Advanced Algorithms & Data Structures

Lecture Theme 14

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Overview

- A simple parallel algorithm for computing parallel prefix.
- A parallel merging algorithm

Definition of prefix computation

 We are given an ordered set A of n elements and a binary associative operator ⊕.

$$A = \{a_0, a_1, a_2, ..., a_{n-1}\}$$

We have to compute the ordered set

$$\{a_0, (a_0 \oplus a_1), ..., (a_0 \oplus a_1 \oplus ...a_{n-1})\}$$

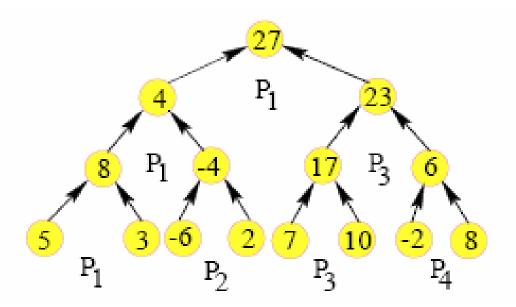
An example of prefix computation

 For example, if ⊕ is + and the input is the ordered set

then the output is

• Prefix sum can be computed in O(n) time sequentially.

Using a binary tree



First Pass

 For every internal node of the tree, compute the sum of all the leaves in its subtree in a bottom-up fashion.

$$sum[v] := sum[L[v]] + sum[R[v]]$$

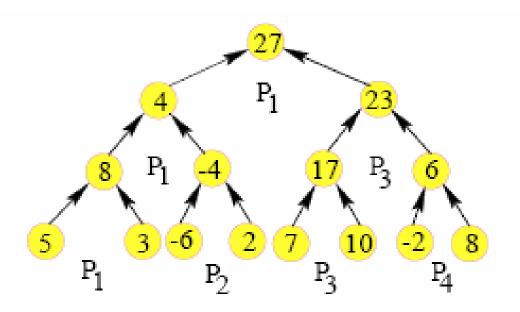
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for d = 0 to \log n - 1 do
for i = 0 to n - 1 by 2^{d+1} do in parallel
a[i + 2^{d+1} - 1] := a[i + 2^d - 1] + a[i + 2^{d+1} - 1]
```

• In our example, n = 8, hence the outer loop iterates 3 times, d = 0, 1, 2.

When d= 0

- d = 0: In this case, the increments of 2^{d+1} will be in terms of 2 elements.
- for i = 0, $a[0 + 2^{0+1} - 1] := a[0 + 2^0 - 1] + a[0 + 2^{0+1} - 1]$ or, a[1] := a[0] + a[1]

Using a binary tree



First Pass

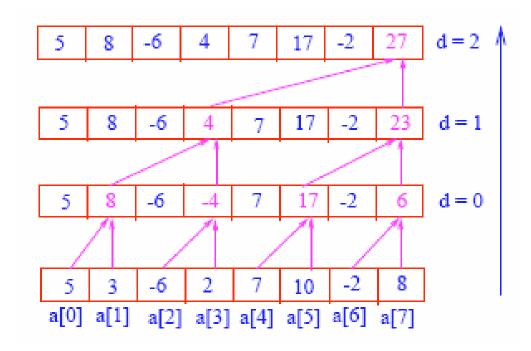
 For every internal node of the tree, compute the sum of all the leaves in its subtree in a bottom-up fashion.

$$sum[v] := sum[L[v]] + sum[R[v]]$$

When d = 1

- d = 1: In this case, the increments of 2^{d+1} will be in terms of 4 elements.
- for i = 0, $a[0 + 2^{1+1} - 1] := a[0 + 2^1 - 1] + a[0 + 2^{1+1} - 1]$ or, a[3] := a[1] + a[3]
- for i = 4, $a[4 + 2^{1+1} - 1] := a[4 + 2^1 - 1] + a[4 + 2^{1+1} - 1]$ or, a[7] := a[5] + a[7]

The First Pass



- blue: no change from last iteration.
- magenta: changed in the current iteration.

The Second Pass

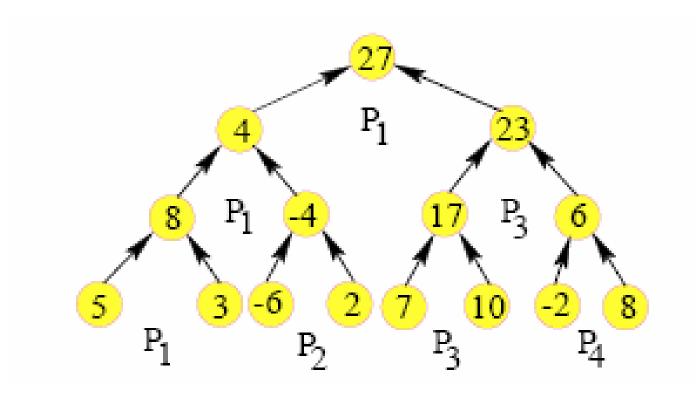
Second Pass

- The idea in the second pass is to do a topdown computation to generate all the prefix sums.
- We use the notation *pre*[*v*] to denote the prefix sum at every node.

Computation in the second phase

- pre[root] := 0, the identity element for the ⊕
 operation, since we are considering the +
 operation.
- If the operation is max, the identity element will be $-\infty$.

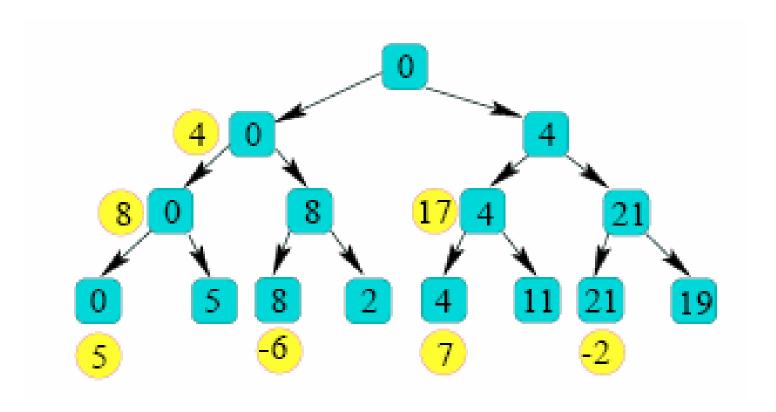
Second phase (continued)



$$pre[L[v]] := pre[v]$$

$$pre[R[v]] := sum[L[v]] + pre[v]$$

Example of second phase



pre[L[v]] := pre[v]pre[R[v]] := sum[L[v]] + pre[v]

```
for d = (\log n - 1) downto 0 do

for i = 0 to n - 1 by 2^{d+1} do in parallel

temp := a[i + 2^d - 1]

a[i + 2^d - 1] := a[i + 2^{d+1} - 1] (left child)

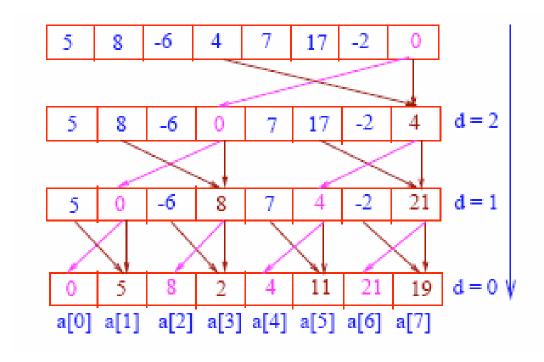
a[i + 2^{d+1} - 1] := temp + a[i + 2^{d+1} - 1] (right child)
```

a[7] is set to 0

• We consider the case d = 2 and i = 0

temp :=
$$a[0 + 2^2 - 1] := a[3]$$

 $a[0 + 2^2 - 1] := a[0 + 2^{2+1} - 1] \text{ or, } a[3] := a[7]$
 $a[0 + 2^{2+1} - 1] := temp + a[0 + 2^{2+1} - 1] \text{ or,}$
 $a[7] := a[3] + a[7]$



- blue: no change from last iteration.
- magenta: left child.
- brown: right child.

- All the prefix sums except the last one are now in the leaves of the tree from left to right.
- The prefix sums have to be shifted one position to the left. Also, the last prefix sum (the sum of all the elements) should be inserted at the last leaf.
- The complexity is $O(\log n)$ time and O(n) processors.

Exercise: Reduce the processor complexity to $O(n / \log n)$.

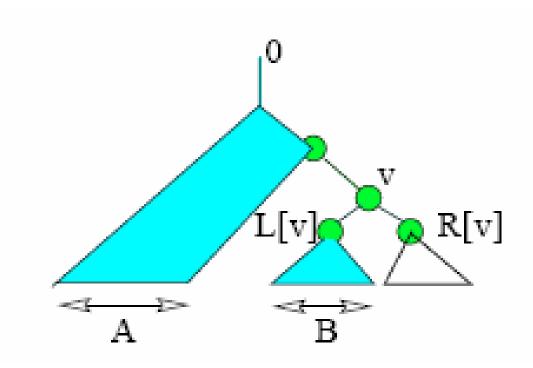
• Vertex *x* precedes vertex *y* if *x* appears before *y* in the preorder (depth first) traversal of the tree.

Lemma: After the second pass, each vertex of the tree contains the sum of all the leaf values that precede it.

Proof: The proof is inductive starting from the root.

Inductive hypothesis: If a parent has the correct sum, both children must have the correct sum.

Base case: This is true for the root since the root does not have any node preceding it.



• Left child: The left child L[v] of vertex v has exactly the same leaves preceding it as the vertex itself.

- These are the leaves in the region A for vertex L[v].
- Hence for L[v], we can copy pre(v) as the parent's prefix sum is correct from the inductive hypothesis.

- Right child: The right child of v has two sets of leaves preceding it.
 - The leaves preceding the parent (region A) for R[v]
 - The leaves preceding L[v] (region B).

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pre(v) is correct from the inductive hypothesis.
Hence, pre(R[v]) := pre(v) + sum(L[v]).
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