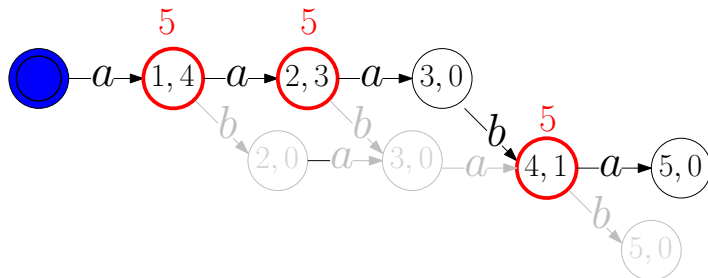
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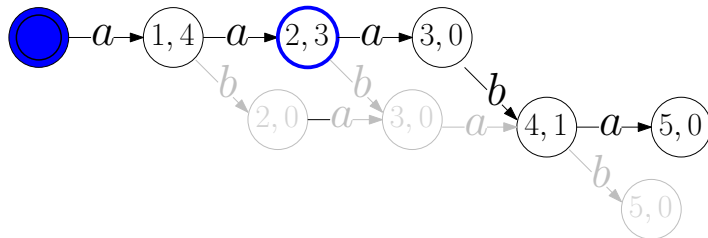
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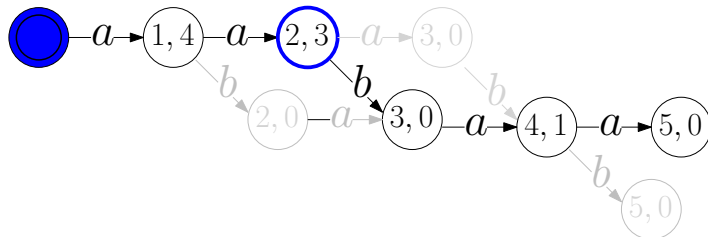
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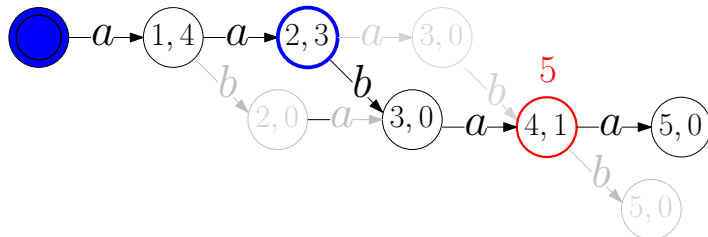
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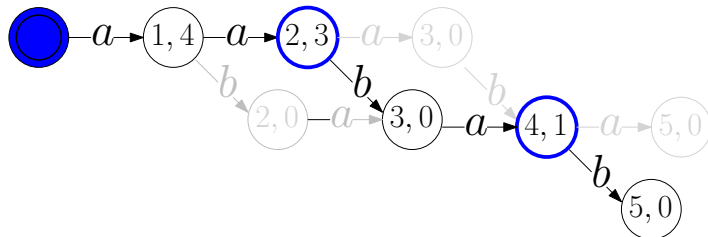
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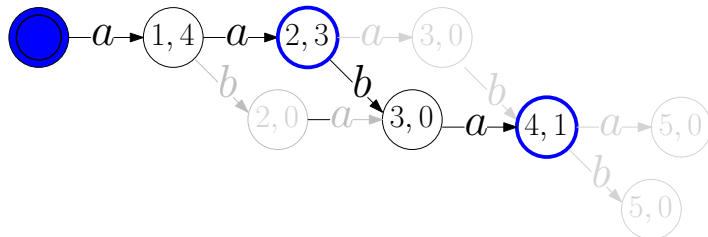
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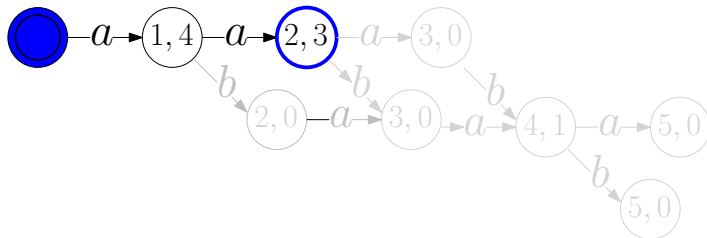
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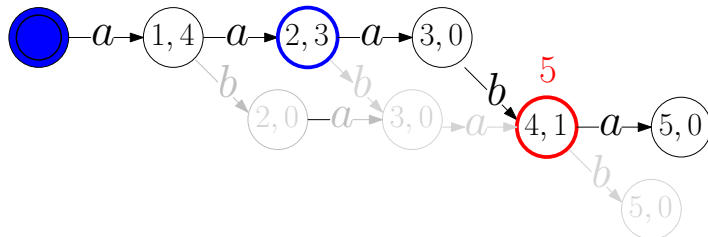
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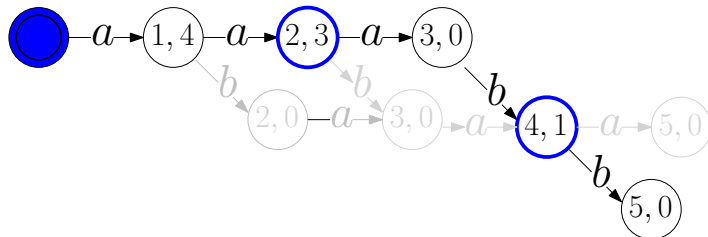
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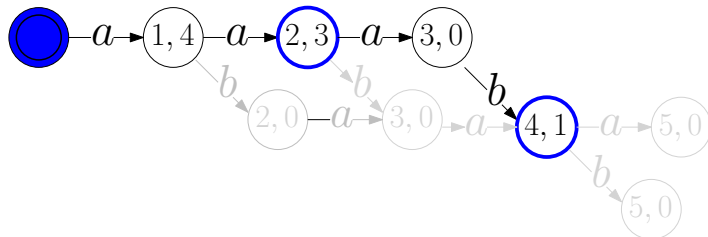
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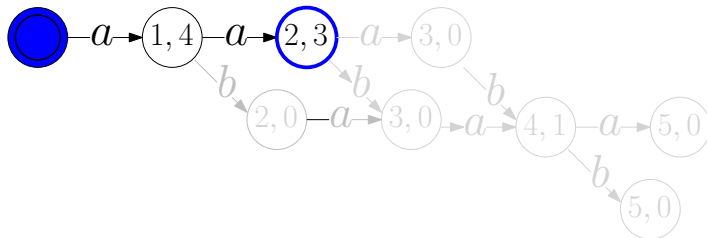
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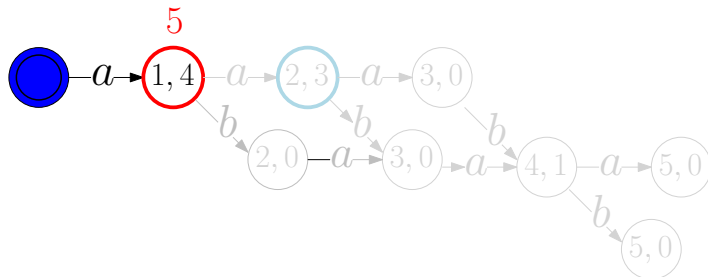
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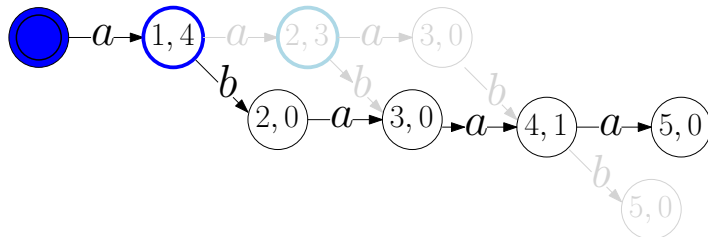
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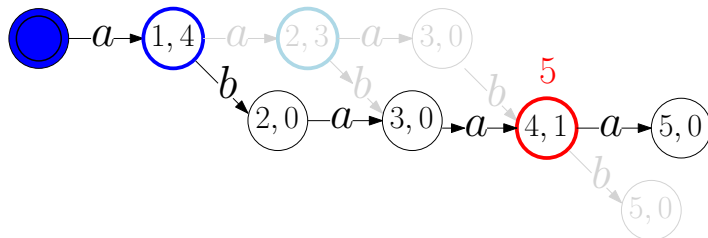
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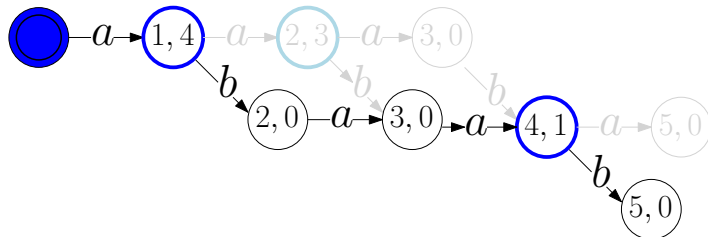
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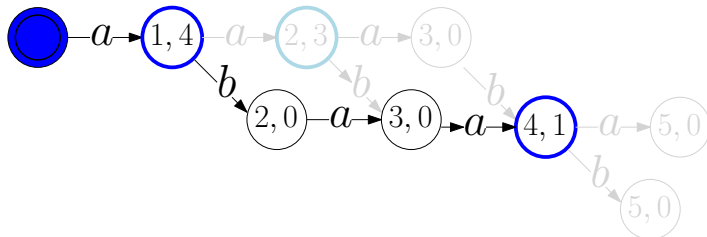
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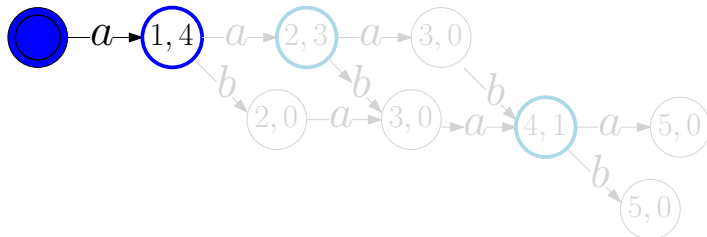
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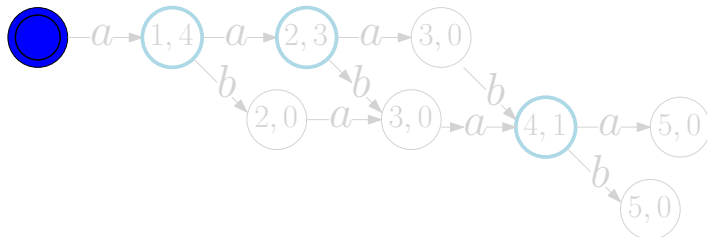
Example



Example



Example



Avoiding unnecessary backtracking

- To avoid unnecessary backtracking in the execution, we use **tail recursion**, to ensure that we can skip any backtracking to a node that is **exhausted**.
- A node is **exhausted** if every walk from the node has already been enumerated (from the current prefix).

Additional Results

- Along with the enumeration results, we give auxiliary results for **ranking** and **unranking** walks in the order output by the enumeration of the algorithm.
- The **rank** of a walk is the integer corresponding to the number of walks output before it.
- The **unranking** problem takes an integer i and asks for the walk with a rank of i .

Ranking and Unranking results (informal)

The **rank** of an m -length walk in the enumeration output order of the graph $G = (V, E)$ with m vertices can be computed in $O(|E| + mn^\omega + m^2\Delta)$ time, where ω is the exponent for matrix multiplication and Δ is the largest degree of any vertex in G .

Given an integer i , the i^{th} m -lengthwalk in the enumeration output order of the graph G with n vertices can be computed in $O(|E| + mn^\omega + m^2\Delta)$ time, where ω is the exponent for matrix multiplication and Δ is the largest degree of any vertex in G .

Summary

Results:

- An enumeration algorithm with constant delay for walks of length m in the graph G
- Polynomial time algorithms for **ranking** and **unranking** in enumeration order.

Open Problems:

- Can we enumerate **regular languages** with constant delay?
- Can we rank and unrank in linear (Or $O(\Delta n^\omega)$) time?