

# Tries and suffixes trees

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## Trie: A data-structure for a set of words

All words over the alphabet  $\Sigma=\{a,b,\dots,z\}$ .

In the slides, the alphabet is only  $\{a,b,c,d\}$ .

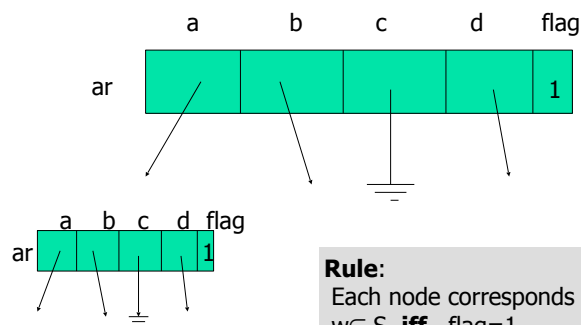
$S$  – set of words =  $\{a,aba, a, aca, addd\}$ .

Need to support the operations

- $insert(w)$  – add a new word  $w$  into  $S$ .
- $delete(w)$  – delete the word  $w$  from  $S$ .
- $find(w)$  is  $w$  in  $S$  ?
  - Future operation:
    - Given text (many words) where is  $w$  in the text.
- The time for each operation should be  $O(k)$ , where  $k$  is the number of letters in  $w$
- Usually each word is associated with addition info – not discussed here.

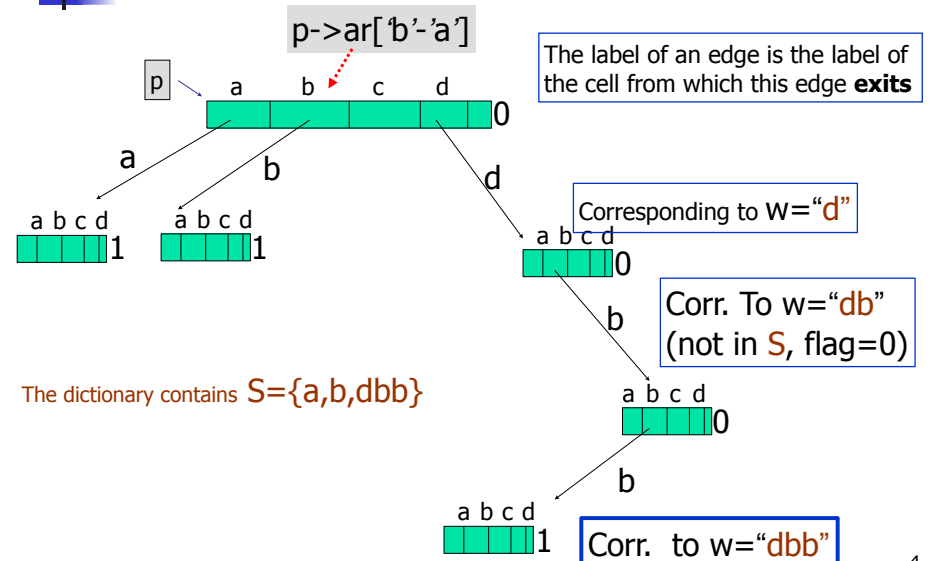
## Trie (Tree+Retrive) for S

- A tree where each node is a struct consist
- Struct node {
  - char[4] \*ar;
  - char flag ; /\* 1 if a word ends at this node. Otherwise 0 \*/



**Rule:**  
Each node corresponds to a word  $w$ .  
 $w \in S$  **iff**  $flag=1$

## A trie - example



## Finding if word $w$ is in the tree

```
p=root; i=0 // remember - each string ends with '\0'
While(1){
  ▪ If  $w[i] == '\0'$  //we have scanned all letters of  $w$ 
    ▪ then return the flag of  $p$  ; else
  ▪ If  $(p \cdot a[w[i] - 'a']) == NULL$  //the entry of  $p$  correspond to  $w[i]$  is NULL
    return false;
  ▪  $p = (p \cdot a[w[i] - 'a'])$  //Set  $p$  to be the node pointed by this entry
  ▪  $i++$ ;
}
```

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## Inserting a word $w$

- Try to perform  $\text{find}(w)$ .
  - If runs into a NULL pointers, create new nodes along the path.
  - The flag fields of all new nodes is 0.
- Set the flag of the last node to 1

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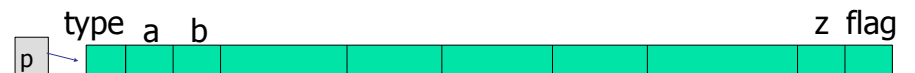
## Deleting a word $w$

- Find the node  $p$  corresponding to  $w$  (using 'find' operation).
- Set the flag field of  $p$  to 0.
- If  $p$  is dead (I.e.  $\text{flag}==0$  and all pointers are NULL ) then  $\text{free}(p)$ , set  $p=\text{parent}(p)$  and repeat this check.

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## Heuristics for saving space

- The space required is  $\Theta(|\Sigma| |S|)$ .
- To save some space, if  $\Sigma$  is larger, there are a few heuristics we can use. Assume  $\Sigma=\{a,b..z\}$  .
- We use two types of nodes
  - Type "A", which is used when the number of children of a node is more than 3

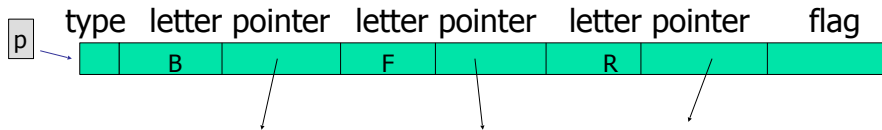


Note – the letters are not stores explicitly

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## Heuristics for space saving

- Type "B" is used if there are 3 or less children:
- The "letter" of the child is also stored:

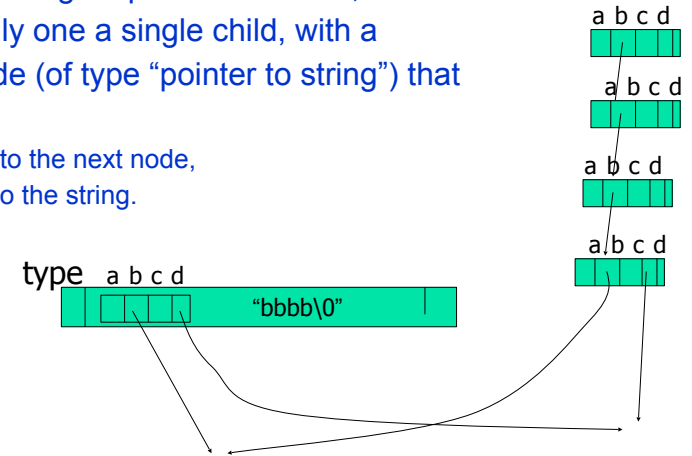


- The rule of the flag is the same as in type "A" nodes.
- We only store the 3 pointers, but we need to know to which letters they corresponds to.

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## Another Heuristics – path compression

- Replace a long sequence of nodes, all having only one a single child, with a single node (of type "pointer to string") that maintains
  - a point to the next node,
  - a point to the string.



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## Suffix tree.

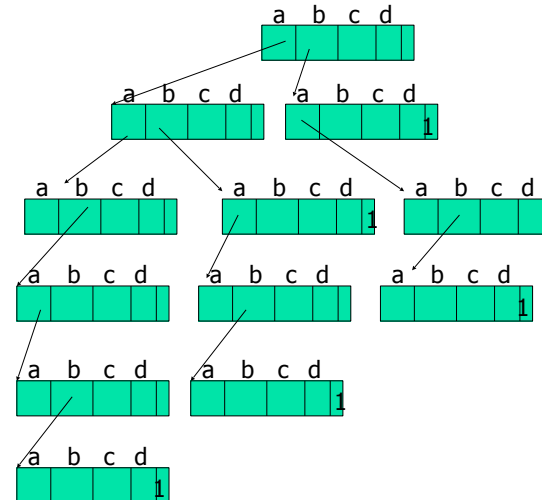
- Assume  $B$  (for book) is a very long text.
- Want to preprocess  $B$ , so when a word  $w$  is given, we can quickly find if it is in  $B$ .
- We can find it in  $O(|w|)$ .
- Idea:
  - Consider  $B$  as a long string.
  - Create a trie  $T$  of all suffixes of  $B$ .
  - In addition to the flag (specifying if a word ends at node), we also stored the index in  $B$  where this word begins.
  - Example  $B = \text{"aabab"}$   
 $S = \{\text{"aabab"}, \text{"abab"}, \text{"bab"}, \text{"ab"}, \text{"b"}\}$

Observation:  $w$  appears in  $B \Leftrightarrow w$  is the prefix of a suffix of  $B$ .  
 Example:  $B = \text{"helloniceworld"}, w = \text{"nice"}.$

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To know **where** a word appear in  $B$ , we store with each node the index of the beginning of the suffix in  $B$ .

(we can store only the first appearance of the word in the text)

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## Size of suffix tree

Example  $B = \text{"aabab"}$   $S = \{\text{"aabab"}, \text{"abab"}, \text{"bab"}, \text{"ab"}, \text{"b"}\}$

Assume  $n = |B|$ .

Total length of all string  $\Theta(n^2)$

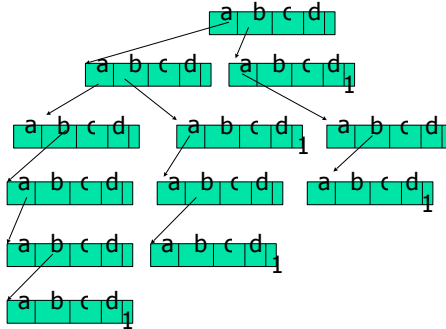
Size of a node is  $|\Sigma|$

So size of the tree is  $\Theta(n^2 |\Sigma|)$ .

Time to construct the tree  $\Theta(n^2)$

We can save some space.

Example  $B = \text{"aabab"}$   
 $S = \{\text{"aabab"}, \text{"abab"}, \text{"bab"}, \text{"ab"}, \text{"b"}\}$



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## Suffix tries on a diet

**Def:** a *thread* is a path from node  $u$  to node  $v$  in the trie, consisting of nodes of outdegree 1 (except maybe the last one) and  $flag=0$ .

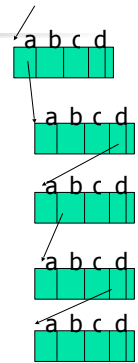
**Obs:** There is a contiguous part of  $B$ , identical to the string the shred represents. We call this part the shred-string

We store the book  $B$  itself as an array.

We use a new type of nodes, called thread-nodes, maintain the first ( $id1$ ) and last ( $id2$ ) indexes of the shred-string in  $B$ .

type	a	b	c	d	id1	id2	flag
					7	10	

$B = \overset{1}{\text{c}}\overset{7}{\text{a}}\overset{10}{\text{b}}\text{d}\text{a}\text{a}\text{d}\text{b}$



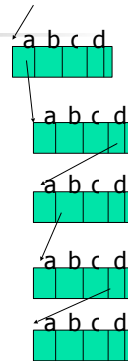
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## Suffix tries on a diet - cont

Algorithm for constructing a "thin" trie:

Given  $B$  – create an empty trie  $T$ , and insert all  $n$  suffixes of  $B$  into  $T$  --- generating a trie of size  $\Theta(n^2)$ .

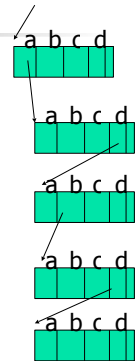
Traverse the tries, and each time that a shred is seen, replace all nodes of the shred with a single shred-node.



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## Suffix tries on a diet - cont

- Clearly the use of thread-nodes saves some-but can we prove something?
- Observations:** Every leaf of  $T$  must be the end of some prefix of  $B$ . So the number of number of leaves of  $T$  is  $\leq n$ .
- $n = |B|$
- To bound the size of  $T$ , we will need to bound the number of internal nodes.
- Observations:**
  - $T$  might contain special nodes whose  $flag=1$  (a suffix terminates at these nodes).
  - The number of special nodes is  $\leq n$  (since this is the number of suffixes).
- What about other internal nodes of  $T$ ?



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## Suffix tries on a diet - cont

**Lemma:** Let  $T'$  be a rooted tree with  $m$  leaves, where each internal node has  $\geq 2$  children. Then  $T'$  has  $\leq m$  internal nodes. (proof - easy induction. Homework)

Back to thin suffix tries  $T$ :

- $T$  has  $\leq n$  special nodes (with flag=1) and
  - $T$  has  $\leq n$  leaves.
  - Every other nodes has  $\geq 2$  children. (with flag=1). Applying the Lemma in this case, implies that the total number of internal nodes  $\leq 2n$ .
- **Conclusion:** The number of nodes in  $T$  is  $\leq 3n$  (much better than the uncompressed version that could have  $\Theta(n^2)$  nodes.
- So the size of the trie is only a constant more than the size of the book.

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## Quadtrees

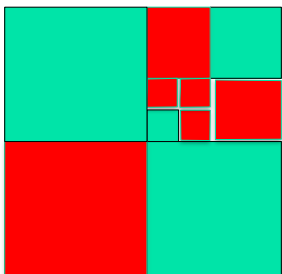
:

A simple data structure for geometric objects (e.g. points, houses, an image, 3D scene)

Support efficiently a very wide variety of queries.

Shares similarities with tries, hence taught together.

## QuadTrees



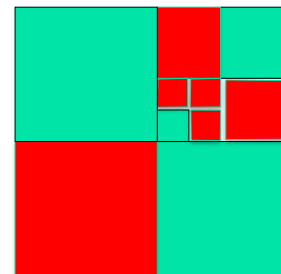
Assume we are given a red/green picture defined a  $2^h \times 2^h$  grid. E.g. pixels. Each pixel is either **green** or **red**.

(more general and interesting examples – soon)

Need to represent the shape “compactly”

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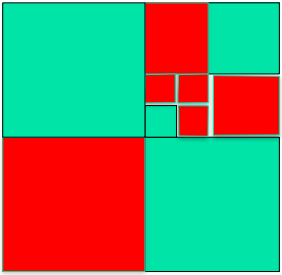
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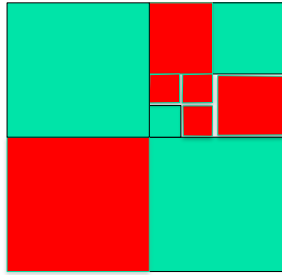
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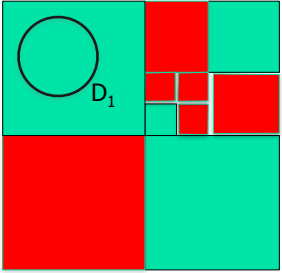
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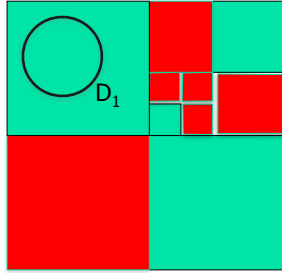
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3. How many green points are there in  $D$  ?
4. Etc etc

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# Regions of nodes

A tree where each internal node has 4 children.

In general, every node  $v$  is associated with a region of the plane. Lets denote this region by  $R(v)$ .

$R(\text{root})$  is the whole region of interest (e.g. input image or USA)

The smallest possible area of  $R(v)$  is a single **pixel**.

For every non-root node  $v$ , we have  $R(v) \subset R(\text{parent}(v))$

Let  $NW(v)$  denote the North West child of  $v$ . (similarly  $NE, SW, SE$ )

$R(v)$  = is the union of  $R(NW(v)), R(NE(v)), R(SW(v)), R(SE(v))$

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# QuadTrees

- Assume we are given a red/green picture defined on a  $2^h \times 2^h$  grid of **pixels**.
- Each pixel has as a unique color (**Green** or **Red**)
- Every node  $v \in T$  is associated with a **geometric region**  $R(v)$

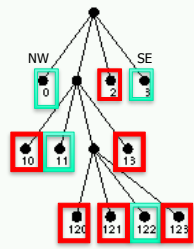
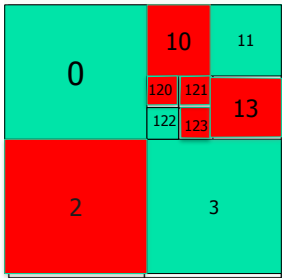
Alg constructQT for a shape  $S$ .

- **input** – a node  $v \in T$ , and a shape  $S$ .
- **Output** – a Quadtree  $T_v$  representing the shape of  $S$  within  $R(v)$ .

- If  $S$  is fully **green** in  $R(v)$ , or  $S$  is fully **red** in  $R(v)$  – then  $v$  is a leaf, labeled **Green** or **Red**. Return ;
- Otherwise, divide  $R(v)$  into 4 equal-sized quadrants, corresponding to nodes  $v.NW, v.NE, v.SW, v.SE$ .
- Call constructQT recursively for each quadrant.

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# QuadTrees



Consider a picture stored on an  $2^h \times 2^h$  grid. Each pixel is either red or green.

We can represent the shape “compactly” using a QT.

Height – at most  $h$ .

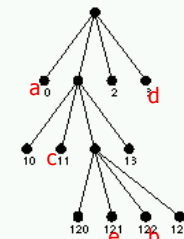
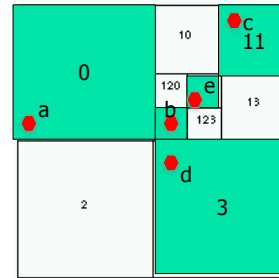
Point location operation – given a point  $q$ , is it black or white

- takes time  $O(h)$
- could it be much smaller ?

Many other operations are very simple to implement.

# QuadTree for a set of points

given: a set of points  $S = \{a, b, c, d, e\}$ , each with its  $(x, y)$  coordinates



Now consider a set of points (red) but on a  $2^h \times 2^h$  grid.

Splitting policy: Split until each quadrant contains  $\leq 1$  point.

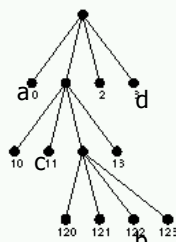
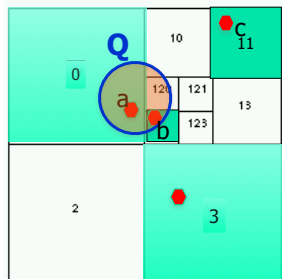
Build a similar QT, but we stop splitting a quadrant when it contains  $\leq 1$  point (or some other small constant)

Point location operation – given a point  $q$ , is it black or white

- takes time  $O(h)$  (in practice, usually much less)

Many other **splitting policies** are very simple to implement. (eg. A leaf could contain  $\leq 17$  points)

# QuadTrees for a set of points

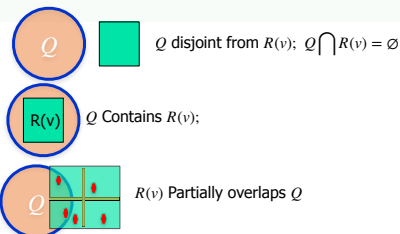


Report( $Q, v$ )

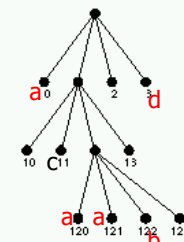
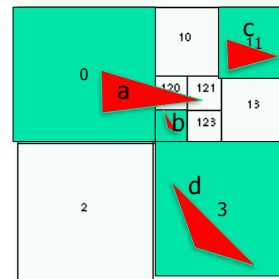
//  $Q$  – a query disk

/\* report all the points in stored at the subtree rooted at  $v$ , which are contained inside  $Q$ . \*/

- 1.If  $v$  is NULL – **return**.
- 2.If  $R(v)$  is disjoint from  $Q$  – **return NULL**.
- 3.If  $R(v)$  is fully contained in  $Q$  – report all points in the subtree rooted at  $v$ .
- 4.If  $v$  is a leaf – check each point in  $R(v)$  if inside  $Q$
- 5.Else //  $R(v)$  Partially overlaps  $Q$   
 Report( $Q, NW(v)$ ) and  
 Report( $Q, NE(v)$ ) and  
 Report( $Q, SW(v)$ ) and  
 Report( $Q, SE(v)$ )



# QuadTrees for shape



Input: Set  $S$  of triangles  $S = \{t_1, \dots, t_n\}$

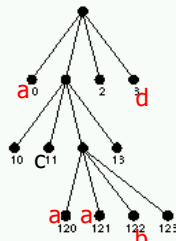
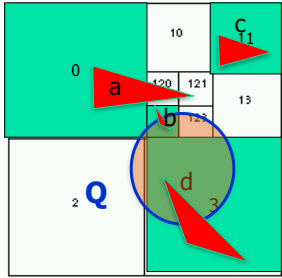
Splitting policy: Split quadrant if it intersects more than 1 triangle of  $S$ .

**Note** – a triangle might be stored in multiple leaves. Some leaves might store no triangles.

Finding all triangles inside a query region  $Q$  – essentially same Report Report( $Q, v$ ) as before (minor modifications)



# QuadTrees for shape



Input: Set  $S$  of triangles  
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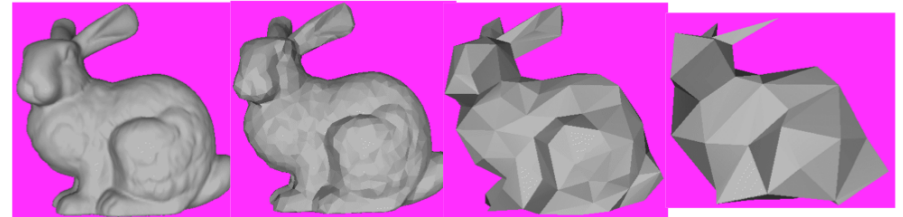
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# Level Of Details

- Idea – the same object is stored several times, but with a different level of details
- Coarser representations for distant objects
- Decision which level to use is accepted 'on the fly' (eg in graphics applications, if we are far away from a terrain, we could tolerate usually large error)



69,451 polys

2,502 polys

251 polys

76 polys