# EECS 4101-5101 <br> Advanced Data Structures 

Shahin Kamali<br>Topic 7: String Data Structures<br>York University

Picture is from the cover of the textbook CLRS.

## Objectives

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- Describe basic data structures (e.g., tries, Patricia trees) for maintaining dictionaries of strings and explain how search, insert, delete operations are answered using them.


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- By the end of this module, you will be able to:
- Explain dictionary abstract data types for maintaining a collection of strings.
- Describe basic data structures (e.g., tries, Patricia trees) for maintaining dictionaries of strings and explain how search, insert, delete operations are answered using them.
- Explain Suffix trees and their application in answering pattern matching queries.
- Trie: A dictionary for binary strings
- Items (keys) are stored only in the leaf nodes
- A left child corresponds to a 0 bit
- A right child corresponds to a 1 bit
- Keys can have different number of bits
- prefix-free: no key is a prefix of another key
- A prefix of a string $S[0 . . n-1]$ :
a substring $S[0 . . i]$ of $S$ for some $0 \leq i \leq n-1$
- Example: A trie for $S=\{00,110,111,01010,01011\}$

- Search: start from the root, follow the relevant path using bitwise comparisons
- Example: Search(01010)

- Search: start from the root, follow the relevant path using bitwise comparisons
- Example: Search(01010) successful

- Search: start from the root, follow the relevant path using bitwise comparisons
- Example: Search(0100)

- Search: start from the root, follow the relevant path using bitwise comparisons
- Example: Search(0100) unsuccessful



## Tries: Insert

- Insert( $x$ ): First search for $x$
(a) If we finish at a leaf with key $x$, then $x$ is already in trie: do nothing (e.g., when $x=110$ ).
(b) If we finish at a leaf with a key $y \neq x$, then $y$ is a prefix of $x$ : not possible because our keys are prefix-free (e.g., $x=1100$ )
(c) If we finish at an internal node and there are no extra bits: not possible because our keys are prefix-free (e.g., when $x=11$ )
(d) If we finish at an internal node and there are extra bits: expand trie by adding necessary nodes that correspond to extra bits



## Tries <br> Tries: Insert

- Insert( $x$ ): First search for $x$
- Case (d) example: $\operatorname{Insert}(01000)$



## Tries <br> Tries: Insert

- Insert( $x$ ): First search for $x$
- Search(01000) unsuccessful Extra bits: 00

- Insert( $x$ ): First search for $x$


Tries

## Tries: Delete

- Delete( $x$ )
- Search for $x$ to find the leaf $v_{x}$
- Delete $v_{x}$ and all ancestors of $v_{x}$ until we reach an ancestor that has two children


## Tries <br> Tries: Delete

- Delete( $x$ )
- Example: Delete(01010)



## Tries <br> Tries: Delete

- Delete( $x$ )
- Example: Delete(01010)
- Search(01010) successful



## Tries: Delete

- Delete $(x)$
- Example: Delete(01010)



## Tries <br> Tries: Operations

- Time Complexity of all operations (search, insert, delete) is $\Theta(|x|)$ $|x|$ : length of binary string $x$, i.e., the number of bits in $x$


## Compressed Tries (Patricia Tries)

- Patricia: Practical Algorithm To Retrieve Information Coded in Alphanumeric (Introduced by Morrison (1968))
- Reduces storage requirement: eliminate nodes with only one child
- Every path of one-child nodes is compressed to a single edge
- Each node stores an index indicating the next bit to be tested during a search
- A compressed trie storing $n$ keys always has $n-1$ internal (non-leaf) nodes
- Each node stores an index indicating the next bit to be tested during a search
- Example: A trie



## Compressed Tries (Patricia Tries)

- Each node stores an index indicating the next bit to be tested during a search
- Equivalent compressed trie



## Compressed Tries: Operations

- Search $(x)$ :
- Follow the proper path from the root down in the tree to a leaf
- If search ends in an internal node, it is unsuccessful
- E.g., search for 011: we search index 0, go to the left, index 1 , go to the right, and then there is no index 4 ; terminate!



## Compressed Tries: Operations

- Search $(x)$ :
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- If search ends in an internal node, it is unsuccessful
- E.g., search for 011: we search index 0, go to the left, index 1 , go to the right, and then there is no index 4 ; terminate!
- In search ends in a leaf, we need to check again if the key stored at the leaf is indeed $x$.
- e.g., search for 01110; we end up in a leaf but the search is not successful!



## Compressed Tries: Operations

- Delete $(x)$ :
- Perform Search $(x)$ to find $x$ in a leaf
- If the search was successful, delete the leaf and its parent
- E.g., delete $\mathbf{0 1 0 1 0}$ from the trie



## Compressed Tries: Operations

- Delete $(x)$ :
- Perform Search $(x)$ to find $x$ in a leaf
- If the search was successful, delete the leaf and its parent
- E.g., delete 01010 from the trie



## Compressed Tries: Operations

- Insert( $x$ ):
- Perform Search $(x)$; If the search ends at a leaf $L$ with key $y$, compare $x$ and $y$ to find the first index $i$ where they disagree.
- Then create a new node $N$ with index $i$.
- Insert $N$ along the path from the root to $L$ so that the parent of $N$ has index $<i$ and one child of $N$ is either $L$ or an existing node on the path from the root to $L$ that has index $>i$.
- The other child of $N$ will be a new leaf node containing $x$.
- E.g., insert 01111: create $N$ with index 2, insert it between nodes with indices 1 and 4 on the path to the leaf



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## Compressed Tries: Operations

- Insert( $x$ ):
- If the search ends at an internal node, we find the key corresponding to that internal node and proceed in a similar way to the previous case.
- E.g., insert 0100: create $N$ with index 3, insert it between nodes with indices 1 and 4 on the path to the leaf



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- Insert( $x$ ):
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## Multiway Tries

- To represent Strings over any fixed alphabet $\Sigma$
- Any node will have at most $|\Sigma|$ children
- Example: A trie holding strings \{bear, bell, ben, soul, soup\}



## Multiway Tries

- Allow strings that are prefixes of other strings:

Append a special end-of-word character, say $\$$, to all keys

- Example: A trie holding strings \{bear, bell, be, so, soul, soup\}



## Multiway Tries

- Compressed multi-way tries
- Example: A compressed trie holding strings \{bear, bell, be, so, soul, soup\}



## Pattern Matching

- Search for a the first occurrence of a pattern $P$ in a large body of text $T$.
- Example:
- $T=$ "Where is he?"
- $P_{1}=$ "he"
- $P_{2}=$ "who"
- If $P$ does not occur in $T$, return FAIL
- Applications:
- Information Retrieval (text editors, search engines)
- Bioinformatics
- Data Mining


## Tries

## Suffix Trees

- A suffix of $T$ :
a substring $T[i . . n-1]$ of $T$ for some $0 \leq i \leq n-1$
- Build a compressed trie that stores all suffixes of text $T$
- Insert suffixes in decreasing order of length
- If a suffix is a prefix of another suffix, we do not insert it
- Store two indexes $I, r$ on each node $v$ (both internal nodes and leaves) where node $v$ corresponds to substring $T[/ . . r]$


## Suffix Trees: Example

$T=$ bananaban


| 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| b | a | n | a | n | a | b | a | n |

## Suffix Trees: Pattern Matching

To search for pattern $P$ of length $m$ :

- Similar to Search in compressed trie with the difference that we are looking for a prefix match rather than a complete match
- If we reach a leaf with a corresponding string length less than $m$, then search is unsuccessful (e.g., search for "abana")
- Otherwise, we reach a node $v$ (leaf or internal) with a corresponding string length of at least $m$. Then it suffices to check the first $m$ characters of that string to see if there indeed is a match (e.g., search for "anab")



## Tries <br> String Data Structures Summary

- If you need to store a dictionary of multiple strings, use a compressed Patricia tree for better search, insert, delete time.


## String Data Structures Summary

- If you need to store a dictionary of multiple strings, use a compressed Patricia tree for better search, insert, delete time.
- If you need to store a text $T$ to support pattern-matching queries, maintain a Suffix tree of $T$.

