# Advanced Algorithm Design and Analysis (Lecture 4)

SW5 fall 2004
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### Text-Search Data Structures

- Goals of the lecture:
  - Dictionary ADT for strings:
    - to understand the principles of tries, compact tries, Patricia tries
  - Text-searching data structures:
    - to understand and be able to analyze text searching algorithm using the suffix tree and Pat tree
  - Full-text indices in external memory:
    - to understand the main principles of String B-trees.

# Dictionary ADT for Strings

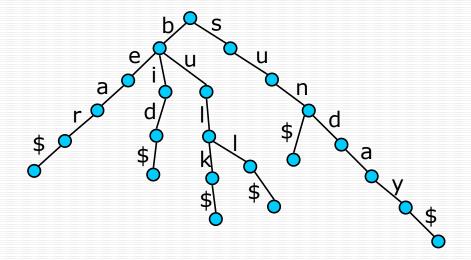
- Dictionary ADT for strings stores a set of text strings:
  - search(x) checks if string x is in the set
  - insert(x) inserts a new string x into the set
  - delete(x) deletes the string equal to x from the set of strings
- Assumptions, notation:
  - n strings, N characters in total
  - $\blacksquare$  m length of x
  - Size of the alphabet  $d = |\Sigma|$

# **BST** of Strings

- We can, of course, use binary search trees.Some issues:
  - Keys are of varying length
  - A lot of strings share similar prefixes
     (beginnings) potential for saving space
  - Let's count comparisons of characters.
    - What is the worst-case running time of searching for a string of length m?

#### **Tries**

- Trie a data structure for storing a set of strings (name from the word "retrieval"):
  - Let's assume, all strings end with "\$" (not in  $\Sigma$ )



Set of strings: {bear, bid, bulk, bull, sun, sunday}

#### Tries II

- Properties of a *trie*:
  - A multi-way tree.
  - Each node has from 1 to d children.
  - Each edge of the tree is labeled with a character.
  - Each *leaf* node corresponds to the stored string, which is a concatenation of characters on a path from the root to this node.

#### Search and Insertion in Tries

```
Trie-Search(t, P[k..m]) //inserts string P into t
01 if t is leaf then return true
02 else if t.child(P[k])=nil then return false
03 else return Trie-Search(t.child(P[k]), P[k+1..m])
```

The search algorithm just follows the path down the tree (starting with Trie-Search(root, P[0..m]))

How would the delete work?

#### Trie Node Structure

- "Implementation detail"
  - What is the node structure? = What is the complexity of the t.child(c) operation?:
    - An array of child pointers of size d: waist of space, but child(c) is O(1)
    - A hash table of child pointers: less waist of space, child(c) is expected O(1)
    - A **list** of child pointers: compact, but child(c) is O(d) in the worst-case
    - A binary search tree of child pointers: compact and child(c) is O(lg d) in the worst-case

# Analysis of the Trie

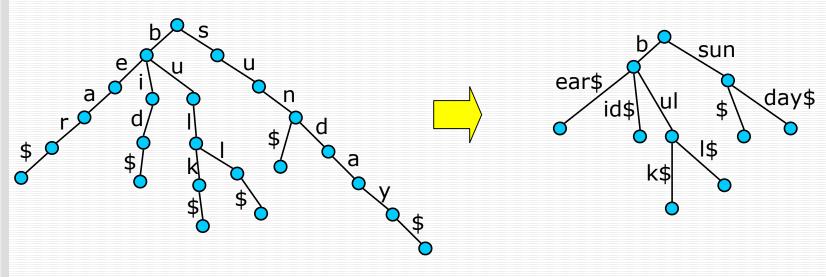
#### Size:

- O(N) in the worst-case
- Search, insertion, and deletion (string of length m):
  - depending on the node structure:
     O(dm), O(m lg d), O(m)
  - Compare with the string BST
- Observation:
  - Having chains of one-child nodes is wasteful

### **Compact Tries**

#### Compact Trie:

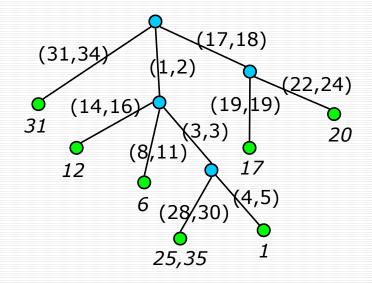
- Replace a chain of one-child nodes with an edge labeled with a string
- Each non-leaf node (except root) has at least two children



# Compact Tries II

- Implementation:
  - Strings are external to the structure in one array, edges are labeled with indices in the array (from, to)
- Can be used to do word matching: find where the given word appears in the text.
  - Use the compact trie to "store" all words in the text
  - Each child in the compact trie has a list of indices in the text where the corresponding word appears.

# Word Matching with Tries



1 2 3 4 5 6 7 8 9 10 12 14 16 18 20 22 24 26 28 30 32 34 36 38 40 7: they think that we were there and there

- To find a word P:
  - At each node, follow edge (i,j), such that P[i..j] = T[i..j]
  - If there is no such edge, there is no *P* in *T*, otherwise, find all starting indices of *P* when a leaf is reached

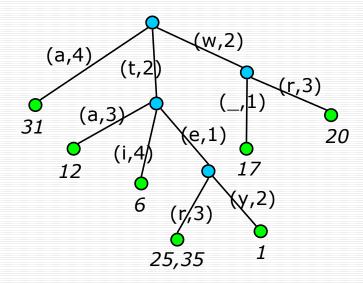
# Word Matching with Tries II

- Building of a compact trie for a given text:
  - How do you do that? Describe the compact trie insertion procedure
  - Running time: O(N)
- Complexity of word matching: O(m)
- What if the text is in external memory?
  - In the worst-case we do O(m) I/O operations just to access single characters in the text – not efficient

#### Patricia trie

#### Patricia trie:

 a compact trie where each edge's label (from, to) is replaced by (T[from], to - from + 1)



1 2 3 4 5 6 7 8 9 10 12 14 16 18 20 22 24 26 28 30 32 34 36 38 40

7: they think that we were there and there

# Querying Patricia Trie

■ Word prefix query: find all words in *T*, which start with *P*[0..*m*-1]

```
Patricia-Search(t, P, k) // inserts P into t
01 if t is leaf then
02 i \leftarrow \text{the first index in the t.list}
03 if T[j..j+m-1] = P[0..m-1] then
        return t.list // exact match
04
05 else if there is a child-edge (P[k],s) then
06
          if k + s < m then
07
            return Patricia-Search(t.child(P[k]), P, k+s)
         else go to any descendent leaf of t and do the
0.8
              check of line 03, if it is true, return
              lists of all descendent leafs of t,
              otherwise return nil
       09
```

# Analysis of the Patricia Trie

- Idea of patricia trie postpone the actual comparison with the text to the end:
  - If the text is in external memory only O(1) I/O are performed (if the trie fits in main-memory)
- Build a Patricia Trie for word matching:

```
1 2 3 4 5 6 7 8 9 10 12 14 16 18 20 22 24 26 28 30 32 34 36 38 40

7: føtex har haft en fødselsdag | | | | | | | | |
```

- Usually binary patricia tries are used:
  - Consider binary encoding of text (and queries)
  - Each node in the tree has two children (left for 0, right for 1)
  - Edges are labeled just with skip values (in bits)

#### Text-Search Problem

#### ■ Input:

- Text T = "carrara"
- Pattern P = "ar"
- Output:
  - All occurrences of P in T
- Reformulate the problem:
  - Find all suffixes of T that has P as a prefix!
  - We already saw how to do a word prefix query.

carrara

arrara

rrara

rara

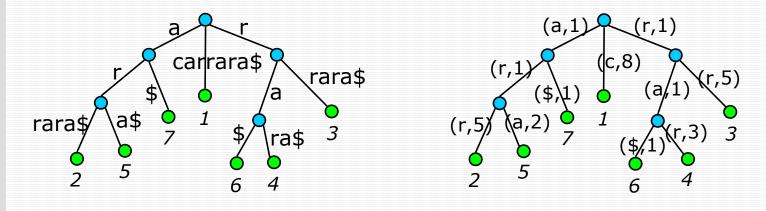
ara

ra

a

### **Suffix Trees**

- Suffix tree a compact trie (or similar structure) of all suffixes of the text
  - Patricia trie of suffixes is sometimes called a Pat tree



1 2 3 4 5 6 7 8 Carrara\$

# Pat Trees: Analysis

- Text search for P is then a prefix query.
  - Running time: O(m+z), where z is the number of answers
  - Just O(1) I/Os if the text is in external-memory (independent of z)!
- The size of the Pat tree: O(N)
  - Why?
  - Advantage of compression: the size of the simple trie of suffixes would be in the worst-case  $N + (N-1) + (N-2) + ... 1 = O(N^2)$

# Constructing Suffix Trees

- The naïve algorithm
  - Insert all suffixes one after another: O(N²)
- Clever algorithms: O(N)
  - McCreight, Ukkonen
  - Scan the text from left to right, use additional suffix links in the tree
- Question: How does the the Pat tree looks like after inserting the first five prefixes using the naïve algorithm?

Honolulu\$

#### **Full-Text Indices**

- What if the Pat tree does not fit in main memory?
- A number of external-memory data structures were proposed:
  - SPat arrays
  - String B-trees
- String B-tree:
  - A B-tree for strings, i.e., supports dictionary operations
  - Can be used for text-searching if all suffixes are stored in it

# String B-tree

#### Rough idea:

- Text is external to the tree, strings are represented in the B+-tree by the indices of where they begin in the text
  - This would mean doing O(Ig B) I/Os when visiting each node – too much!
- Idea organize all keys in each node into a Patricia trie. When searching this trie (without any I/Os):
  - We reach a leaf. What then?
  - We stop in the middle. What then?
- The total running time of text search:
  - $O((m+z)/B + \log_B N)$