

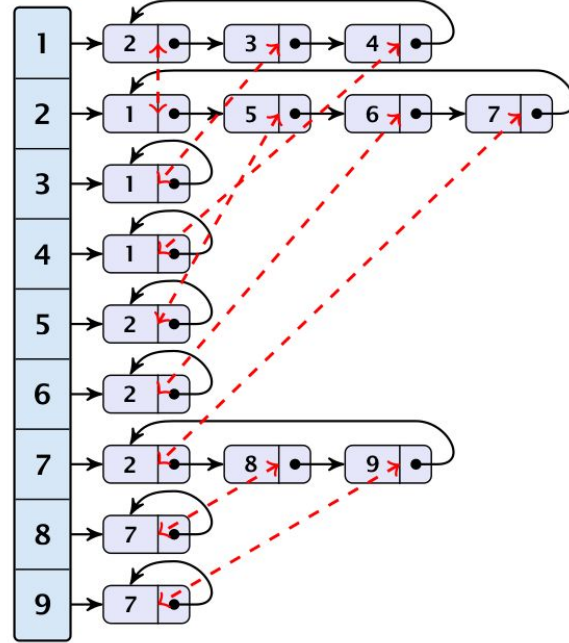
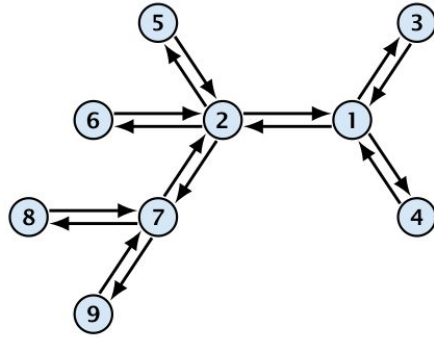
# Tree Contraction

More of parallel pointer manipulation

# Euler Tour Technique

Recap

# Circular adjacency lists with twin pointers



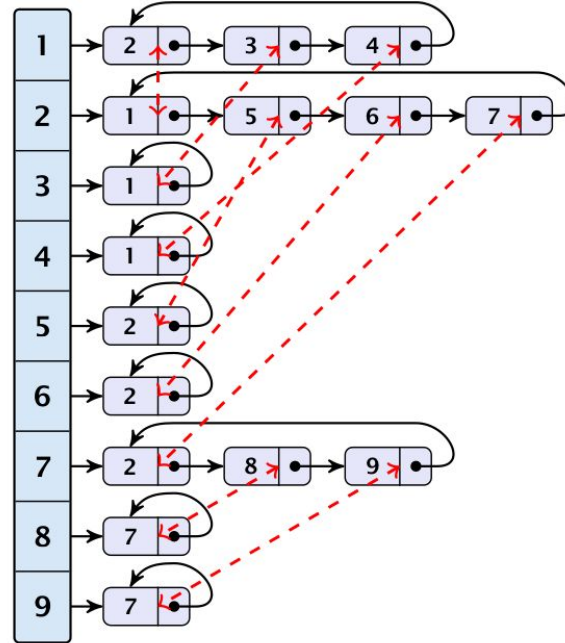
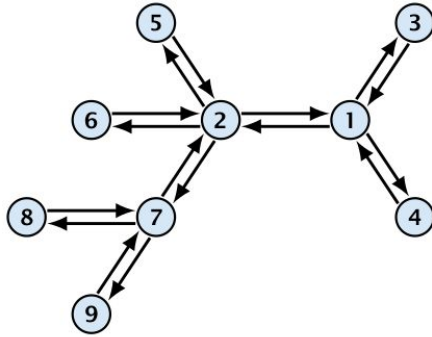
# Find Euler tour

Every node  $v$  fixes an arbitrary ordering among its adjacent nodes:

$$u_0, u_1, \dots, u_{d-1}$$

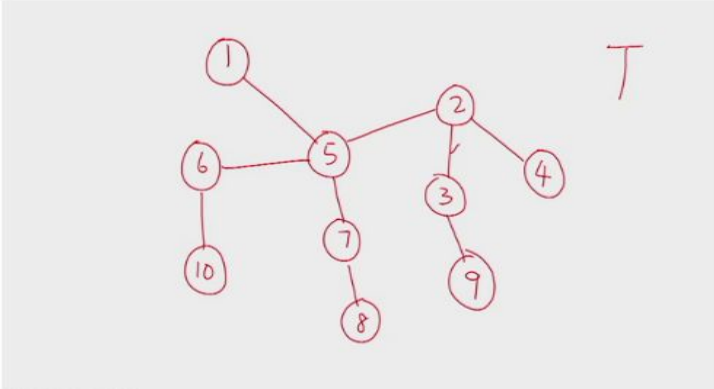
We obtain an Euler tour by setting

$$\text{succ}((u_i, v)) = (v, u_{(i+1) \bmod d})$$



# Each node's **parent** in "rooted" tree using Euler circuit

Take the Euler circuit  
 break the circuit by deleting  
 one incoming edge of  $v$   
 Now the ckt has become a list  
 Rank the list  
 Use the ranks?



15	11	78	17	93	5	<u><u><math>v = 7</math></u></u>	
56	12	<del>87</del>		32	6		
6	10	13	75	1	24	7	Compare
10	6	14	52	2	42	8	$[i, j]$
6	5	15	23	3	25	9	with $[j, i]$
5	7	16	39	4	51	10	if rank $[i, j]$
							$<$ rank $[j, i]$
							$i = p(j)$

7  
 {  
 2

# Application 1

## Rooting a tree

- ▶ split the Euler tour at node  $r$
- ▶ this gives a list on the set of directed edges (Euler path)
- ▶ assign  $x[e] = 1$  for every edge;
- ▶ perform parallel prefix; let  $s[\cdot]$  be the result array
- ▶ if  $s[(u, v)] < s[(v, u)]$  then  $u$  is parent of  $v$ ;

# Each node's **level** in "rooted" tree using Euler circuit

The levels of the nodes of  $T$   
( $T$  is rooted at vertex  $v$ )

$$\text{level}(v) = 0$$

$$\text{level}(w) = 1 \quad \text{where } w \text{ is a child of } v$$

$$\text{level}(w) = 2 \quad \text{--- } w \text{ is a grand-child of } v$$

15	11	78	17	93	5	$v = 7$	
56	12	<del>87</del>		32	6	<u>        </u>	
6	10	13	75	1	24	7	Compare
10	6	14	52	2	42	8	$[i, j]$
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5	7	16	39	4	51	10	if $\text{rank}[i, j]$
							$< \text{rank}[j, i]$
							$i = p(j)$

$\begin{matrix} 7 \\ \downarrow \\ 5 \\ \downarrow \\ 2 \end{matrix}$

	75	1	1	25	-1	1	for parent-child edges: 1
5-1	52	1	2	51	1	2	
	23	1	3	15	-1	1	child parent edges: 1 -1
2-2	39	1	4	56	1	2	
6-2	93	-1	3	610	1	3	
	32	-1	2	10	6	-1	2
	24	1	3	6	5	-1	1
	42	-1	2	5	7	-1	0
				78	1	1	

# Application 2

## Level of nodes

- ▶ split the Euler tour at node  $r$
- ▶ this gives a list on the set of directed edges (Euler path)
- ▶ assign  $x[e] = -1$  for every edge  $(v, \text{parent}(v))$
- ▶ assign  $x[e] = 1$  for every edge  $(\text{parent}(v), v)$
- ▶ perform parallel prefix
- ▶  $\text{level}(v) = s[(\text{parent}(v), v)]$ ;  $\text{level}(r) = 0$



# Application 3

## Postorder Numbering

- ▶ split the Euler tour at node  $r$
- ▶ this gives a list on the set of directed edges (Euler path)
- ▶ assign  $x[e] = 1$  for every edge  $(v, \text{parent}(v))$
- ▶ assign  $x[e] = 0$  for every edge  $(\text{parent}(v), v)$
- ▶ perform parallel prefix
- ▶  $\text{post}(v) = s[(v, \text{parent}(v))]$ ;  $\text{post}(r) = n$

# Application 4

## Number of descendants

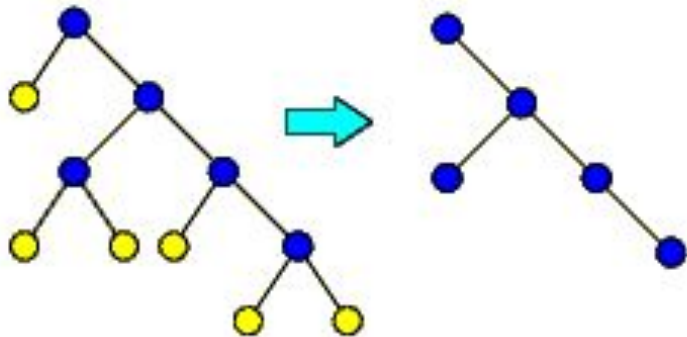
- ▶ split the Euler tour at node  $r$
- ▶ this gives a list on the set of directed edges (Euler path)
- ▶ assign  $x[e] = 0$  for every edge  $(\text{parent}(v), v)$
- ▶ assign  $x[e] = 1$  for every edge  $(v, \text{parent}(v))$ ,  $v \neq r$
- ▶ perform parallel prefix
- ▶  $\text{size}(v) = s[(v, \text{parent}(v))] - s[(\text{parent}(v), v)]$

# Tree Contraction: SHUNT

Comprises

- An operation of node removal called RAKE
- An operation of pointer jumping called COMPRESS
- Euler tour and prefix sum (to decide which nodes to RAKE and COMPRESS)

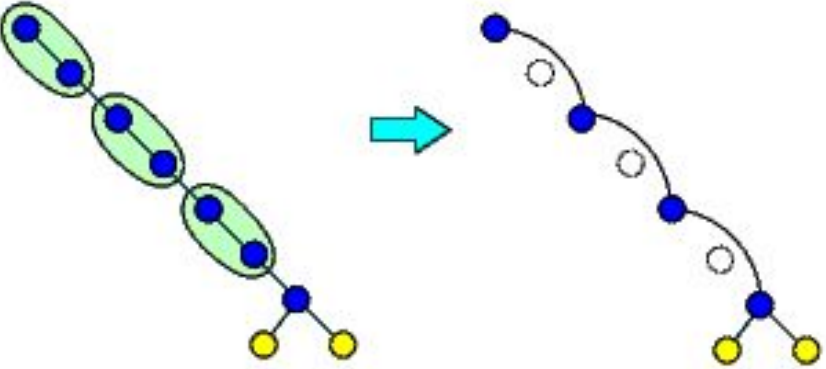
# RAKE: removing leaves



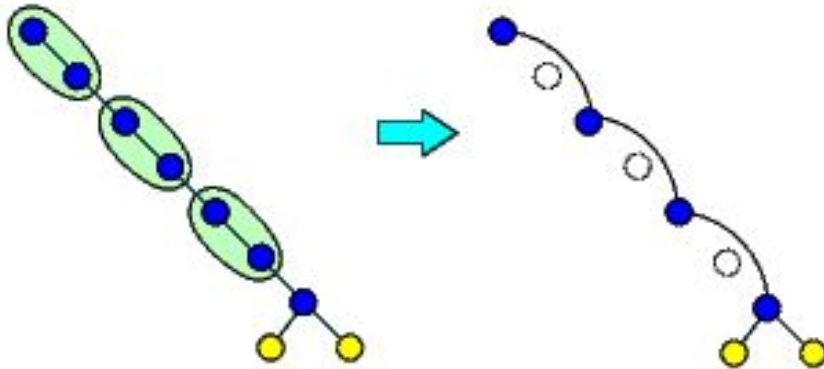
RAKE alone not sufficient for parallel tree contraction

- (1) If the tree is thin and tall, and therefore the height of the tree is linear, rather than logarithmic (the worst case is just a linked list), RAKE cannot be applied in parallel.
- (2) RAKE itself tends to linearize the original tree.

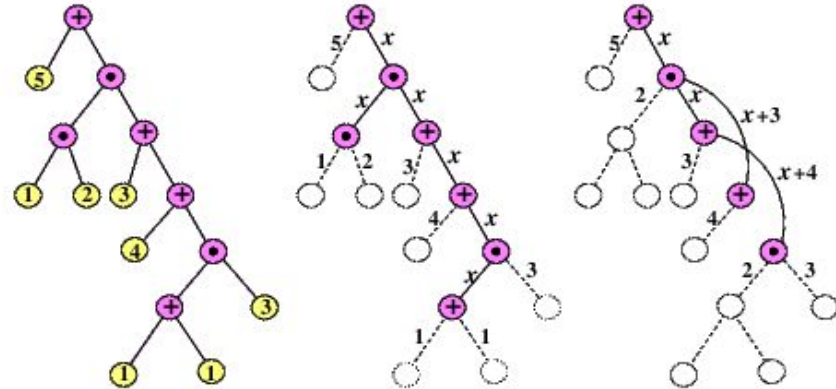
# COMPRESS: Pointer jumping



# COMPRESS: Pointer jumping



- (1) COMPRESS and RAKE can be applied in parallel to disjoint parts of the tree.
- (2) COMPRESS produces leaves for RAKE and RAKE produces linear lists for COMPRESS.



# Basic contraction algorithm

**Input:**  $P[1, \dots, n]$ ; /\*  $P[x]$  is a pointer to the parent of  $x$  \*/  
 $children[1, \dots, n]$ ; /\*  $children[v] = \{v_1, \dots, v_k\}$  – pointers to all children \*/  
 $index[1, \dots, n]$ ; /\*  $index[v_i] = i$  – each child  $v$  knows its index in  $children[P[v]]$  \*/

**Auxil:**  $label[1, \dots, n]$ ; /\*  $label[v] = \{f_1, \dots, f_k\}$ , where  $f_i \in \{U, M\}$  \*/  
/\*  $f_i = M$  = marked iff a child supplied its value to its parent \*/  
 $UnMarkChil(x)$  **returns** **int**; /\* function returning the # of unmarked children \*/

**Output:** the value accumulated in the root

```
/* initialize the data structures */
for all nodes  $v \in T$  do_in_parallel  $initialize(v)$ ;
while  $UnMarkChil(root) > 0$  do
  { for all nodes  $v \in T$  do_in_parallel
    if  $P[v] \neq nil$  then
      { case  $UnMarkChil[v]$  of
        0: { Rake( $v$ );  $label[P[v]][index[v]] := M$ ;  $P[v] := nil$ ; }
        1: if  $UnMarkChil[P[v]] = 1$  then { Compress( $v$ );  $P[v] := P[P[v]]$ ; }
      endcase } };
Rake( $root$ );
```

# Further reduce linearity of tree during contraction

- Contraction should not produce linear chains
- A chain is produced when a tree contains a binary subtree, where each internal vertex has a child that is a leaf and one that is not.
- After a parallel RAKE on all leaves, such a subtree becomes a linear list
- If RAKE and COMPRESS is always applied simultaneously, i.e. every individual RAKE operation is followed immediately by COMPRESS of its sibling, chains cannot be formed
- This combined operation is called SHUNT

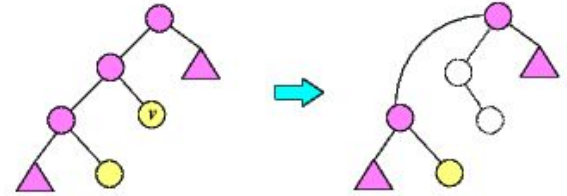


# SHUNT: leaf RAKE with sibling COMPRESS

Given a binary tree  $T$ .

Given a leaf  $u \in T$  with  $p(u) \neq r$  the **rake-operation** does the following

- ▶ remove  $u$  and  $p(u)$
- ▶ attach sibling of  $u$  to  $p(p(u))$

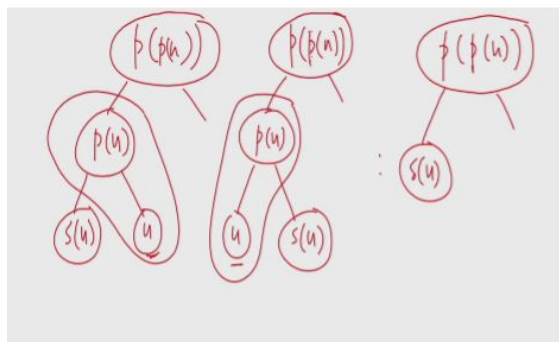
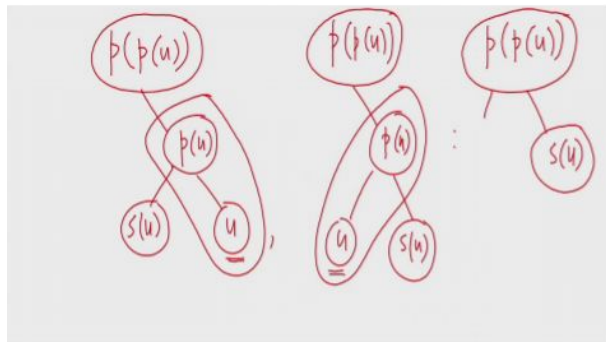
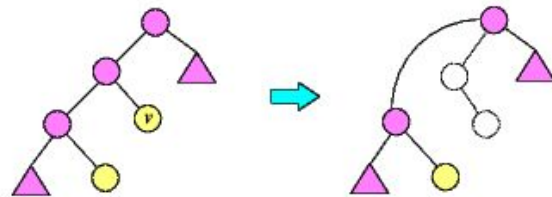


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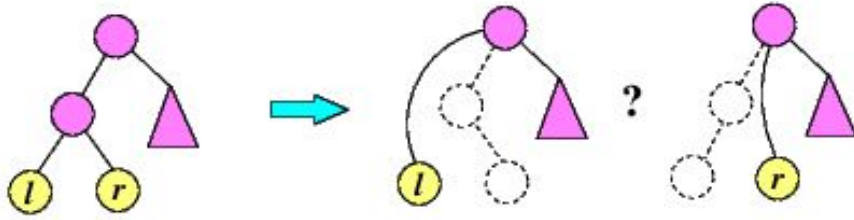
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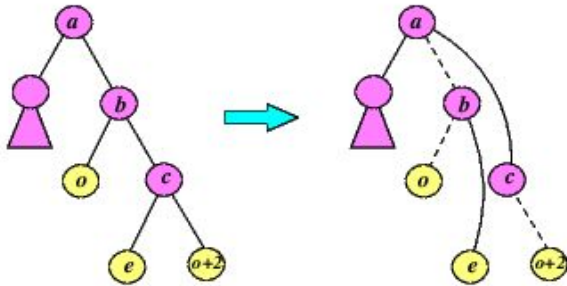
- ▶ remove  $u$  and  $p(u)$
- ▶ attach sibling of  $u$  to  $p(p(u))$



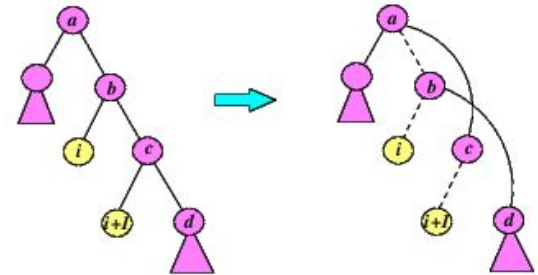
# SHUNT conditions



Cannot be applied to two siblings simultaneously  
(non-deterministic output)




Cannot be applied to two consecutive odd leaves (tree becomes disconnected, needs concurrent write)




Cannot be applied to two consecutive leaves  
(tree becomes disconnected)

# The goal, the input tree and the algorithm


shrinking of a tree to a single  
vertex by repeated rake ops  
and one final reduction of  
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$T$  s.t.  $T$  is a rooted binary tree  
each ~~vertex~~ nonleaf has exactly  
2 children.  
each vertex has  $p(\cdot)$   
 $s(\cdot)$

# The goal, the input tree and the algorithm

shrinking of a tree to a single vertex by repeated rake ops and one final reduction of a tree of the form 

1. Get the adjacency list repr of  $T$
2. Find an Euler ckt
3. Break the ckt open by deleting an incoming edge of  $r$
4. Find a preorder traversal

$A_{\text{odd}}$ : the seq. of the odd elements in  $A$

$A_{\text{even}}$ :                      even

a	b	c	d	e	f
	x		x		x

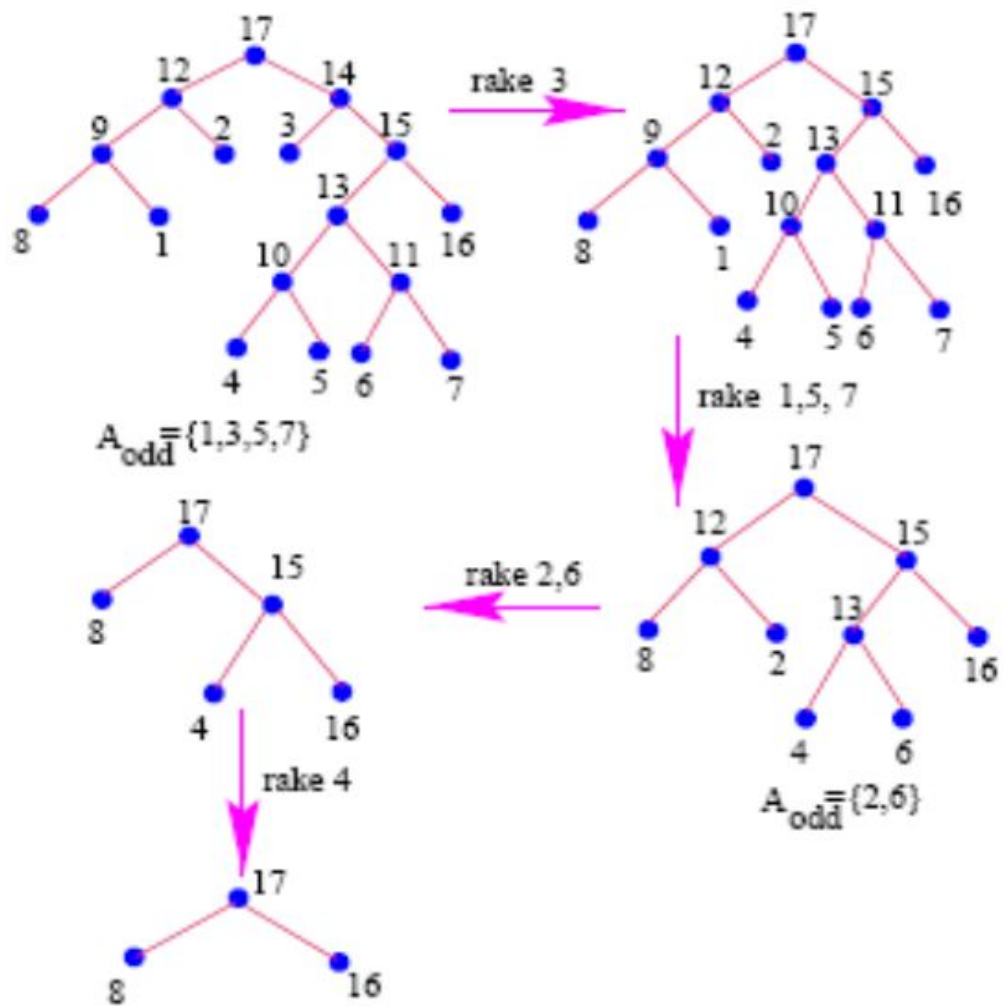
$T$  s.t.  $T$  is a rooted binary tree  
each ~~vertex~~ nonleaf has exactly 2 children.  
each vertex has  $p(\cdot)$   
 $s(\cdot)$

5. Copy the traversal into an array
6. Mark all the leaf nodes
7. Compact the leaf nodes.  
Now the leaves are in a L to R order. Let  $A$  denote the array of leaves

for  $\lceil \log(n+1) \rceil$  iterations

- apply rake on all  $A_{\text{odd}}$  elements that are left children
- apply rake on the remaining elements of  $A_{\text{odd}}$ .
- $A = A_{\text{even}}$

# Example run



# Why choose to RAKE in this order?

We want to apply rake operations to a binary tree  $T$  until  $T$  just consists of the root with two children.

## Possible Problems:

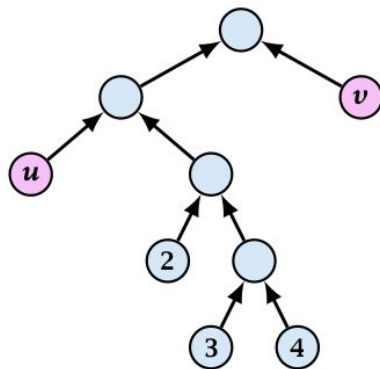
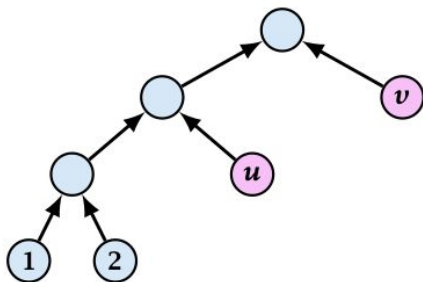
1. we could **concurrently** apply the rake-operation to two siblings
2. we could **concurrently** apply the rake-operation to two leaves  $u$  and  $v$  such that  $p(u)$  and  $p(v)$  are connected

By choosing leaves carefully we ensure that none of the above cases occurs



# Observations on the algorithm

- ▶ the rake operation does not change the order of leaves
- ▶ two leaves that are siblings do not perform a rake operation in the same round because one is even and one odd at the start of the round
- ▶ two leaves that have adjacent parents either have different parity (even/odd) or they differ in the type of child (left/right)



# Runtime

## Algorithm:

- ▶ label leaves consecutively from left to right (excluding left-most and right-most leaf), and store them in an array  $A$
- ▶ for  $\lceil \log(n + 1) \rceil$  iterations
  - ▶ apply rake to all odd leaves that are left children
  - ▶ apply rake operation to remaining odd leaves (odd at start of round!!!)
  - ▶  $A$ =even leaves

# Runtime

## Algorithm:

- ▶ label leaves consecutively from left to right (excluding left-most and right-most leaf), and store them in an array  $A$
  - ▶ for  $\lceil \log(n + 1) \rceil$  iterations
    - ▶ apply rake to all odd leaves that are left children
    - ▶ apply rake operation to remaining odd leaves (odd at start of round!!!)
    - ▶  $A$ =even leaves
- ▶ one iteration can be performed in constant time with  $\mathcal{O}(|A|)$  processors, where  $A$  is the array of leaves;
  - ▶ hence, **all** iterations can be performed in  $\mathcal{O}(\log n)$  time and  $\mathcal{O}(n)$  work;
  - ▶ the initial parallel prefix also requires time  $\mathcal{O}(\log n)$  and work  $\mathcal{O}(n)$

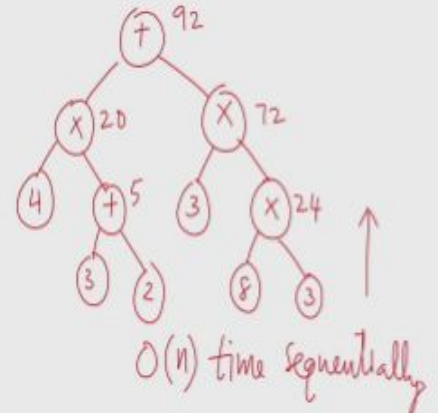
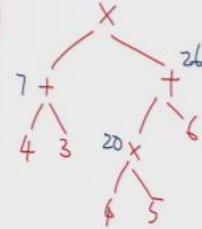
# Application of tree contraction: expression evaluation

Expression tree  
internal nodes with  
operations  $\{+, \times\}$   
leaf nodes have integer  
evaluate the root

Arithmetic expression  
 $\times +$  values are integers

$$(4+3) \times ((4 \times 5) + 6)$$

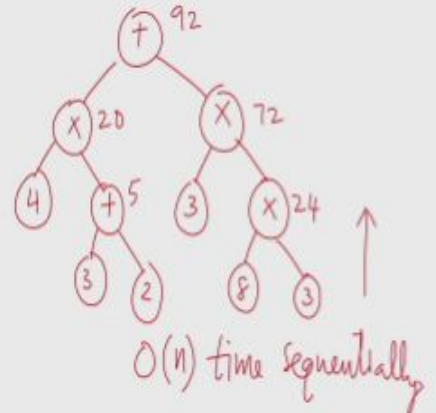
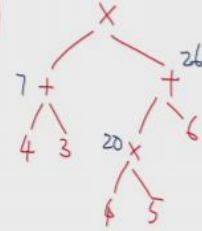
expression tree



# Application of tree contraction: expression evaluation

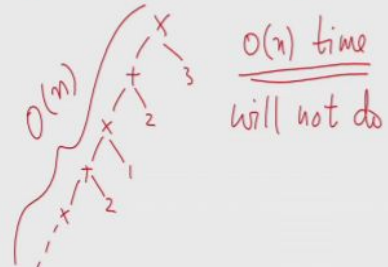
Expression tree  
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evaluate the root

Arithmetic expression  
 $x +$  values are integers  
 $(4+3) \times ((4 \times 5) + 6)$   
expression tree



An expression tree can be  
evaluated bottom up.  
Parallel? Balanced? efficient  
Not Balanced:  
 $O(\text{depth})$ .

Depth could be  $O(n)$   
When  $n$  is the size of the tree

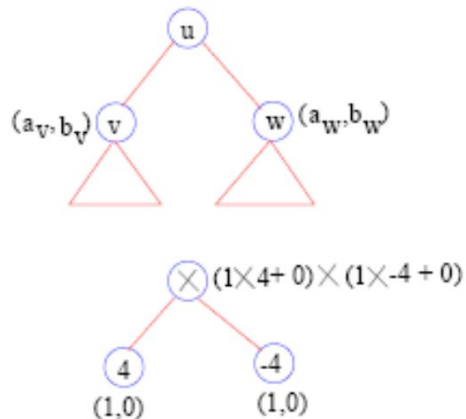


# Maintaining expression values in nodes

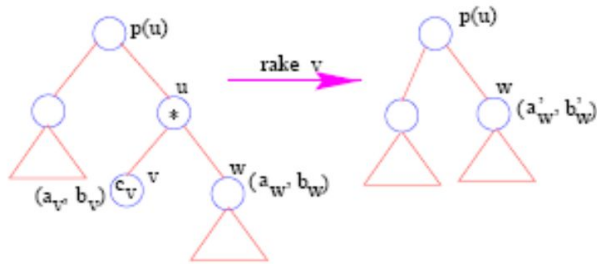
- We do not completely evaluate each internal node. We evaluate the internal nodes partially.
- For each internal node  $v$ , we associate a label  $(a_v, b_v)$ .  $a_v$  and  $b_v$  are constants.
- The value of the expression at node is:  $(a_v X + b_v)$ , where  $X$  is an unknown value for the expression of the subtree rooted at  $v$ .

## Invariant:

- Let  $u$  be an internal node which holds the operation  $\oplus \in \{+, \times\}$ .
- Let  $v$  and  $w$  are the children of  $u$  with labels  $(a_v, b_v)$  and  $(a_w, b_w)$ .
- Then the value at  $u$  is:  
$$val(u) = (a_v val(v) + b_v) \oplus (a_w val(w) + b_w)$$



# Propagating values while shunting



- The value at node  $u$  is:

$$val(u) = (a_v c_v + b_v) \times (a_w X + b_w)$$

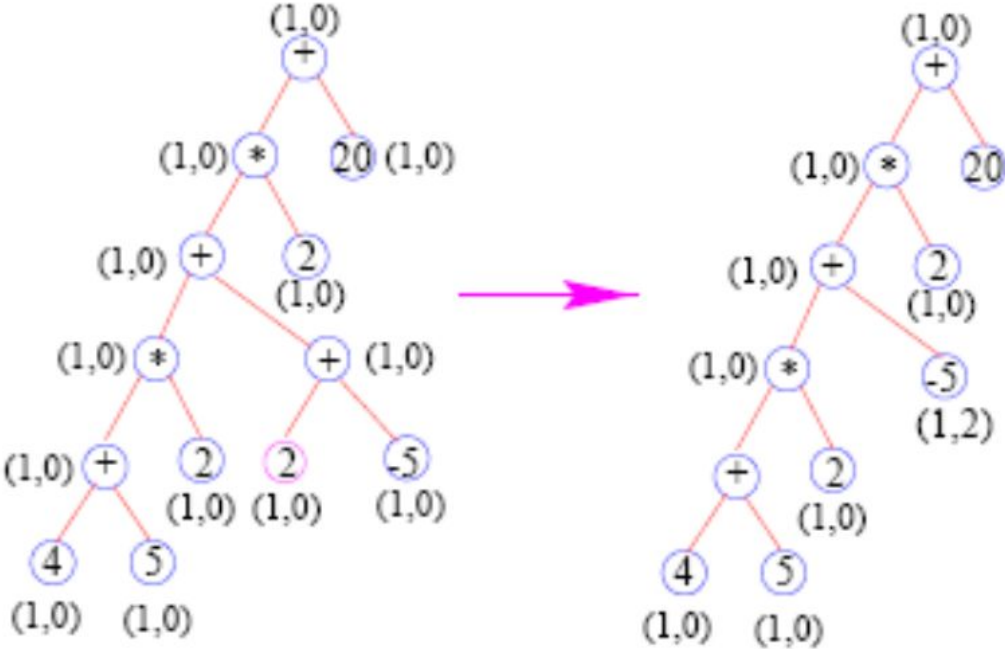
- $X$  is the unknown value at node  $w$ .

- The contribution of  $val(u)$  to the value of node  $p(u)$  is:

$$a_u \times val(u) + b_u = a_u [(a_v c_v + b_v) \times (a_w X + b_w)] + b_u$$

- We can adjust the labels of node  $w$  to  $(a'_w, b'_w)$
- $a'_w = a_u (a_v c_v + b_v) a_w$
- $b'_w = a_u (a_v c_v + b_v) b_w + b_u$

# Example run through

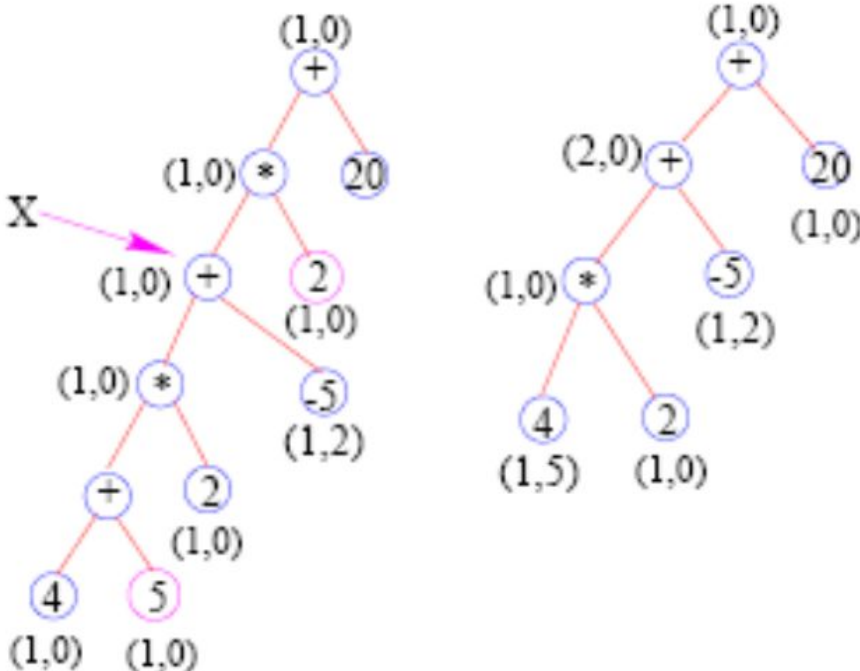


$$(1*2 + 0) + (-5*1 + 0) = (1* -5 + 2)$$

$$(1,2)$$



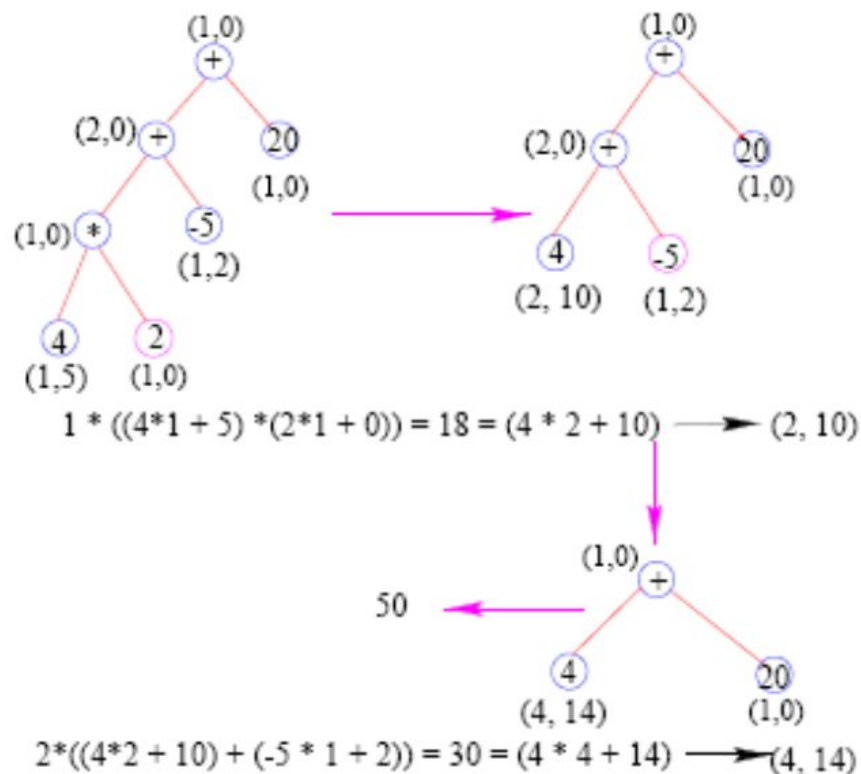
# Example run through



$$(2*1 + 0) * (1*X + 0) = (2*X + 0) \longrightarrow (2,0)$$

$$(4*1+0) + (5*1 + 0) = (4*1 + 5) \longrightarrow (1,5)$$

# Example run through



# Parallel algorithmic techniques

- **Divide and conquer (mergesort, parallel sum and other reductions, prefix-sum)**
- Parallel pointer manipulation
  - **Pointer jumping**
  - **Euler tour**
  - **Graph contraction (Tree contraction with rake, compress (pointer jumping), shunt)**
  - Ear decomposition
- Randomization
  - Sampling
  - Symmetry breaking
  - Load balancing