# Introduction to Unification Theory 

Matching

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## Overview

Syntactic Matching

Advanced Topics

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Syntactic Matching

## Advanced Topics



## Matching Problem

- Given: terms $t$ and $s$.
- Find: a substitution $\sigma$ such that $t \sigma=s$ (syntactic matching).
- Matching equation: $t \leq$ ? s.
- $\sigma$ is called a matcher.


## Matching Problem

## Example

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- Matching problem: $f(x, x) \leq ? f(x, a)$. No matcher.
- Matching problem: $f(g(x), x, y) \leq ? f(g(g(a)), g(a), b)$. Matcher: $\{x \mapsto g(a), y \mapsto b\}$.


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- Matching problem: $f(x) \leq ?$ Matcher: $\{x \mapsto g(x)\}$.


## Relating Matching and Unification

- Matching can be reduced to unification.
- Simply replace in a matching problem $t \leq ?$ s each variable in $s$ with a new constant.
- $f(x, y) \stackrel{?}{?} f(g(z), x)$ becomes the unification problem $f(x, y) \doteq ? f\left(g\left(c_{z}\right), c_{X}\right)$.
- $c_{z}, c_{X}$ : new constants.
- The unifier: $\left\{x \mapsto g\left(c_{z}\right), y \mapsto c_{x}\right\}$.
- The matcher: $\{x \mapsto g(z), y \mapsto z\}$.
- When $t$ is ground, matching and unification coincide.


## Relating Matching and Unification

- Both matching and unification can be implemented in linear time.
- Linear implementation of matching is straightforward.
- Linear implementation of unification requires sophisticated data structures.
- Whenever efficiency is an issue, matching should be implemented separately from unification.


## Overview

## Syntactic Matching

Advanced Topics

## Tree Pattern Matching

- Matching is needed in rewriting, functional programming, querying, etc.
- Often the following problem is required to be solved:
- Given a ground term $s$ (subject) and a term $p$ (pattern)
- Find all subterms in $s$ to which $p$ matches.
- Notation: $p \ll$ ? .
- In this lecture: An algorithm to solve this problem.
- Terms are represented as trees.


## Matching

Working example:

$$
f(f(a, X), Y) \ll ? f(f(a, b), f(f(a, b), a))
$$

## Tree Pattern Matching

Matching the pattern tree to the subject tree.



Subject tree

## Tree Pattern Matching

Matching the pattern tree to the subject tree.
Pattern tree 1. First match:


Pattern tree 1
Subject tree

## Tree Pattern Matching

Matching the pattern tree to the subject tree.
Pattern tree 1. Second match:



Subject tree

## Tree Pattern Matching

Matching the pattern tree to the subject tree.
Pattern tree 2. Single match:


Pattern tree 2
Subject tree

## Tree Pattern Matching

- Pattern tree 1 in the example is linear: Every variable occurs only once.
- Pattern tree 2 is nonlinear: $X$ occurs twice.
- Two steps for nonlinear tree matching:

1. Ignore multiplicity of variables (assume the pattern in linear) and do linear tree pattern matching.
2. Verify that the substitutions computed for multiple occurrences of a variable are identical: check consistency.

## Terms

- $\mathcal{V}$ : Set of variables.
- $\mathcal{F}$ : Set of function symbols of fixed arity.
- $\mathcal{F} \cap \mathcal{V}=\emptyset$.
- Constants: 0-ary function symbols.
- Terms:
- A variable or a constant is a term.
- If $f \in \mathcal{F}, f$ is $n$-ary, $n>0$, and $t_{1}, \ldots, t_{n}$ are terms, then $f\left(t_{1}, \ldots, t_{n}\right)$ is a term.

Term Trees, Nodes, Node Labels, Edges, Edge labels
Example



The tree for $f(f(a, X), Y)$
The tree for $f(f(a, b), f(f(a, a), a))$

Term Trees, Nodes, Node Labels, Edges, Edge labels
Example


Node

Term Trees, Nodes, Node Labels, Edges, Edge labels
Example


Node label

Term Trees, Nodes, Node Labels, Edges, Edge labels
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Edge

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Example


Edge label

## Labeled Path

- Labeled path $\operatorname{lp}\left(n_{1}, n_{q}\right)$ in a term tree from the node $n_{1}$ to the node $n_{q}$ :
A string formed by alternatively concatenating the node and edge labels from $n_{1}$ to $n_{q}$.


## Labeled Path

Example


Labeled path from 1 to $8: \operatorname{lp}(1,8)=f 2 f 1 f 1 a$

## Euler Chains and Strings

- Euler chain for a term tree: a string of node labels obtained as follows:



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## Euler Chains and Strings

- Euler chain for a term tree: a string of node labels obtained as follows:


12

## Euler Chains and Strings

- Euler chain for a term tree: a string of node labels obtained as follows:


124

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- Euler chain for a term tree: a string of node labels obtained as follows:


1242

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- Euler chain for a term tree: a string of node labels obtained as follows:


12425

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- Euler chain for a term tree: a string of node labels obtained as follows:


124252

## Euler Chains and Strings

- Euler chain for a term tree: a string of node labels obtained as follows:


1242521

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- Euler chain for a term tree: a string of node labels obtained as follows:


12425213

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- Euler chain for a term tree: a string of node labels obtained as follows:


124252131

## Euler Chains and Strings

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## Euler Chains and Strings

- Properties of Euler chains


The leaves occur only once:

## Euler Chains and Strings

- Properties of Euler chains


The chain of the subtree rooted at that node:

## Euler Chains and Strings

- Properties of Euler chains


A node with $n$ children occurs $n+1$ times

## Euler Chains and Strings

- Euler strings: Replace nodes in Euler chains with node labels.

ffafXffYf
ffafbffffafaffaff


## Tree Pattern Matching: Idea

- Instead of using the tree structure, the algorithm operates on Euler chains and Euler strings.


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- To declare a match of the pattern tree at a subtree of the subject tree, the algorithm
- verifies whether their Euler strings are identical after replacing the variables in the pattern by Euler strings of appropriate terms.


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- To justify this approach, Euler strings have to be related to the tree structures.


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- verifies whether their Euler strings are identical after replacing the variables in the pattern by Euler strings of appropriate terms.
- To justify this approach, Euler strings have to be related to the tree structures.


## Theorem

Two term trees are equivalent (i.e. they represent the same term) iff their corresponding Euler strings are identical.

## Nonlinear Tree Pattern Matching: Ideas

Putting the ideas together:

1. Ignore multiplicity of variables (assume the pattern is linear) and do linear tree pattern matching.
2. Verify that the substitutions computed for multiple occurrences of a variable are identical: check consistency.
3. Instead of trees, operate on their Euler strings.

## Notation

- s: Subject tree.
- $p$ : Pattern tree.
- $C_{s}$ and $E_{s}$ : Euler chain and Euler string for the subject tree.
- $C_{p}$ and $E_{p}$ : Euler chain and Euler string for the pattern tree.
- $n$ : Size of $s$.
- $m$ : Size of $p$.
- $k$ : Number of variables in $p$.
- K: The set of all root-to-variable-leaf pathes in $p$.


## Step 1. Linear Tree Pattern Matching

- Let $v_{1}, \ldots, v_{k}$ be the variables in $p$.
- $v_{1}, \ldots, v_{k}$ appear only once in $E_{p}$, because
- only leaves are labeled with variables,
- each leaf appears exactly once in the Euler string, and
- each variable occurs exactly once in $p$ (linearity).


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- ffafXffYf splits into $\sigma_{1}=f f a f, \sigma_{2}=f f$, and $\sigma_{3}=f$.
- Construct Boolean tables $M_{1}, \ldots, M_{k}$, each having $\left|E_{s}\right|$ entries:

$$
M_{i}[j]= \begin{cases}1 & \text { if there is a match for } \sigma_{i} \text { in } E_{s} \text { starting at pos. } j \\ 0 & \text { otherwise. }\end{cases}
$$

## Step 1. Linear Tree Pattern Matching

## Example

- $E_{p}=\mathrm{ffafxffyf}, \sigma_{1}=\mathrm{ffaf}, \sigma_{2}=\mathrm{ff}, \sigma_{3}=\mathrm{f}$, $E_{s}=f f a f b f f f f a f a f f a f f$.
- $M_{1}=10000001000010000$ (ffafbffffafaffaff).
- $M_{2}=10000111000010010$ (ffafbffffafaffaff).
- $M_{3}=11010111100011011$ (ffafbffffafaffaff).


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- The set of nodes where $p$ matches $s$ is a subset of the set of nodes with nonzero entries in $M_{1}$.


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- The set of nodes where $p$ matches $s$ is a subset of the set of nodes with nonzero entries in $M_{1}$.
- Take a nonzero entry position $i$ in $M_{1}$ that corresponds to the first occurrence of a node in the Euler chain, $i=1$.


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- The replacement for $X$ must be a string in $E_{s}$ that starts at position $i+\left|\sigma_{1}\right|=5$


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- The replacement for $X$ must be a string in $E_{s}$ that starts at position $i+\left|\sigma_{1}\right|=5$
- Moreover, this position must correspond to the first occurrence of a node in the Euler chain, because
- variables can be substituted by subtrees only,
- a subtree starts with the first occurrence of a node in the Euler chain.
If this is not the case, take another nonzero entry position in $M_{1}$.


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- Let $j$ be the position of the last occurrence from the previous item. Then $M_{2}[j+1]$ should be 1: $\sigma_{2}$ should match $E_{s}$ at this position.


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- And proceed in the same way...


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- The first match found: $\mathrm{X} \rightarrow \mathrm{b}, \mathrm{Y} \rightarrow \mathrm{f}(\mathrm{f}(\mathrm{a}, \mathrm{a}), \mathrm{a})$.


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- One more try... fail.
- The last 1 in $C_{s}$ is not the first occurrence of 1 .


## Complexity of Linear Tree Pattern Matching

- The simple algorithm computes $k+1$ Boolean tables.
- Each table has $\left|E_{s}\right|=n$ size.
- In total, construction of the tables takes $O(n k)$ time.
- Room for improvement: Do not compute them explicitly.


## Suffix Number, Suffix Index

$\psi$ : finite set of strings.

- Suffix number of a string $\lambda$ in $\Psi$ : The number of strings in $\psi$ which are suffixes of $\lambda$.
- Suffix index of $\Psi$ (denoted $\Psi^{*}$ ): The maximum among all suffix numbers of strings in $\psi$.
- If $|\Psi|=0$ then $\Psi^{*}=1$.


## Example

- $\Psi=\{f f f f X, f f f f b, f f f b, f f b, f b\} .|\Psi|=5$.
- Suffix number of ffff $X$ in $\Psi$ is 1 .
- Suffix number of fffb in $\Psi$ is 3 .
- Suffix number of ffffb in $\Psi$ is 4 .
- Suffix index of $\Psi$ is 4 .


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- Therefore, $I p\left(r_{p}, j^{\prime}\right)$ is a suffix of $I p\left(r_{p}, i^{\prime}\right)$, or vice versa.
- Hence, the subtree at $w$ can be substituted at most $K^{*}$ times over all matches and the number of all legal replacements that can be computed over all matches is $O\left(n K^{*}\right)$.


## Complexity of Linear Tree Pattern Matching

Bound on the number of replacements computed by the simple algorithm:

- Assume $e_{1}, \ldots, e_{w}$ are Euler strings of subtrees in $s$ rooted at nodes $i_{1}, \ldots, i_{w}$.
- Assume the string $\sigma_{1} \circ e_{1} \circ \cdots \circ e_{w} \circ \sigma_{w+1}$ matches a substring of $E_{s}$ at position $I$.
- I is the position that corresponds to the first occurrence of a node $j$ in $s$, i.e. $C_{s}[]=j$ and $C_{s}\left[l^{\prime}\right] \neq j$ for all $I^{\prime}<l$.
- For each $1<q<w, \operatorname{lp}\left(r_{p}, v_{q}\right)=\operatorname{lp}\left(j, i_{q}\right)$ ( $v$ 's are the corresponding variable nodes in $p$.)
- The strings $\sigma_{1}, \sigma_{1} \circ e_{1}, \sigma_{1} \circ e_{1} \circ \sigma_{2}, \ldots$ are computed incrementally.
- We have a match at $j$ if we compute $\sigma_{1} \circ e_{1} \circ \cdots \circ e_{k} \circ \sigma_{k+1}$, i.e. legal replacements for all variables in $p$.


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- In case of failed match attempt, we would have computed at most one illegal replacement.
- Hence, the total number of illegal replacements computed over match attempts at all nodes can be $O(n)$ at most.
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That's fine, but how to keep the time-bound of the algorithm proportional to the number of replacements?


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- Not spending more than $O(1)$ between replacements, without computing the tables, needs more preprocessing.


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- Determine whether pattern string $\sigma_{i+1}$ matches $E_{s}$ at the position following the replacement for $v_{i}$.
- Had we computed the tables, this can be done in $O(1)$, but how to achieve the same without the tables?


## Complexity of Linear Tree Pattern Matching

Keep the time-bound of the algorithm proportional to the number of replacements:

- Problem: Given a position in $E_{s}$ and a string $\sigma_{i}$, $1 \leq i \leq k+1$, decide in $O(1)$ whether $\sigma_{i}$ matches $E_{s}$ in that position.


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How to preprocess the pattern strings?

## Modifying the Linear Tree Pattern Matching

Pattern string preprocessing:

- The $k+1$ pattern strings $\sigma_{1}, \ldots, \sigma_{k+1}$ are preprocessed to produce an automation that recognizes every instance of these strings.
- Method: Aho-Corasick (AC) algorithm.
- The AC algorithm constructs the desired automaton in time proportional to the sum of the lengths of all pattern strings.


## Modifying the Linear Tree Pattern Matching

What does a Aho-Corasick automaton for a set of pattern strings $\sigma_{1}, \ldots, \sigma_{k+1}$ do?

- Takes the subject string $E_{s}$ as input.
- Outputs the locations in $E_{s}$ at which the $\sigma$ 's appear as substrings, together with the corresponding $\sigma$ 's.
- For example, a Aho-Corasick automaton for the strings he, she, his, hers returns on the input string ushers the locations 4 (match for she and he) and 6 (match for hers).


## Modifying the Linear Tree Pattern Matching

Aho-Corasick automaton

- consists of a set of states, represented by numbers,
- processes the subject string by successively reading symbols in it, making state transitions and occasionally emitting output,
- is controlled by three functions:

1. a goto function $g$,
2. a failure function $f$,
3. a output function output.

## Modifying the Linear Tree Pattern Matching

Construction of the Aho-Corasick automation:

- Determine the states and the goto function.
- Compute the failure function.
- Computation of the output function begins on the first step and is completed on the second.


## Modifying the Linear Tree Pattern Matching

## Example

Construction of the Aho-Corasick automation for the pattern strings he, she, his, hers.

The goto function $g$ : states $\times$ letters $\rightarrow$ states $\cup\{$ fail $\}:$

## Modifying the Linear Tree Pattern Matching

## Example

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The goto function $g$ : states $\times$ letters $\rightarrow$ states $\cup\{$ fail $\}$ :


$$
\text { output }(2)=\{\text { he }\}
$$

## Modifying the Linear Tree Pattern Matching

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The goto function $g$ : states $\times$ letters $\rightarrow$ states $\cup\{$ fail $\}$ :


$$
\begin{aligned}
\text { output }(2) & =\{\text { he }\} \\
\text { output }(5) & =\{\text { she }\}
\end{aligned}
$$

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The goto function $g$ : states $\times$ letters $\rightarrow$ states $\cup\{$ fail $\}$ :


$$
\begin{aligned}
& \text { output }(2)=\{\text { he }\} \\
& \text { output }(5)=\{\text { she }\} \\
& \text { output }(7)=\{\text { his }\}
\end{aligned}
$$

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The goto function $g$ : states $\times$ letters $\rightarrow$ states $\cup\{$ fail $\}$ :


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& \text { output }(2)=\{\text { he }\} \\
& \text { output }(5)=\{\text { she }\} \\
& \text { output }(7)=\{\text { his }\} \\
& \text { output }(9)=\{\text { hers }\}
\end{aligned}
$$

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& \text { output }(2)=\{\text { he }\} \\
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& \text { output }(7)=\{\text { his }\} \\
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## Modifying the Linear Tree Pattern Matching

## Example

AC automation for the pattern strings $h h a, h, b a$.


1,3,5 : primary accepting states.
2 : secondary accepting state ( $h$ is a suffix of $h h$ ).

## Modifying the Linear Tree Pattern Matching

- For each secondary accepting state there is a unique primary accepting state with exactly the same output set.
- Modify construction of AC automaton by maintaining pointers from secondary accepting states to the corresponding accepting states.


## Modifying the Linear Tree Pattern Matching

- Construction of Aho-Corasick automaton takes $O(m)$ time.
- The output set is represented as a linked list, which is inappropriate for our purpose.
- Given an arbitrary string, we want to determine in constant time whether it is in the output set.


## Modifying the Linear Tree Pattern Matching

- Construction of Aho-Corasick automaton takes $O(m)$ time.
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- Idea: Copy the output set into an array.


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- Question: How many elements do we have to copy?


## Modifying the Linear Tree Pattern Matching

- Construction of Aho-Corasick automaton takes $O(m)$ time.
- The output set is represented as a linked list, which is inappropriate for our purpose.
- Given an arbitrary string, we want to determine in constant time whether it is in the output set.
- Idea: Copy the output set into an array.
- Question: How many elements do we have to copy?
- Answer: As many as in the output sets of all primary accepting states, which is $O(m)$ (because any string in a primary accepting state is a suffix of the longest string in this state.)


## Modifying the Linear Tree Pattern Matching

Linear Tree Pattern Matching:

1. Construct Aho-Corasick automaton for the pattern strings.
2. Visit each primary accepting state and copy its output set into a boolean array.
3. Scan the $E_{s}$ with this automaton.
4. During this process, with each entry in $E_{s}$ store the state of automaton upon reading the function symbol in that entry.
5. If this state is a secondary accepting state, instead of it store the corresponding primary accepting state.
6. To determine whether there is a match for a pattern string $\sigma$ at the position $i$ requires verifying the state associated with the $i+|\sigma|-1$ 'th entry in $E_{s}$ :

- This should be a primary accepting state and
- Its output set should contain $\sigma$.


## Consistency Checking

For nonlinear patterns the computed replacements have to be checked for consistency.

- Idea: Assign integer codes (from 1 to $n$ ) to the nodes in the subject tree.
- Two nodes get the same encoding iff the subtrees rooted at them are identical.
- Such an encoding can be computed in $O(n)$.


## Consistency Checking

Computing the encoding:

- Bottom up: First, sort the leaves with respect to their labels and take the ranks as the integers for encoding. Duplicates are assigned the same rank.
- Suppose the encoding for all nodes up to the height $i$ is computed.
- Computing the encoding of the nodes at height $i+1$ :
- Assign to each node $v$ at the level $i+1$ a vector $\left\langle f, j_{1}, \ldots, j_{n}\right\rangle$.
- $f$ is the label of $v$ and $j_{i}$ is the encoding of its $i$ 's child.
- The vectors assigned to all nodes at $i+1$ are radix sorted.
- If the rank of $v$ is $\alpha$ and the largest encoding among the nodes at level $i$ is $\beta$, then the encoding for $v$ is $\alpha+\beta$.


## Consistency Checking

Checking consistency:

- Consistency of replacements is checked as they are computed.
- For each variable in the pattern, the encoding for the replacement of its first occurrence is computed and is entered into a table.
- For the next occurrence of the same variable, compare encoding of its replacement to the one in the table.
- If the check succeeds, proceed further. Otherwise report a failure and start matching procedure at another position in $E_{s}$.
- These steps do not increase the complexity of the algorithm.


## The Last Word

Nonlinear tree pattern matching can be done in $O\left(n K^{*}\right)$ time.

## Example

$$
f(f(a, X), X) \quad f(f(a, b), f(f(a, a), a))
$$



Pattern tree $p$
Subject tree $s$

## Example (Cont.)

- $E_{p}=\mathrm{ffafXffxf}$
- AC automation for the pattern strings ffaf, ff, f.


$$
\begin{aligned}
& \text { output }(1)=\{\mathrm{f}\} \\
& \text { output }(2)=\{\mathrm{ff}, \mathrm{f}\} \\
& \text { output }(4)=\{\mathrm{ffaf}, \mathrm{f}\} \\
& \text { failure }(1)=\text { failure }(3)=0 \\
& \text { failure }(2)=\text { failure }(4)=1
\end{aligned}
$$

## Example (Cont.)

$$
\sigma_{1}=\mathrm{ffaf}, \quad \sigma_{2}=\mathrm{ff}, \quad \sigma_{3}=\mathrm{f}
$$

$$
\begin{array}{llllllllllllllllll}
1 & 2 & 3 & 4 & 5 & 6 & 7 & 8 & 9 & 10 & 11 & 12 & 13 & 14 & 15 & 16 & 17
\end{array}
$$

| $C_{s}$ | 1 | 2 | 4 | 2 | 5 | 2 | 1 | 3 | 6 | 8 | 6 | 9 | 6 | 3 | 7 | 3 | 1 |
| :--- | ---: | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| $E_{\boldsymbol{s}}$ | f | f | a | f | b | f | f | f | f | a | f | a | f | f | a | f | f |
| IsFirst | T | T | T | F | T | F | F | T | T | T | F | T | F | F | T | F | F |
| lastptr | 17 | 6 | 3 | - | 5 | - | - | 16 | 13 | 8 | - | 9 | - | - | 15 | - | - |
| IsLast | F | F | T | F | T | T | F | F | F | T | F | T | T | F | T | T | T |
| state | 1 | 2 | 3 | 4 | 0 | 1 | 2 | 2 | 2 | 3 | 4 | 0 | 2 | 2 | 3 | 4 | 2 |

- In the first row, the numbers from 1 to 17 - array indices.
- $C_{s}$ and $E_{s}$ - the Euler chain and the Euler string for $s$.
- For an index i,
- IsFirst[i] $=\mathrm{T}$ iff $C_{s}$ [i] occurs first time in $C_{s}$.
- if IsFirst[i] $=\mathrm{T}$ then lastptr[ i ] $=\mathrm{j}$ where j is the index of the last occurrence of the number $C_{s}[i]$ in $C_{s}$.
- IsLast[i] $=\mathrm{T}$ iff $C_{s}$ [i] occurs last time in $C_{s}$.
- state[i] is the state of the automaton after reading $E_{s}[i]$.


## Reference

R. Ramesh and I. V. Ramakrishnan.

Nonlinear pattern matching in trees.
J. ACM, 39(2):295-316, 1992.

