

# Data Structures

Oliver-Matis Lill

June 6, 2017

- First I will hold a short lecture on the subject
- Rest of the time is spent on problem solving
- Try to finish the standard problems at home if necessary

## Topics

- Session subjects
  - 1 Fenwick Tree
  - 2 Segment Tree
- Advanced subjects for self-learning:
  - 1 Lazy Propagation on Segment Tree
  - 2 Persistent Segment Tree

# Problem nr. 1

- We have an array of up to  $10^5$  elements:


4	3	6	7	5	2	1	9	7	8
---	---	---	---	---	---	---	---	---	---

- We have to perform the following operations on the array:
  - 1 Increase the value of some element by  $x$
  - 2 Give some element a new value  $y$
  - 3 Output the sum of elements in segment  $[l, r]$
- Up to  $10^5$  operations

## Idea

- Let's look at the binary form of indices
- Let's create a new array  $f$ , where  $f_i = a_{i-s+1} + \dots + a_i$  and  $s$  is the value of the rightmost 1-bit of  $i$
- For example, if  $i = 12_{10} = 1100_2$ , then  $s = 100_2 = 4_{10}$  and  $f_{12} = a_9 + a_{10} + a_{11} + a_{12}$
- Rightmost 1-bit of  $i$  can be acquired with the expression  $i \& -i$

## Example



f[i]	-	4	7	6	20	5	7	1	37	7	15
a[i]	-	4	3	6	7	5	2	1	9	7	8
i	0	1	2	3	4	5	6	7	8	9	10
i&-i	0	1	2	1	4	1	2	1	8	1	2

# Fenwick Tree Operations

- Fenwick tree allows you to output the sum of segment  $[1, i]$  in  $O(\log n)$  time
- To compute the sum, add  $f_i$  to the sum and subtract from  $i$  its rightmost bit. Repeat until  $i = 0$
- For example if  $i = 26_{10} = 11010_2$ , then the traversed indices are  $11010_2, 11000_2, 10000_2$  and the sum is  $f_{26} + f_{24} + f_{16}$

- Additionally you can increase the value of element  $i$  by  $x$  in  $O(\log n)$  time
- To do that, increase  $f_i$  by  $x$  and add to  $i$  its rightmost bit. Repeat until  $i$  is larger than the size of the array
- For example, if  $i = 45_{10} = 101101_2$  then the traversed indices are  $101101_2, 101110_2, 110000_2, 1000000_2$  and the updated fenwick tree elements are  $f_{45}, f_{46}, f_{48}, f_{64}$

## Example

```
int get(int i) {
    int sum = 0;
    while(i > 0) {
        sum += f[i];
        i -= i&-i;
    }
    return sum;
}

void add(int i, int x) {
    while(i < f.size()) {
        f[i] += x;
        i += i&-i;
    }
}
```

# Fenwick Tree Operations

## Example

f[i]	-	4	7	6	20	5	7	1	37	7	15
a[i]	-	4	3	6	7	5	2	1	9	7	8
i	0	1	2	3	4	5	6	7	8	9	10
i&-i	0	1	2	1	4	1	2	1	8	1	2

↑  
query(7) = 28

f[i]	-	4	7	10	24	5	7	1	41	7	15
a[i]	-	4	3	10	7	5	2	1	9	7	8
i	0	1	2	3	4	5	6	7	8	9	10
i&-i	0	1	2	1	4	1	2	1	8	1	2

↑  
add(3, 4)



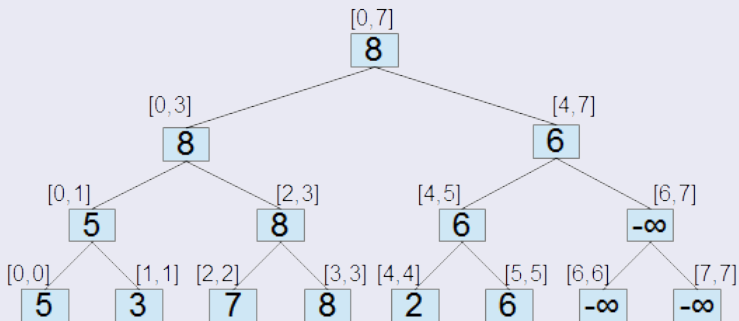
- We have up to  $10^5$  array elements and operations
- The operations are:
  - 1 Increase the value of some element by  $x$
  - 2 Assign a new value  $y$  to some element
  - 3 Output the **maximum** value of elements in segment  $[l, r]$
- Would Fenwick tree work here?

## Idea

- Use a perfect binary tree. Store array elements in the leaves
- Non-leaf nodes hold the maximum/sum/etc of their children
- As a result the value of some node is the maximum of the leaves of its subtree, which corresponds to some initial array segment

# Segment Tree

## Example



- We could store the segment tree nodes in the following fashion:

```
struct Node {  
    Node* leftChild, rightChild; //Children of this node  
    int l, r; //Segment covered by this node  
    int value; //The max of the covered segment  
};
```

- For non-leaf nodes the following equations must always hold

$$l = \text{leftChild} \rightarrow l$$

$$r = \text{rightChild} \rightarrow r$$

$$\text{value} = \max(\text{leftChild} \rightarrow \text{value}, \text{rightChild} \rightarrow \text{value})$$

# Segment Tree Set Operation

- Notice how the nodes on each level cover disjoint segments, for example for the previously shown segment tree the segments in levels are:

level 0 [0:7]

level 1 [0:3], [4:7]

level 2 [0:1], [2:3], [4:5], [6:7]

level 3 [0:0], [1:1], [2:2], [3:3], [4:4], [5:5], [6:6], [7:7]

- When we update some array element, only a single node on each level is affected
- Since there are  $O(\log n)$  levels we have to update at most  $O(\log n)$  nodes

# Segment Tree Set Operation

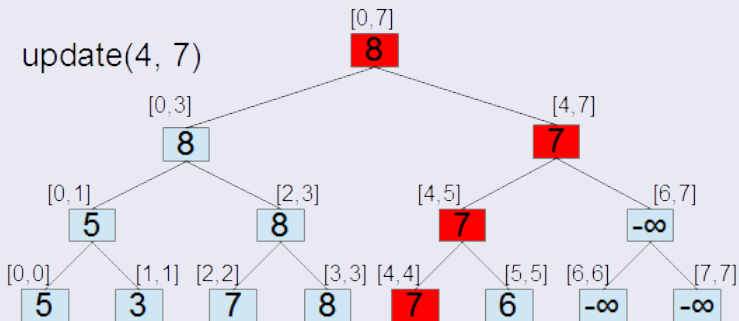
- This gives us a simple algorithm to perform the set operation. It works in the following way:
  - 1 Recursively traverse from root to the leaf to be updated
  - 2 Perform the set operation on the leaf
  - 3 Backtrack up through the recursion, updating the nodes on the path

## Example

```
void set(Node* cur, int i, int y) {
    //If we are at leaf, update it and finish
    if(cur->isLeaf() ) {
        cur->value = y;
        return;
    }
    //Recursively traverse towards the leaf
    if(i <= cur->leftChild->r)
        add(cur->leftChild, i, y);
    else
        add(cur->rightChild, i, y);
    //Finally update nodes as we backtrack
    cur->value = max(cur->leftChild->value, cur->rightChild->value);
}
```

# Segment Tree Set Operation Example

## Example





# Segment Tree Get Operation

- The get operation can also be performed with a recursive algorithm
- The main difference, and complexity is that we have to operate on a range rather than a single element

# Segment Tree Get Operation Code

## Example

```
int get(Node* cur, int l, int r) {
    //If node is completely inside the queried segment, return
    if(l <= cur->l && cur->r <= r)
        return cur->value;

    int result = -INFINITY;
    //Recurse to children that intersect with the query segment
    if(l <= cur->leftChild->l)
        result = max(result, get(cur->leftChild, l, r) );
    if(cur->rightChild->l <= r)
        result = max(result, get(cur->rightChild, l, r) );

    return result;
}
```

## Proof of Complexity

- Analyzing the time complexity is more complicated than with set operation
- Look at the first node where it recurses to both children, let's call that node "split"
- Note that for its children the following equations must hold:

$$\begin{aligned} \text{split} \rightarrow \text{leftChild} \rightarrow r &\leq r \\ l &\leq \text{split} \rightarrow \text{rightChild} \rightarrow l \end{aligned}$$

## Proof of Complexity

- When we recurse to some node "cur" in the subtree of "split->leftChild", then we have two possibilities:

1

$$l \leq \text{cur->leftChild->r}$$

Here "cur->rightChild" is completely inside  $[l, r]$  and therefore returns immediately

2

$$\text{cur->leftChild->r} < l$$

Here "cur->leftChild" is completely outside  $[l, r]$  and we won't recurse into it

- Note how in both cases, there is at most one node that we recurse into that doesn't return immediately

## Proof of Complexity

- When we recurse to some node "cur" in the subtree of "split->rightChild", then we similarly have two possibilities:

1

$$\text{cur->rightChild->l} \leq r$$

Here "cur->leftChild" is completely inside  $[l, r]$  and returns immediately

2

$$r < \text{cur->rightChild->l}$$

Here "cur->rightChild" is completely outside  $[l, r]$  and won't be recursed into

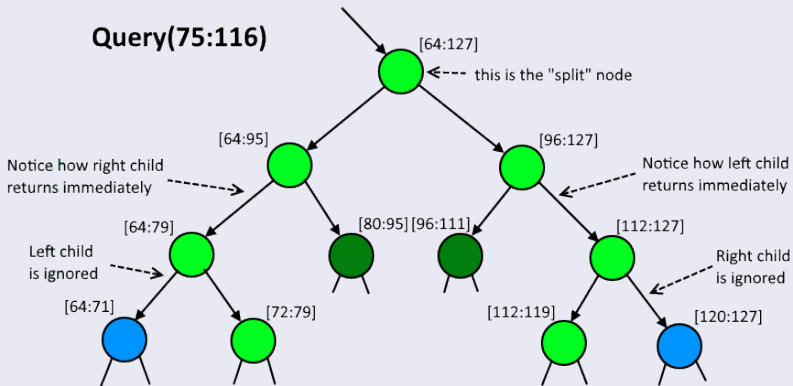
- Once again, in both cases there is at most one child we can recurse into that won't return immediately

## Proof of Complexity

- At each level up to the "split" node we go through only one node
- At each level after the "split" node we traverse at most two nodes that don't return immediately
  - 1 One in the subtree of "split->leftChild"
  - 2 One in the subtree of "split->rightChild"
- Since there are  $O(\log n)$  levels, the time complexity will be  $O(\log n)$

# Segment Tree Get Operation Time Complexity

## Proof of Complexity Example



# Segment Tree Get Operation

## Example

