

Interval Trees

Bruce Merry

Interval Trees

A Problem

Solution

Implementation

Fenwick Trees

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More

Query/Update
Problems

Using

Transformations

Summary

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IOI Training Mar 2014

Outline

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Summary

A city has N buildings in a row, numbered from 1 to N . Initially, every building has height 0. Accept a sequence of queries and updates of the form

- Building i now has height h .
- What is the height of the tallest building in the range $[l, r]$?

Analysis: Naïve Solution

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Simply store the height of each building:

- Each update requires $O(1)$ time
- Each query requires $O(N)$ time

Slightly Smarter Solution

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Summary

- Divide city into “neighbourhoods” of \sqrt{N} buildings
- Maintain the maximum height of each neighbourhood

Running time:

- Each update takes $O(\sqrt{N})$ time
- Each query takes $O(\sqrt{N})$ time (why?)

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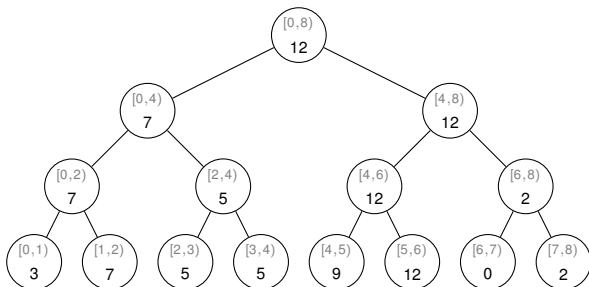
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Instead of just buildings and neighbourhoods, use a hierarchy:



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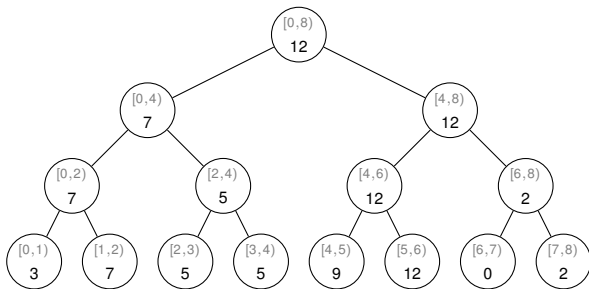
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Walk up the tree, updating ancestors



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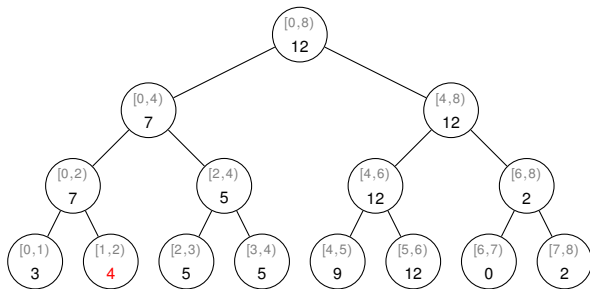
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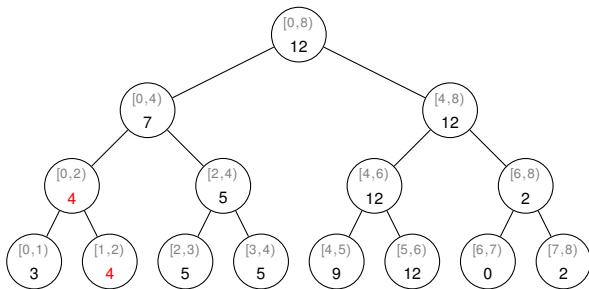
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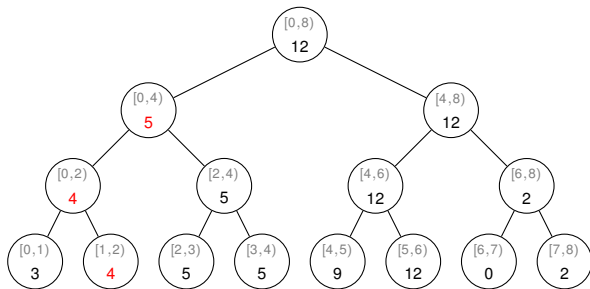
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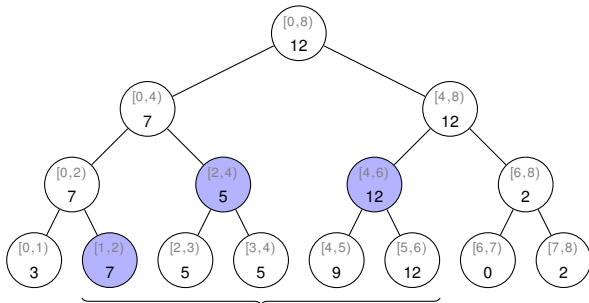
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Summary

Pick a set of nodes to cover the range e.g. for $[1, 6]$:



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Summary

- Each update touches $O(\log N)$ nodes
- Each query examines $O(\log N)$ nodes (why?)

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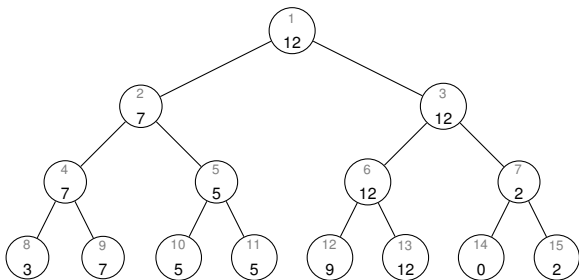
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Summary

Number nodes in BFS order



- Parent of i is $\lfloor i/2 \rfloor$
- Children of i are $2i, 2i + 1$
- Round up to a power of 2

Initialisation

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Summary

```
void fix(int idx) {
    tree[idx] = max(tree[2 * idx],
                   tree[2 * idx + 1]);
}
```

```
vector<int> init(const vector<int> &values) {
    int bias = next_power2(values.size());
    vector<int> tree(2 * bias, 0);
    copy(values.begin(), values.end(),
         tree.begin() + bias);
    for (int i = bias; i > 0; i--)
        fix(tree, i);
    return tree;
}
```

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```
void update(int pos, int val) {  
    pos += tree.size() / 2;  
    tree[pos] = val;  
    for (pos = pos / 2; pos > 0; pos = pos / 2)  
        fix(tree, pos);  
}
```

Query

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```
int query(int L, int R) {
    int ans = 0;
    L += bias; R += bias;
    while (L < R) {
        if (L & 1) {
            ans = max(ans, tree[L]);
            L++;
        }
        if (R & 1) {
            R--;
            ans = max(ans, tree[R]);
        }
        L /= 2; R /= 2;
    }
    return ans;
}
```

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Summary

A city has N buildings in a row, numbered from 1 to N . Initially, every building has height 0. Accept a sequence of queries and updates of the form

- Building i now has height h .
- What is the sum of the building heights in the range $[l, r]$?

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Summary

A city has N buildings in a row, numbered from 1 to N . Initially, every building has height 0. Accept a sequence of queries and updates of the form

- Building i now has height h .
- What is the sum of the building heights in the range $[l, r]$?

You only have enough memory for $N + \epsilon$ integers.

A Non-Obvious Solution

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Summary

Store a **prefix sum** of the heights: sum of the first i heights for every i .

Query Take the difference between two prefix sums:
 $O(1)$

Update Modify all prefix sums that include this element: $O(N)$

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Interval Tree is Redundant

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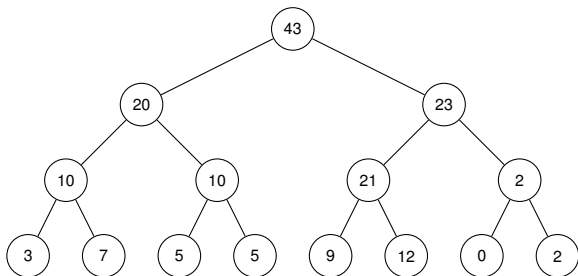
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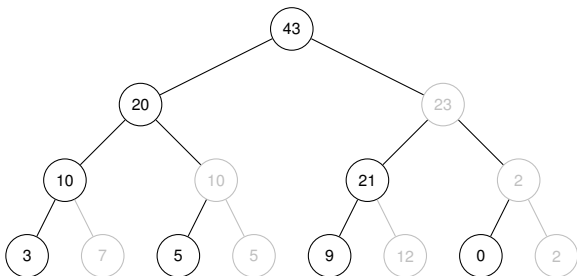
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Interval Tree is Redundant

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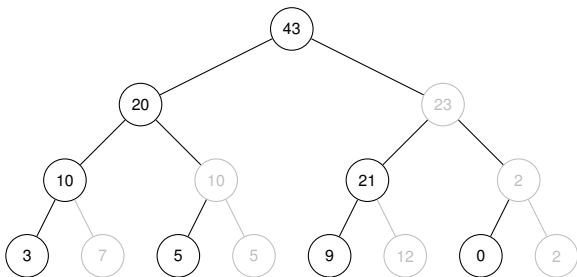
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These nodes are not involved in prefix sum queries.

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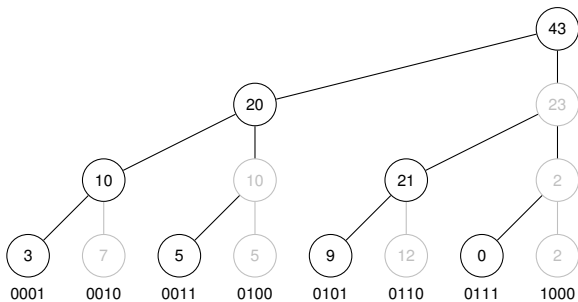
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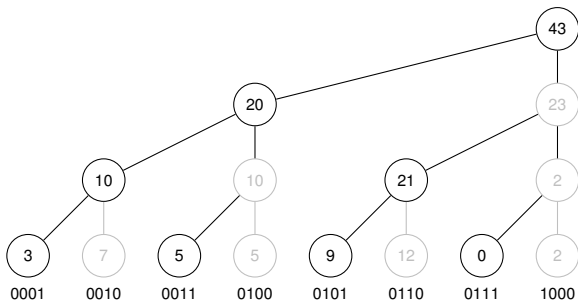
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Summary



Element i is sum of 2^k elements, $2^k \mid i$, k is maximum

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Summary

The parent of i is $i + 2^k$ where $2^k \mid i$, k is maximal.
Example:

$$\begin{array}{r} 11001000 \\ + 00001000 \\ = 11010000 \end{array}$$

Finding The Parent

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Summary

The parent of i is $i + 2^k$ where $2^k \mid i$, k is maximal.

Example:

$$\begin{array}{r} 11001000 \\ + 00001000 \\ = 11010000 \end{array}$$

To find 2^k , we take i and mask off $i - 1$:

$$\begin{array}{r} 11001000 \\ \& \sim 11000111 \\ = 00001000 \end{array}$$

Update

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Summary

```
void bit_add(int *bit, int p, int v) {  
    while (p < size) {  
        bit[p] += v;  
        p += p & ~(p - 1);  
    }  
}
```

Query

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Summary

To query a prefix sum, we add the current node, then see what is left.

```
int bit_query(const int *bit, int p) {
    int ans = 0;
    while (p > 0) {
        ans += bit[p];
        p &= p - 1; // same as p -= p & ~(p - 1);
    }
    return ans;
}
```

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Range Update, Point Query

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Starting with an array a , handle the following queries

- Update: increment by h across a range $[l, r]$
- Query: return a_i

Range Update, Point Query

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Operate on array of **adjacent differences** instead:

$$b_1 = a_1, b_i = a_i - a_{i-1}$$

Range Update, Point Query

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Summary

Operate on array of **adjacent differences** instead:

$$b_1 = a_1, b_i = a_i - a_{i-1}$$

Operations become:

Update $b_l \leftarrow b_l + h, b_{r+1} \leftarrow b_{r+1} - h$

Range Update, Point Query

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Summary

Operate on array of **adjacent differences** instead:

$$b_1 = a_1, b_i = a_i - a_{i-1}$$

Operations become:

Update $b_l \leftarrow b_l + h, b_{r+1} \leftarrow b_{r+1} - h$

Query Return $a_i = \sum_1^i b_j$ using Fenwick tree.

Range Update, Range Query

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Summary

Starting with an array a , handle the following queries

- Update: increment by h across a range $[l, r]$
- Query: return the sum $\sum_{i=l}^r a_i$

Note: sufficient to be able to answer $\sum_{i=1}^r a_i$.

Range Update, Range Query

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Summary

Start with the same transformation as before:

$$b_1 = a_1, b_j = a_j - a_{j-1}$$

Query is

$$\begin{aligned}\sum_{i=1}^r a_i &= \sum_{i=1}^r \sum_{j=1}^i b_j \\ &= \sum_{i=1}^r (r-1-i)b_i \\ &= (r-1) \left(\sum_{i=1}^r b_i \right) - \left(\sum_{i=1}^r i b_i \right)\end{aligned}$$

Range Update, Range Query

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Summary

Start with the same transformation as before:

$$b_1 = a_1, b_j = a_j - a_{j-1}$$

Query is

$$\begin{aligned}\sum_{i=1}^r a_i &= \sum_{i=1}^r \sum_{j=1}^i b_j \\ &= \sum_{i=1}^r (r-1-i)b_i \\ &= (r-1) \left(\sum_{i=1}^r b_i \right) - \left(\sum_{i=1}^r i b_i \right)\end{aligned}$$

Let $c_i = i b_i$. Then we need Fenwick trees for b and c .

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Summary

- Interval trees are a general-purpose tool for accelerating operations on ranges.
- Fenwick trees are less general, but more compact and easier to implement.
- Both have relatively low overhead and simple implementation due to the implicit tree structure.