

TREES

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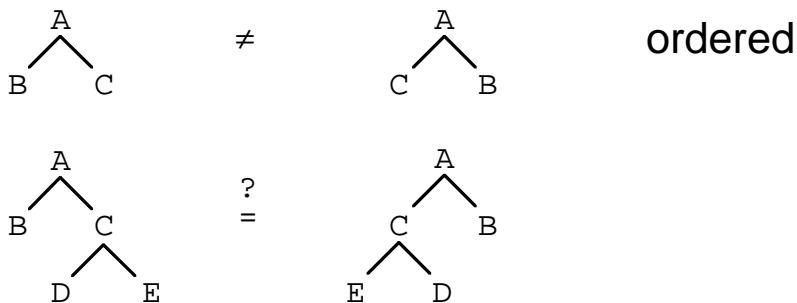
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TREE DEFINITION

- TREE \equiv a branching structure between nodes
- A finite set τ of one or more nodes such that:
 1. one element of the set is distinguished, $\text{ROOT}(\tau)$
 2. the remaining nodes of τ are partitioned into $m \geq 0$ disjoint sets T_1, T_2, \dots, T_m and each of these sets is in turn a tree.
 - trees T_1, T_2, \dots, T_m are the *subtrees* of the root
- Recursive definition – easy to prove theorems about properties of trees.

Ex: prove true for 1 node
 assume true for n nodes
 prove true for $n+1$ nodes

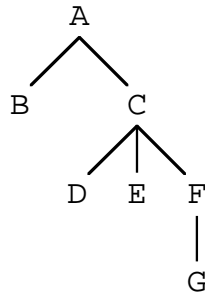
- ORDERED TREE \equiv if the relative order of the subtrees T_1, T_2, \dots, T_m is important
- ORIENTED TREE \equiv order is not important



- Computer representation \Rightarrow ordered!



TERMINOLOGY

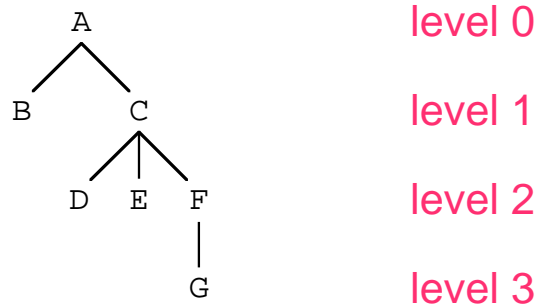


- Counterintuitive!
- DEGREE \equiv number of subtrees of a node
- Terminal node \equiv *leaf* \equiv degree 0
- BRANCH NODE \equiv non-terminal node
- Root is the *father* of the roots of its subtrees
- Roots of subtrees of a node are *brothers*
- Roots of subtrees of a node are *sons* of the node
- The root of the tree has no father!
- A is an *ancestor* of C, E, G, ...
- G is a *descendant* of A

$\text{level}(X) \equiv \text{if father}(X) = \Omega \text{ then } 0$
 $\quad \text{else } 1 + \text{level}(\text{father}(X));$

Ex: $\text{level}(G) = 1 + \text{level}(F)$
 $\quad \quad 1 + \text{level}(C)$
 $\quad \quad \quad 1 + \text{level}(A)$
 $\quad \quad \quad \quad 0$

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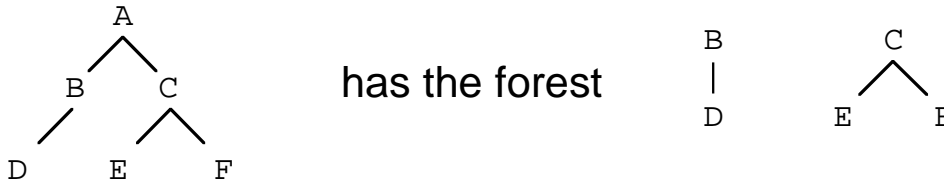
level(X) \equiv if father(X) = Ω then 0
 else 1+level(father(X));

Ex: level(G) = 1+level(F)
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FORESTS AND BINARY TREES

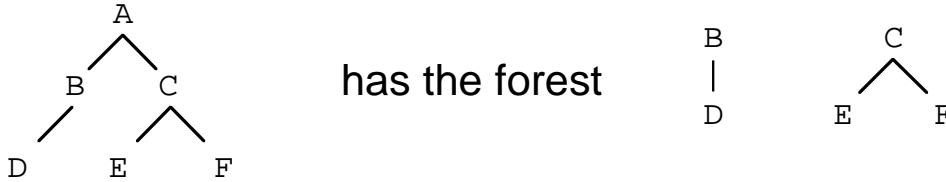
- FOREST \equiv a set (usually ordered) of 0 or more disjoint trees, or equivalently:
the nodes of a tree excluding the root



- BINARY TREE \equiv a finite set of nodes which either is empty *or* a root and two disjoint binary trees called the *left* and *right* subtrees of the root
- Is a binary tree a special case of a tree?

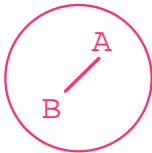
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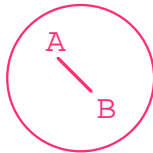
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NO! An entirely different concept



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and

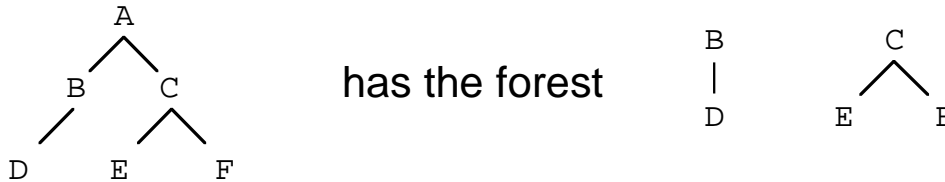


2

are different binary trees

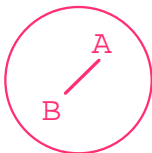
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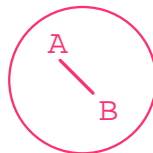
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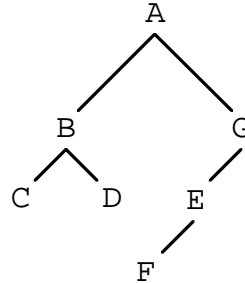
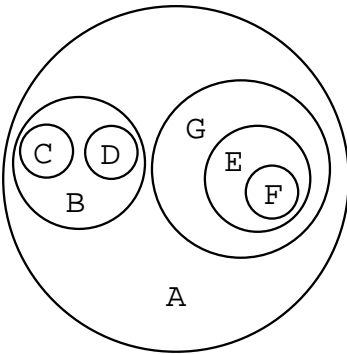
1 has an empty right subtree

2 has an empty left subtree

But as 'trees' 1 and 2 are identical!

OTHER REPRESENTATIONS OF TREES

- Nested sets (also known as 'bubble diagrams')



- Nested parentheses

Tree (root subtree₁ subtree₂ ... subtree_n)
 (A (B (C) (D)) (G (E (F))))

Binary tree (root left right)
 (A (B (C () ()) (D () ()))
 (G (E (F () ()) ()) ()))

- Indentation

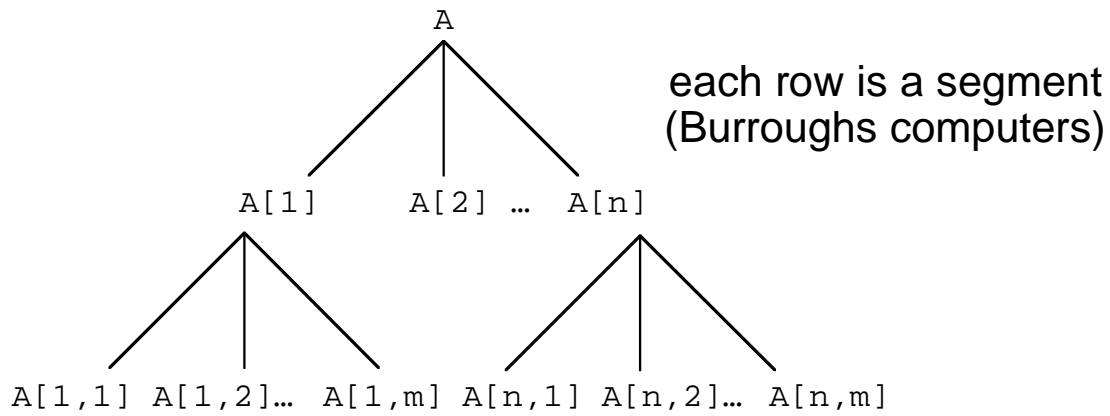
```

A
  B
    C
    D
  G
    E
      F
  
```

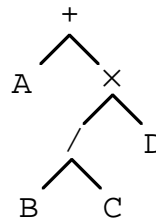
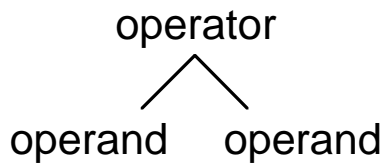
- Dewey decimal notation: 2.1 2.2.2 2.3.4.5

APPLICATIONS

- Segmentation of large rectangular arrays – $A[n,m]$



- Algebraic formulas



$$A + ((B/C) \times D)$$

- no need for parentheses

- but $A - B + C = (A - B) + C$
 $\neq A - (B + C)$

- code generation

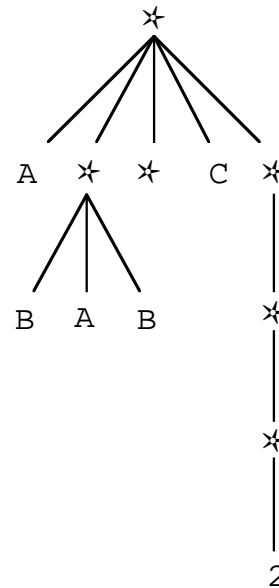
```
LW    1, A
LW    2, B
DW    2, C
MW    2, D
AW    2, 1
```

LISTs (with a capital L!)

- LIST \equiv a finite sequence of 0 or more atoms or LISTs

$L = (A, (B, A, B), (), C, (((2))))$

$() \equiv$ empty list



- Index notation:

$L[2] = (B, A, B)$

$L[2,1] = B$

$L[5,2]$

$L[5,1,1]$

- Differences between LISTs and trees:

1. no data appears in the nodes representing LISTs - i.e., *

2. LISTs may be recursive

$M = (M)$

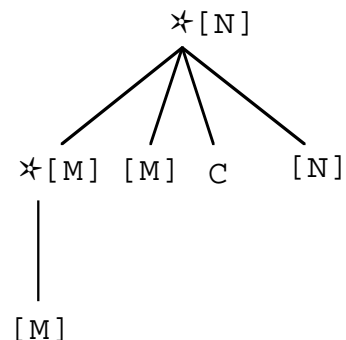
*[M] \leftarrow Label

[M]

3. LISTs may overlap (i.e., need not be disjoint)

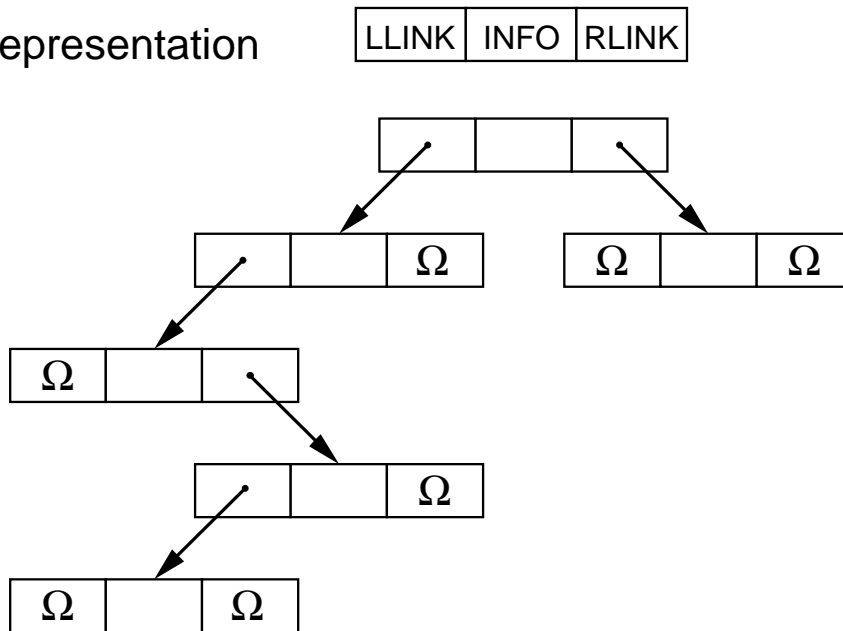
- equivalently, subtrees may be shared

$N = (M, M, C, N)$



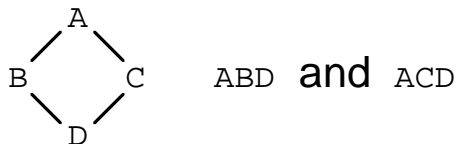
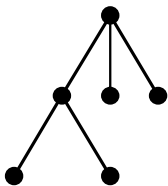
TRAVERSING BINARY TREES

- Representation



- Applications:

- code generation in compilers
- game trees in artificial intelligence
- detect if a structure is really a tree
 - TREE \equiv one path from each node to another node (unlike graph)
 - no cycles

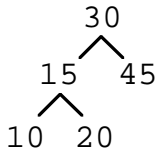




TRAVERSAL ORDERS

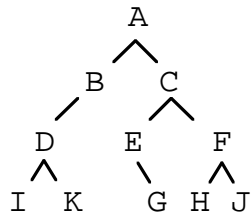
- 1. Preorder \equiv root, left subtree, right subtree
 - depth-first search
- 2. Inorder \equiv left subtree, root, right subtree
 - binary search tree
- 3. Postorder \equiv left subtree, right subtree, root
 - code generation

- Binary search tree: left < root < right



inorder yields 10 15 20 30 45

- Ex:



preorder =

inorder =

postorder =

- Inorder traversal requires a stack to go back up the tree:

D

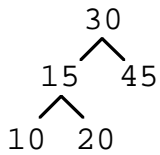
B

A

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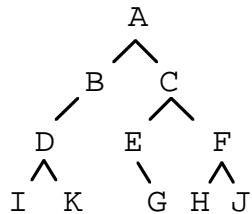
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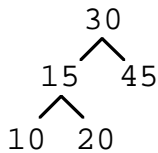
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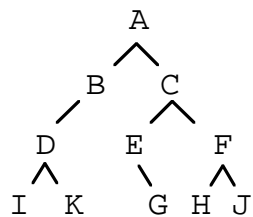
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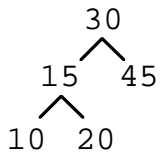
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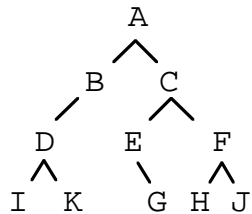
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preorder = A B D I K C E G F H J

inorder = I D K B A E G C H F J

postorder = I K D B G E H J F C A

- Inorder traversal requires a stack to go back up the tree:

D

B

A

INORDER TRAVERSAL ALGORITHM

```

procedure inorder(tree pointer T);
begin
  stack A;
  tree pointer P;
  A←Ω;
  P←T;
  while not(P=Ω and A=Ω) do
    begin
      if P=Ω then
        begin
          P←A;          /* Pop the stack */
          visit(ROOT(P));
          P←RLINK(P);
        end
      else
        begin
          A←P;          /* Push on the stack */
          P←LLINK(P);
        end;
      end;
    end;
  end;
end;

```

Using recursion:

```

procedure inorder(tree pointer T);
begin
  if T=Ω then return
  else
    begin
      inorder(LLINK(T));
      visit(ROOT(T));
      inorder(RLINK(T));
    end;
  end;
end;

```


THREADED BINARY TREES

- Binary tree representation has too many Ω links
- Use 1-bit tag fields to indicate presence of a link
- If Ω link, then use field to store links to other parts of the structure to aid the traversal of the tree

Unthreaded:

LLINK(p) = Ω

LLINK(p) = q $\neq \Omega$

RLINK(p) = Ω

RLINK(p) = q $\neq \Omega$

Threaded:

LTAG(p) = 0,

LLINK(p) = \$p = inorder predecessor of p

LTAG(p) = 1,

LLINK(p) = q

RTAG(p) = 0,

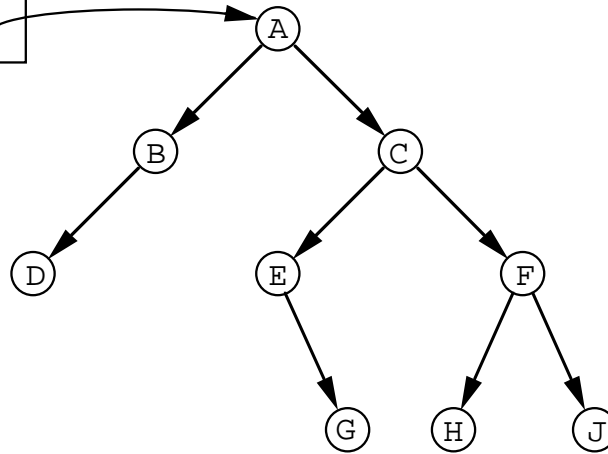
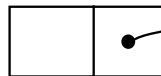
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- If address of ROOT(T) < address of left and right sons, then don't need the TAG fields
- Threads will point to lower addresses!

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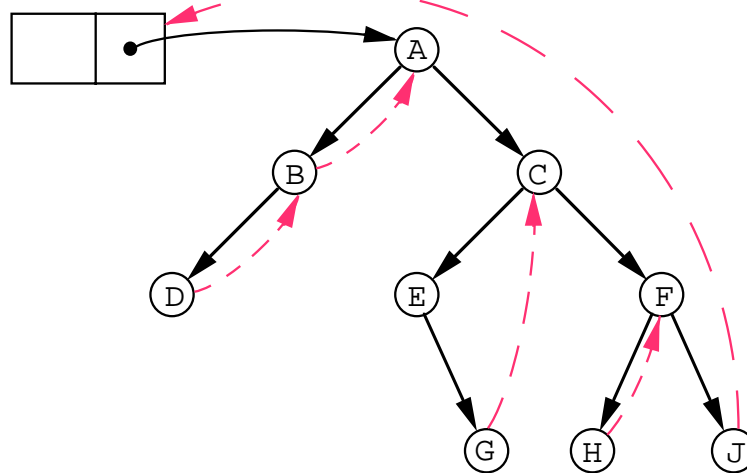
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LLINK	LTAG	INFO	RTAG	RLINK
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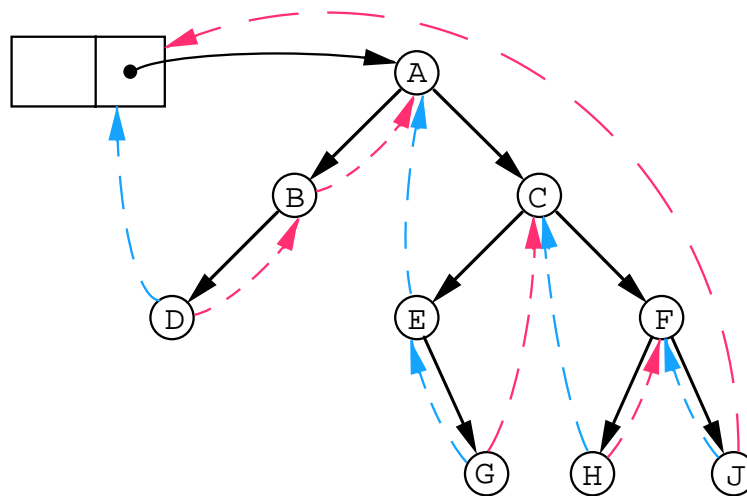
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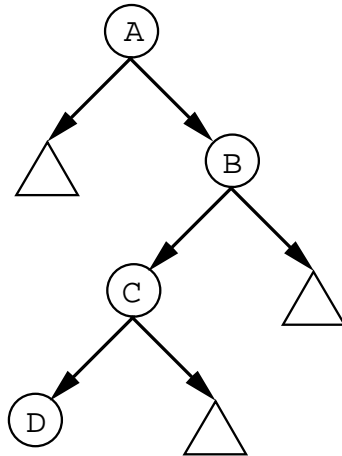
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- Find the inorder successor of node P (P\$)

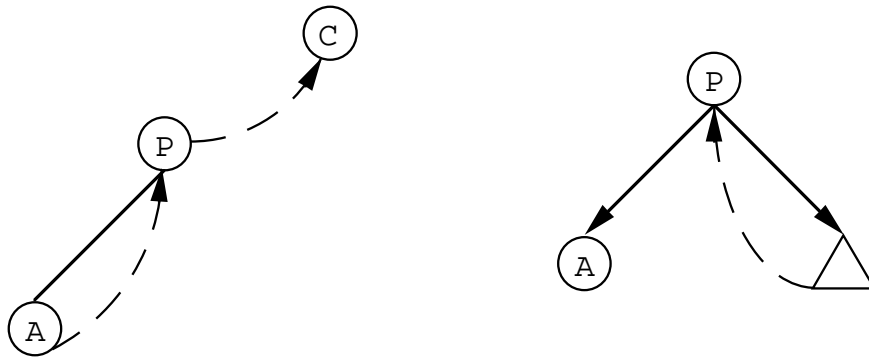
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- Insert node Q as the right subtree of node P



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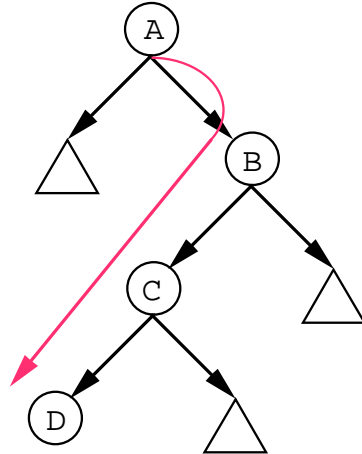
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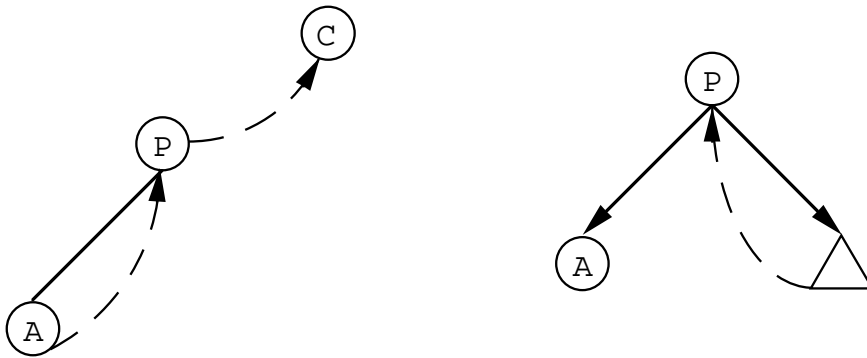
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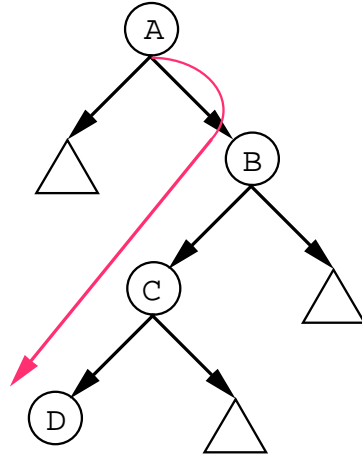
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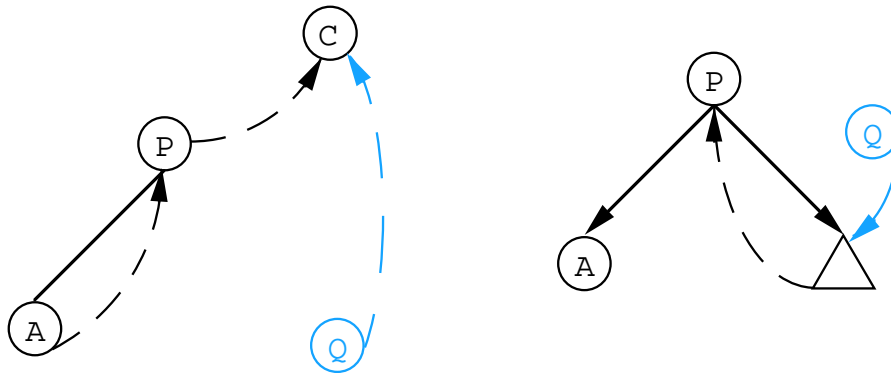
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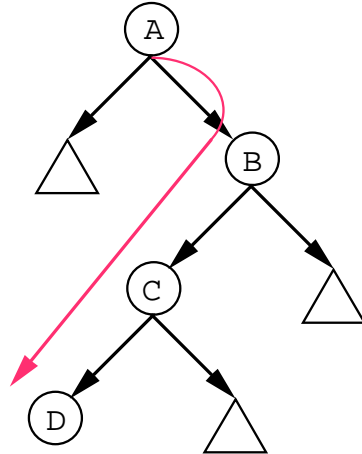
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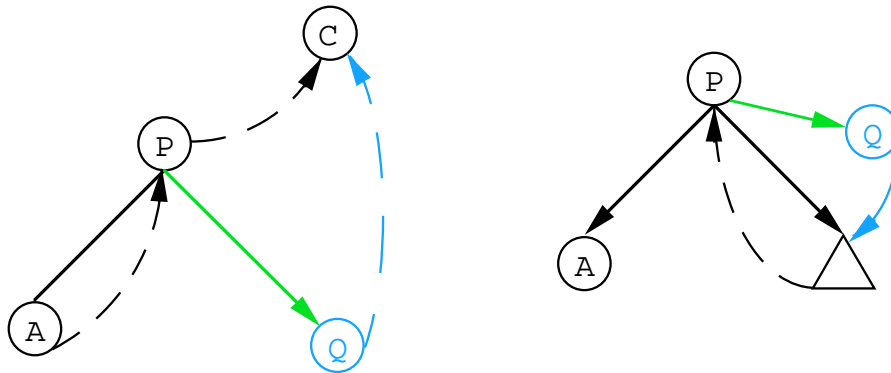
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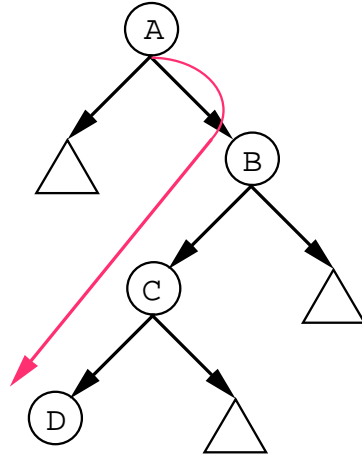
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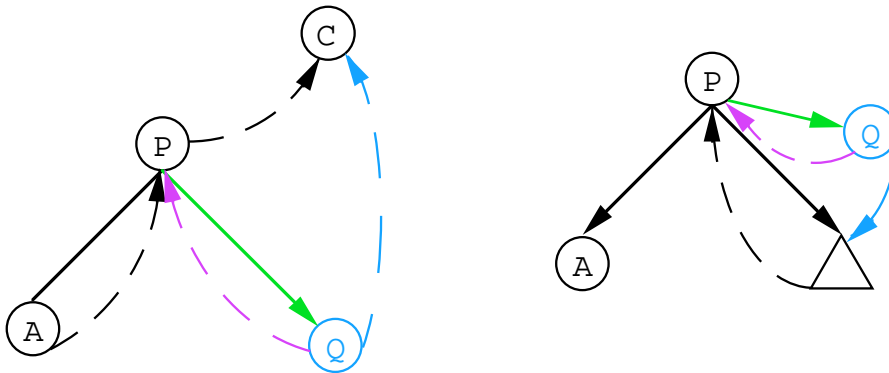
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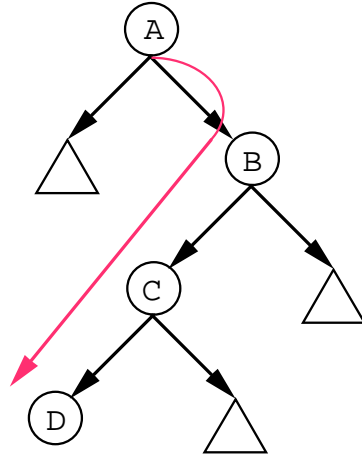

OPERATIONS ON THREADED BINARY TREES

• Find the inorder successor of node P (P\$)

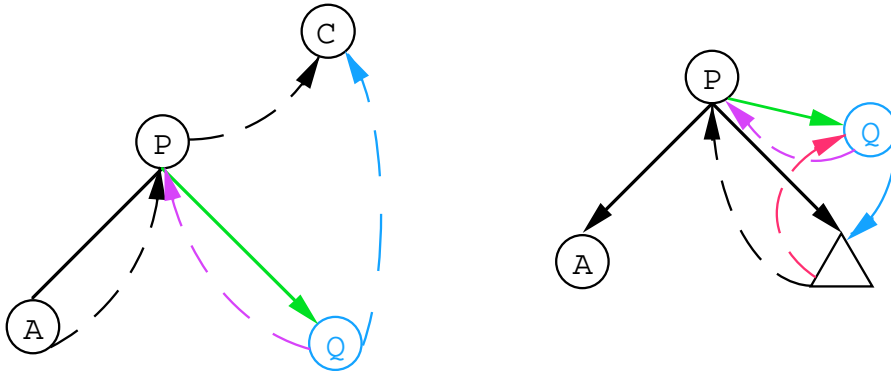
```

1. Q ← RLINK(P);      /* right thread points to P$ */
2. if RTAG(P)=1 then
    begin              /* not a thread */
        while LTAG(Q)=1 do Q ← LLINK(Q);
    end;

```



• Insert node Q as the right subtree of node P



```

1. RLINK(Q) ← RLINK(P);      RTAG(Q) ← RTAG(P);
   RLINK(P) ← Q;              RTAG(P) ← 1;
   LLINK(Q) ← P;              LTAG(Q) ← 0;
2. if RTAG(Q)=1 then LLINK(Q$) ← Q;

```

SUMMARY OF THREADING

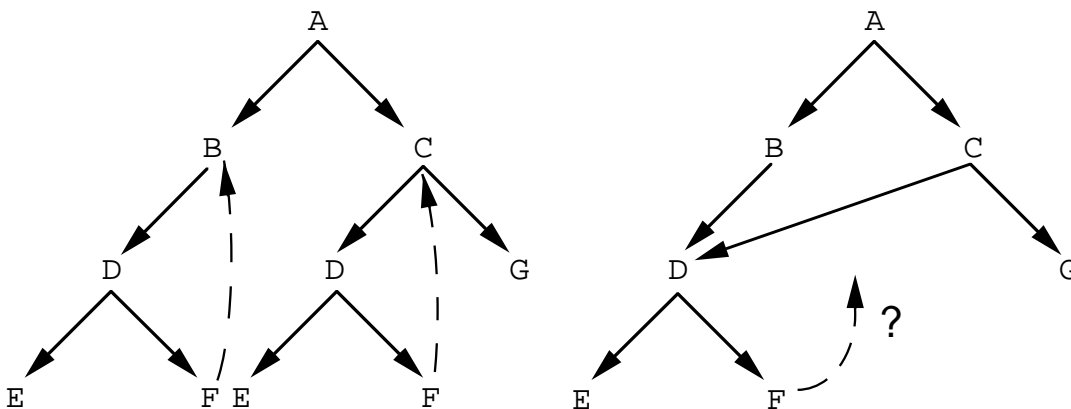
1. Advantages

- no need for a stack for traversal
- will not run out of memory during inorder traversal
- can find inorder successor of any node without having to traverse the entire tree

2. Disadvantages

- insertion and deletion of nodes is slower
- can't share common subtrees in the threaded representation

Ex: two choices for the inorder successor of F



3. Right-threaded trees

- inorder algorithms make little use of left threads
- 'LTAG(P)=1' test can be replaced by 'LLINK(P)= Ω ' test

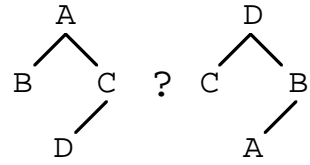


PRINCIPLES OF RECURSION

- Two binary trees T1 and T2 are said to be *similar* if they have the same shape or structure

- Formally:

1. they are both empty *or*
2. they are both non-empty and their left and right subtrees respectively are similar



```
similar(T1,T2) =
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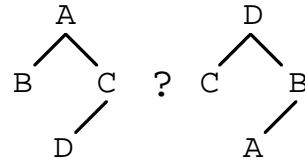
- Will similar work?

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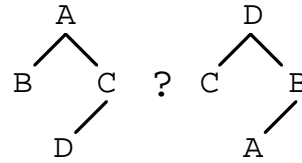
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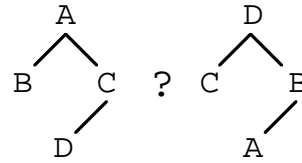
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           else F
A or B =
```

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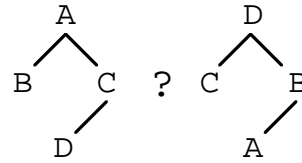
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A and B = if A then B
           else F
A or B = if A then T
          else B
```

```
similar(T1,T2) =
  if empty(T1) then empty(T2)
  [ if empty(T2) then T
    else F ]
  else if empty(T2) then F
  else [if] similar(left(T1),left(T2)) [then]
        similar(right(T1),right(T2)) [and]
  [else F ;]
```



EQUIVALENCE OF BINARY TREES

- Two binary trees T1 and T2 are said to be *equivalent* if they are similar *and* corresponding nodes contain the same information



```
equivalent(T1,T2) =
  if empty(T1) and empty(T2) then T
  else if empty(T1) or empty(T2) then F
  else root(T1)=root(T2) and
       equivalent(left(T1),left(T2)) and
       equivalent(right(T1),right(T2));
```


EQUIVALENCE OF BINARY TREES

- Two binary trees T1 and T2 are said to be *equivalent* if they are similar *and* corresponding nodes contain the same information



NO! we are dealing with binary trees and the left subtree of c is not the same in the two cases

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```

RECURSION SUMMARY

- Avoids having to use an explicit stack in the algorithm
- Problem formulation is analogous to induction
- Base case, inductive case

- Ex: Factorial

$$n! = n \cdot (n - 1) !$$

```
fact(n) = if n=0 then 1
         else n*fact(n-1);
```

The result is obtained by peeling one's way back along the stack

```
fact(3) = 3*fact(2)
         2*fact(1)
         1*fact(0)
         1
         = 6
```

Using an accumulator variable and a call `fact2(n,1)`:

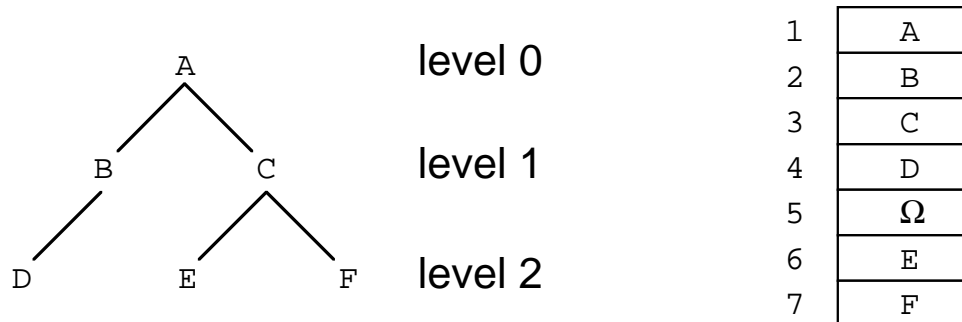
```
fact2(n,total) = if n=0 then total
                else fact2(n-1,n*total);
```

Solution is iterative

- Recursion implemented on computer using stack instructions.
- Dec-system 10: `PUSH`, `POP`, `PUSHJ`, `POPJ`
- Stack pointer format: (count, address)
- Can simulate stack if no stack instructions

COMPLETE BINARY TREES

When a binary tree is reasonably *complete* (most Ω links are at the highest level), use a sequential storage allocation scheme so that links become unnecessary



- If n is the highest level at which a node is found, then at most $2^{n+1} - 1$ words are needed
- Storage allocation method:
 1. root has address 1
 2. left son of x has address $2 * \text{address}(x)$
 3. right son of x has address $2 * \text{address}(x) + 1$
- When should a complete binary tree be used?

n = highest level of the tree at which a node is found

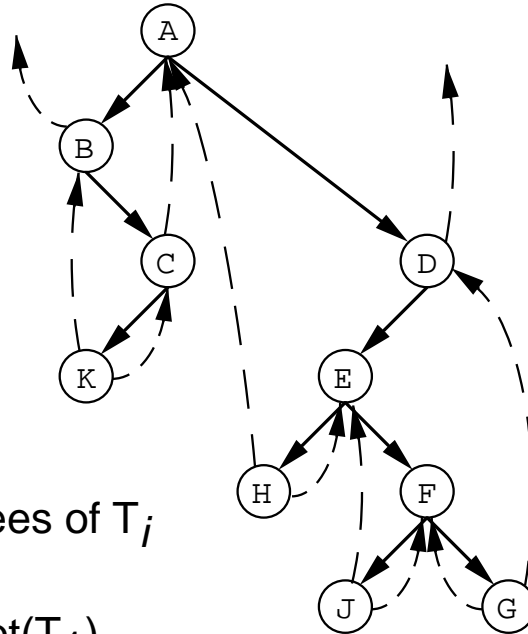
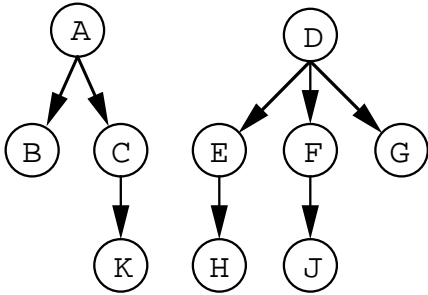
x = # of nodes in tree

3 words per node (left link, right link, info)

use a complete binary tree when $x > (2^{n+1} - 1) / 3$

FORESTS

- A *forest* is an ordered set of 0 or more trees
- There exists a *natural correspondence* between forests and binary trees



- Rigorous definition of $B(F)$

$$F = (T_1, T_2, \dots, T_n)$$

$T_{i,1}, T_{i,2}, \dots, T_{i,m}$ are subtrees of T_i

1. If $n = 0$, $B(F)$ is empty
2. If $n > 0$, root of $B(F)$ is root(T_1)
left subtree of $B(F)$ is $B(T_{1,1}, T_{1,2}, \dots, T_{1,m})$
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- Traversal of forests

preorder:

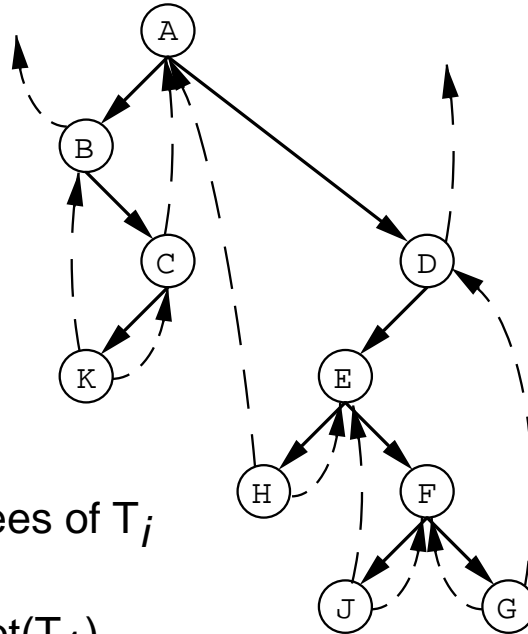
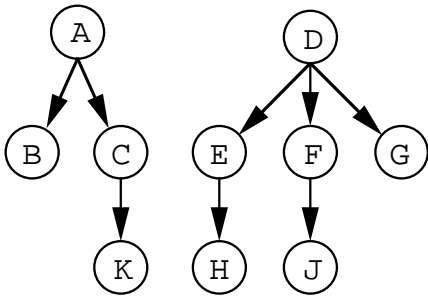
1. visit root of first tree
2. traverse subtrees of first tree in preorder
3. traverse remaining subtrees in preorder

postorder:

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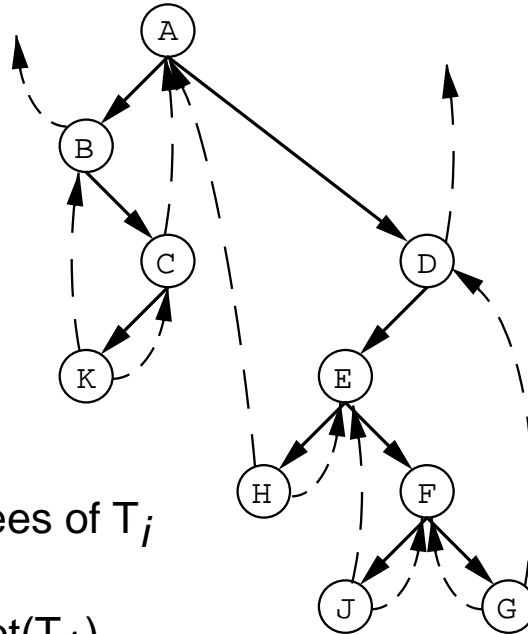
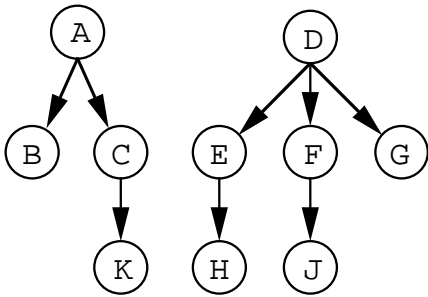
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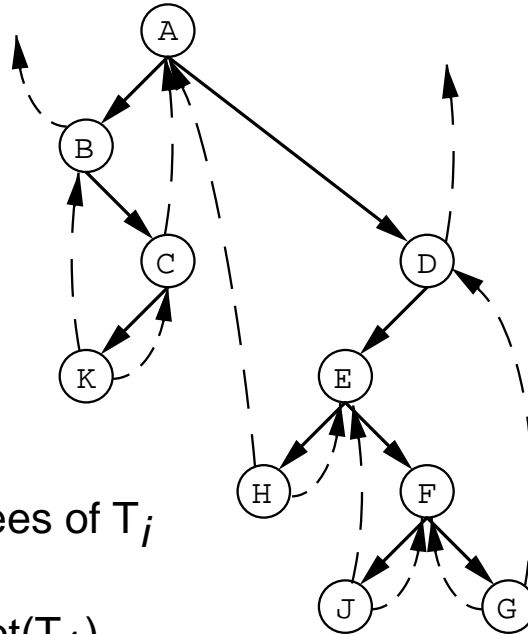
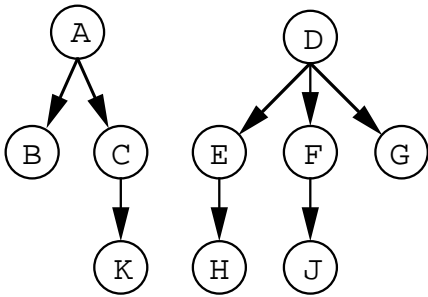
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≡ inorder of binary tree



EQUIVALENCE RELATION

- Given: relations as to what is equivalent to what ($a \equiv b$)
- Goal: is $x \equiv y$?

- Formal definition of an *equivalence relation*
 1. if $x \equiv y$ and $y \equiv z$ then $x \equiv z$ (transitivity)
 2. if $x \equiv y$ then $y \equiv x$ (symmetry)
 3. $x \equiv x$ (reflexivity)

- Ex: $S = \{1 \dots 9\}$
1 \equiv 5 6 \equiv 8 7 \equiv 2 9 \equiv 8 3 \equiv 7 4 \equiv 2 9 \equiv 3
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 is $2 \equiv 6$?

Yes, since $2 \equiv 7 \equiv 3 \equiv 9 \equiv 8 \equiv 6$

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- Two elements equivalent iff they belong to same class
- What are the equivalence classes in this example?

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$\{1,5\}$ and $\{2,3,4,6,7,8,9\}$

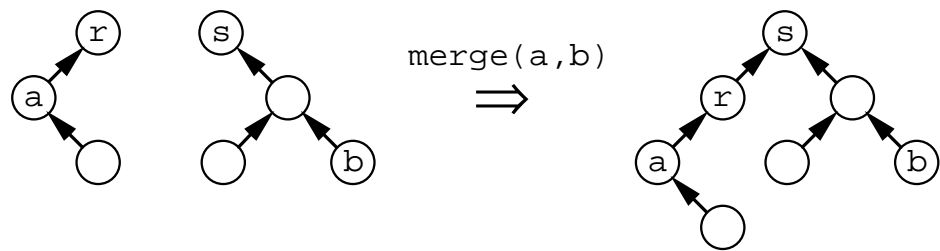
ALGORITHM

- Represent each element as a node in forest of trees
- Trees consist only of father links (nil at roots)
- Each (nonredundant) relation merges two trees into one
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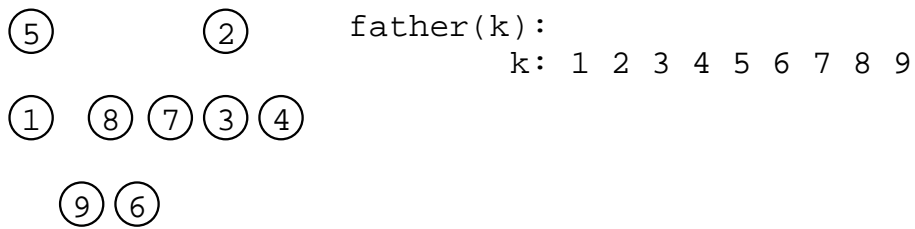


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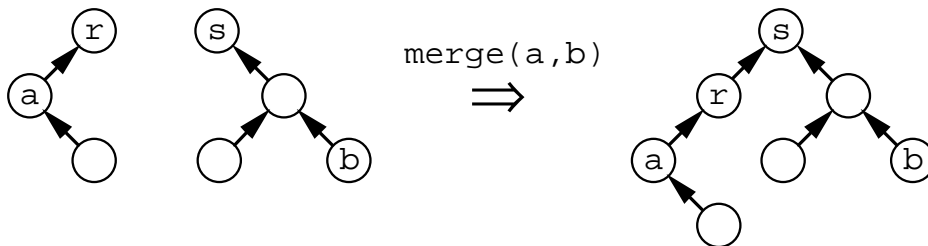
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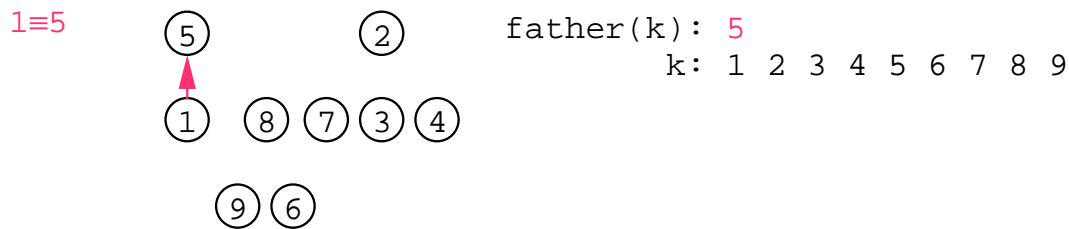


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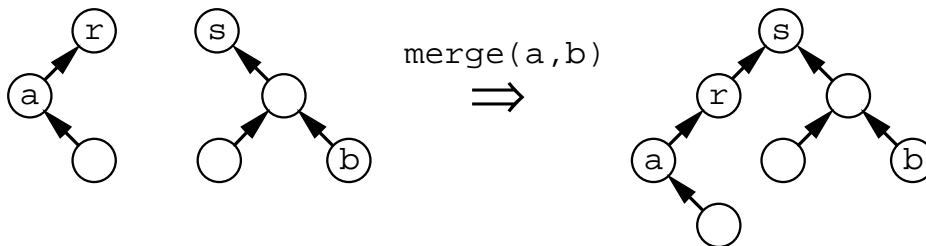
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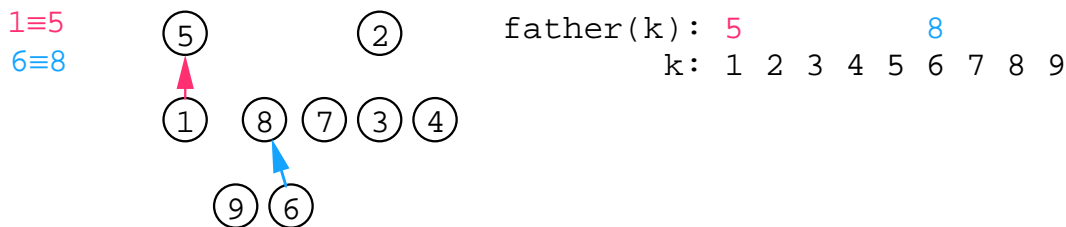


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    while  $\text{father}(a) \neq \Omega$  do  $a \leftarrow \text{father}(a)$ ;
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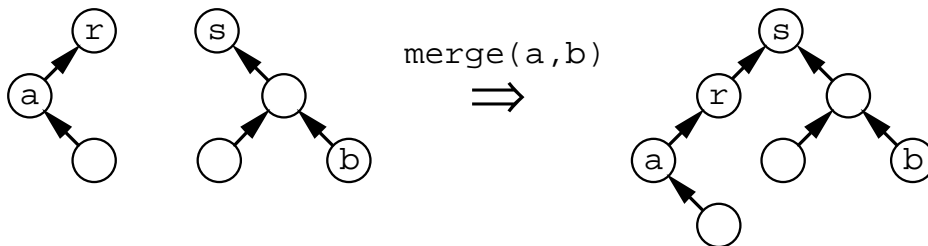
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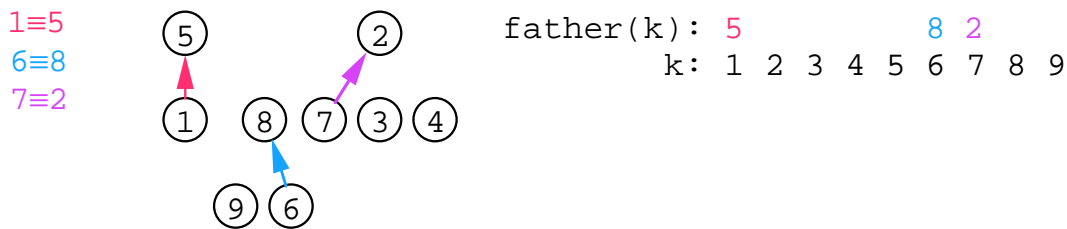


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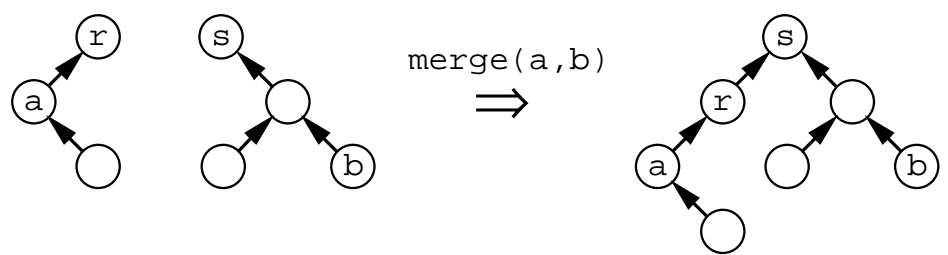
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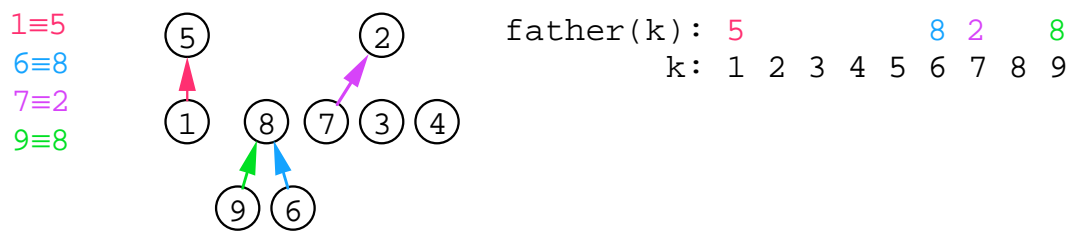


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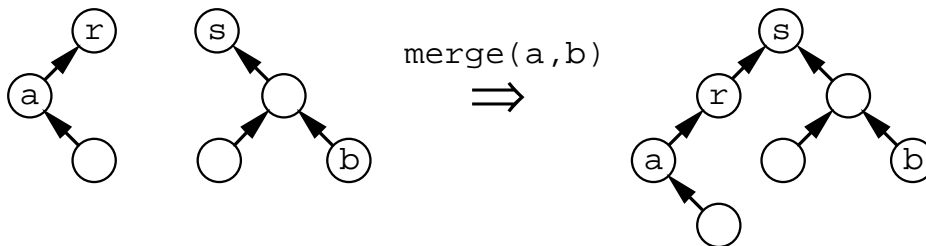
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```

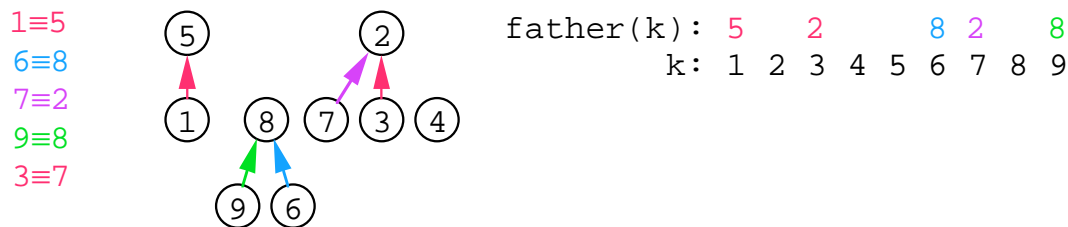


- Algorithm (also known as *union-find*):

```

for every element i do father(i)←Ω
while input_not_exhausted do
  begin
    get_pair(a,b);
    while father(a)≠Ω do a←father(a);
    while father(b)≠Ω do b←father(b);
    if (a≠b) then father(a)←b;
  end;

```





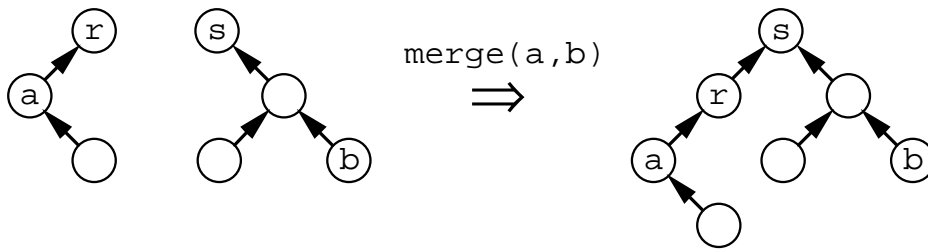
ALGORITHM

- Represent each element as a node in forest of trees
- Trees consist only of father links (nil at roots)
- Each (nonredundant) relation merges two trees into one
- Basic strategy:

```

for each relation a≡b do
  begin
    find root node r of tree containing a; /* Find step */
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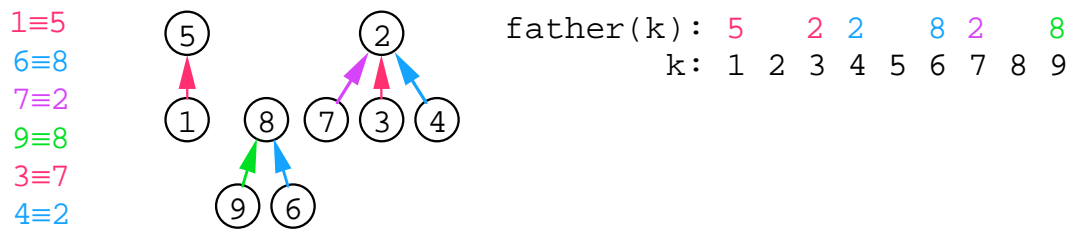


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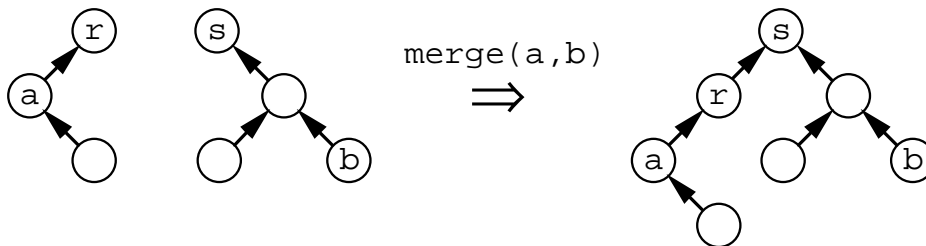
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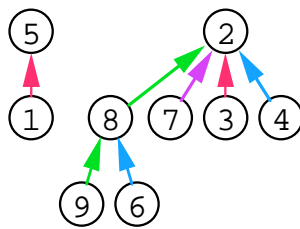
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```

1≡5
 6≡8
 7≡2
 9≡8
 3≡7
 4≡2
 9≡3



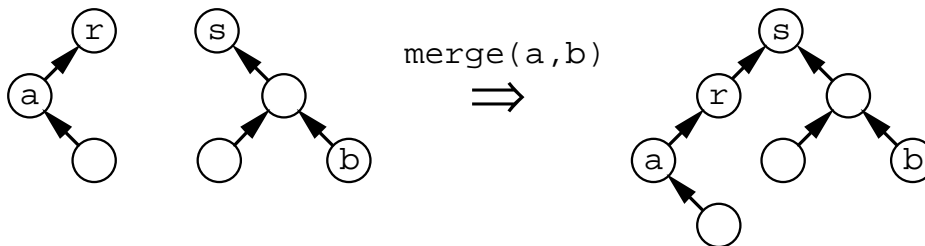
father(k): 5 2 2 8 2 2 8
 k: 1 2 3 4 5 6 7 8 9

ALGORITHM

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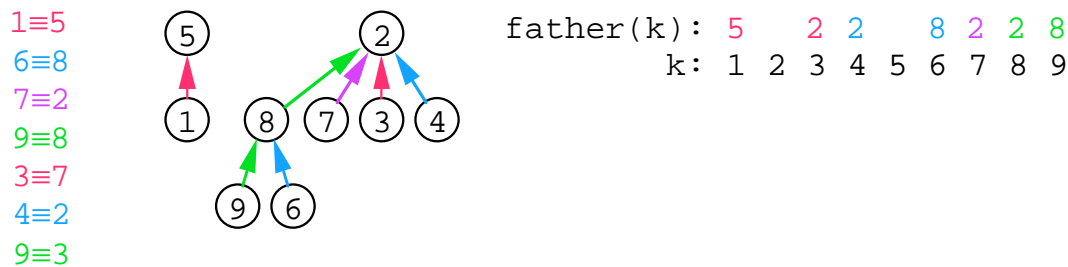
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  end;
  
```



- More efficient with *path compression* and *weight balancing*
- Execution time “almost linear” (inverse of Ackermann function)