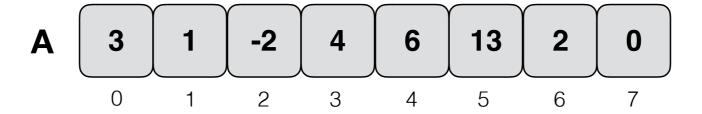
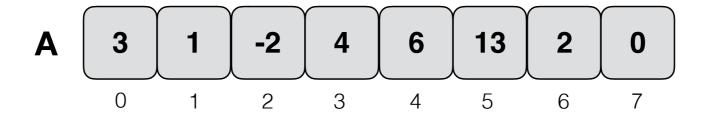
# Segment trees

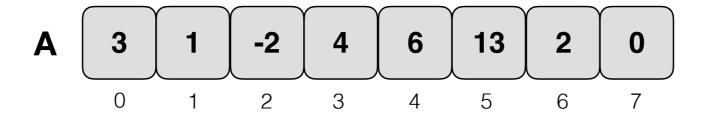
Giulio Ermanno Pibiri giulio.pibiri@di.unipi.it

25/10/2017





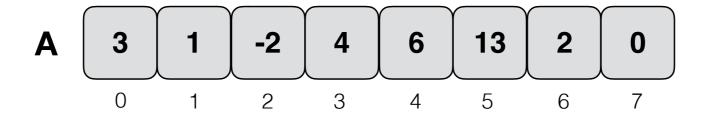
- **sum**(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x



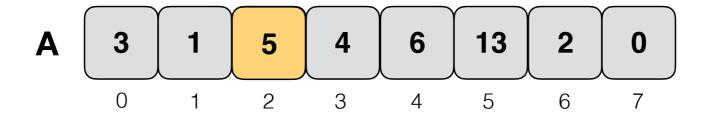
- sum(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x

$$sum(3) = 6$$

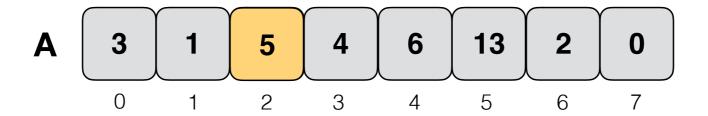
$$sum(5) = 25$$



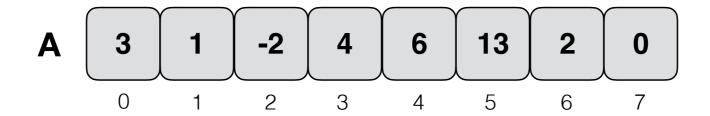
- sum(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x



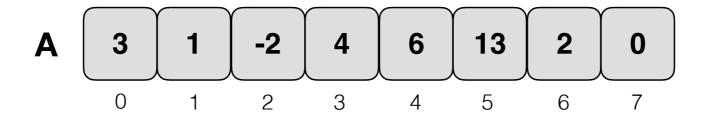
- sum(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x



- sum(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x



- sum(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x

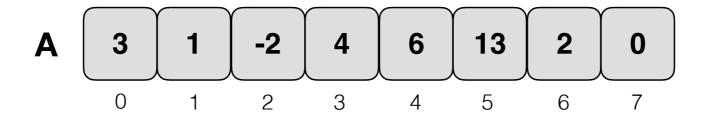


## (Static) Prefix sums

- sum(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x

## Range MIN (MAX) queries

Report the MIN (MAX) in A[i,j]



## (Static) Prefix sums

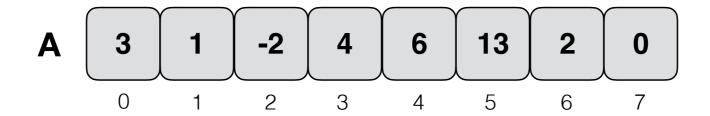
- sum(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x

## Range MIN (MAX) queries

Report the MIN (MAX) in A[i,j]

$$min(1,3) = -2$$

$$max(4,7) = 13$$



## (Static) Prefix sums

- sum(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x

## Range MIN (MAX) queries

Report the MIN (MAX) in A[i,j]

$$min(1,3) = -2$$

$$max(4,7) = 13$$

## **Range SUM queries**

Report the sum of the elements in A[i,j]

## (Static) Prefix sums

- sum(i) reports the sum of the first i+1 integers
- update(i, x) sets A[i] to x

## Range MIN (MAX) queries

Report the MIN (MAX) in A[i,j]

$$min(1,3) = -2$$

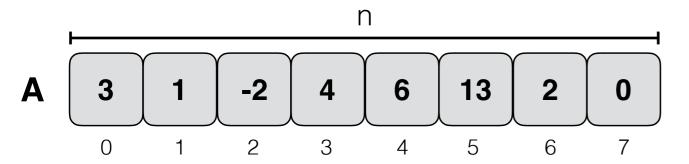
$$max(4,7) = 13$$

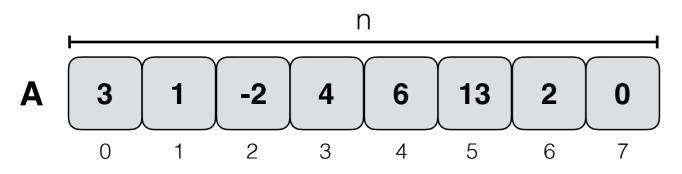
## **Range SUM queries**

Report the sum of the elements in A[i,j]

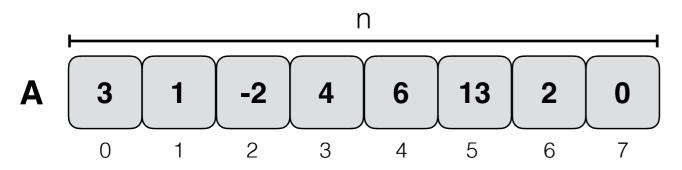
$$sum(1,3) = 3$$

$$sum(4,7) = 21$$





- 1. Do nothing
- 2. Pre-calculate all queries



# 1. Do nothing

2. Pre-calculate all queries

## (Static) Prefix sums

1.

update: O(1)

sum: O(n)

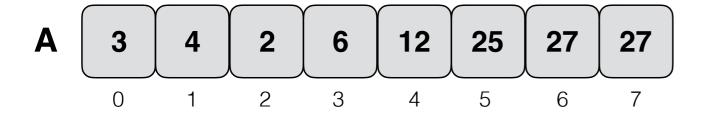
Space: no auxiliary space

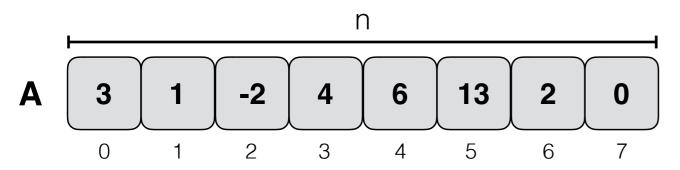
2.

update: O(n)

**sum**: O(1)

Space: no auxiliary space





#### (Static) Prefix sums

1.

update: O(1)

sum: O(n)

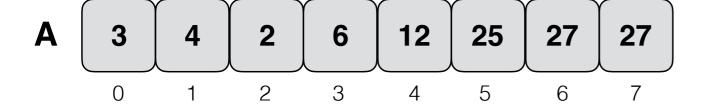
Space: no auxiliary space

2.

update: O(n)

**sum**: O(1)

Space: no auxiliary space



- 1. Do nothing
- 2. Pre-calculate all queries

#### Range MIN (MAX) and SUM queries

1.

Query time:  $\Theta(|range|)$ 

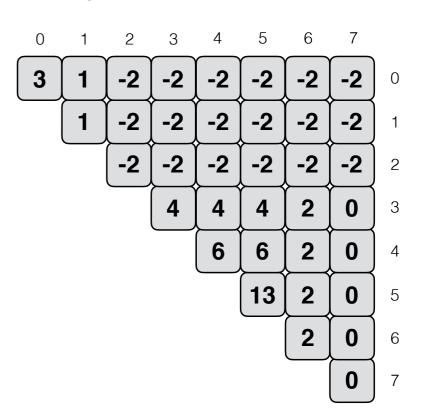
Space: no auxiliary space

2.

Query time: O(1)

Space: O(n<sup>2</sup>)

Building time: O(n<sup>2</sup>)



#### Remember

An efficient solution is the one that gives guaranteed good running times for **all** operations.

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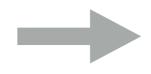


#### Idea

Impose a complete (static) binary tree over the array: a **segment tree**.

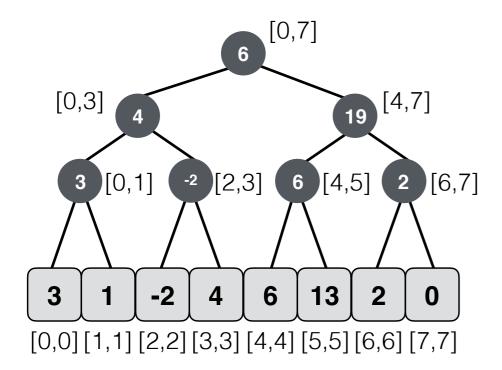
#### Remember

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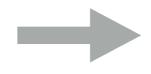
#### Idea

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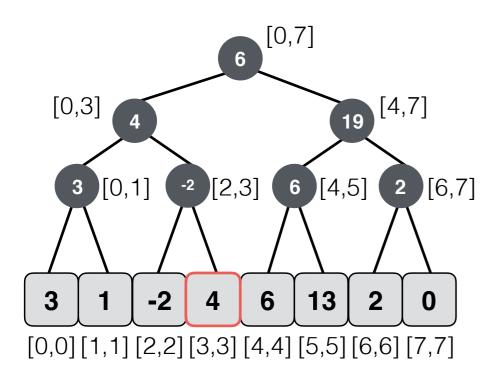
#### Remember

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#### Idea

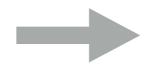
Impose a complete (static) binary tree over the array: a **segment tree**.



$$sum(3) = (4) +$$

#### Remember

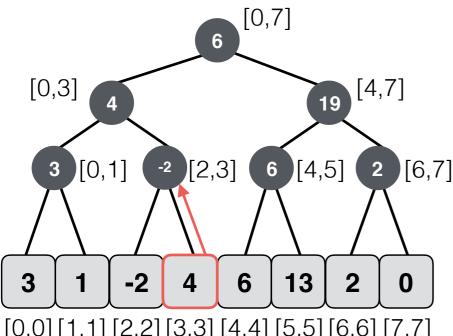
An efficient solution is the one that gives guaranteed good running times for all operations.



#### Idea

Impose a complete (static) binary tree over the array: a segment tree.

## (Static) Prefix sums

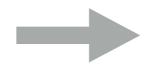


[0,0] [1,1] [2,2] [3,3] [4,4] [5,5] [6,6] [7,7]

$$sum(3) = (4) + (-2) +$$

#### Remember

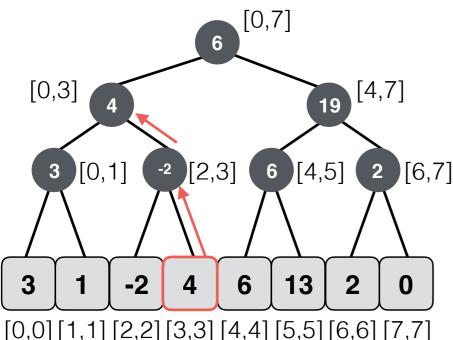
An efficient solution is the one that gives guaranteed good running times for all operations.



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## (Static) Prefix sums

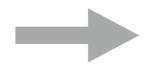


[0,0] [1,1] [2,2] [3,3] [4,4] [5,5] [6,6] [7,7]

$$sum(3) = (4) + (-2) + (4) = 6$$

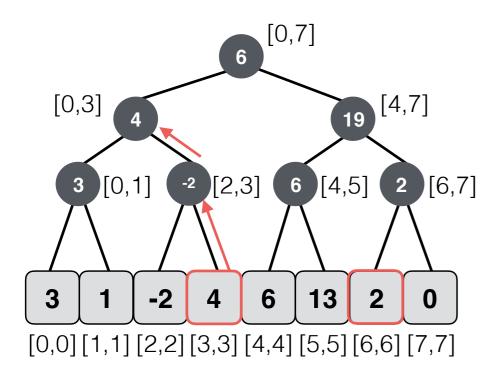
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#### Idea

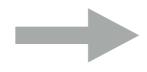
Impose a complete (static) binary tree over the array: a **segment tree**.



$$sum(3) = (4) + (-2) + (4) = 6$$
  
 $sum(6) = (2) +$ 

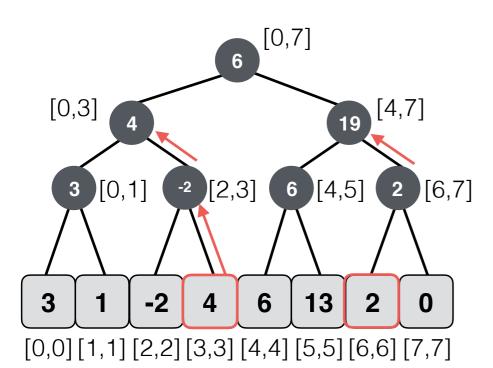
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#### Idea

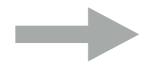
Impose a complete (static) binary tree over the array: a **segment tree**.



$$sum(3) = (4) + (-2) + (4) = 6$$
  
 $sum(6) = (2) + (19) +$ 

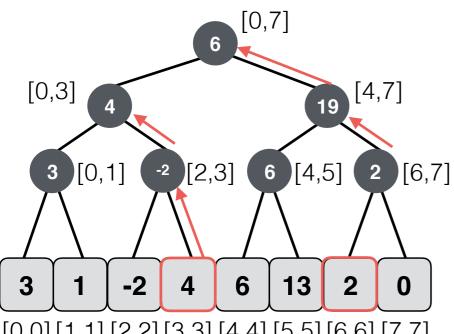
#### Remember

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#### Idea

Impose a complete (static) binary tree over the array: a segment tree.

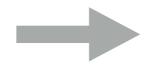


$$sum(3) = (4) + (-2) + (4) = 6$$

$$sum(6) = (2) + (19) + (6) = 27$$

#### Remember

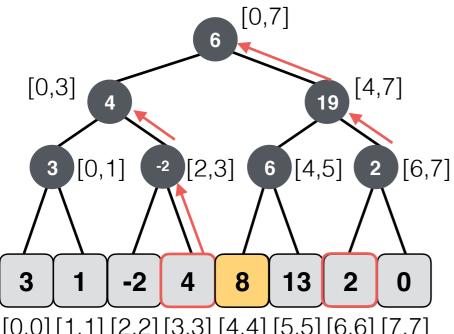
An efficient solution is the one that gives guaranteed good running times for all operations.



#### Idea

Impose a complete (static) binary tree over the array: a segment tree.

## (Static) Prefix sums

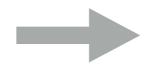


[0,0] [1,1] [2,2] [3,3] [4,4] [5,5] [6,6] [7,7]

$$sum(3) = (4) + (-2) + (4) = 6$$
  
 $sum(6) = (2) + (19) + (6) = 27$   
 $update(4, 8)$ 

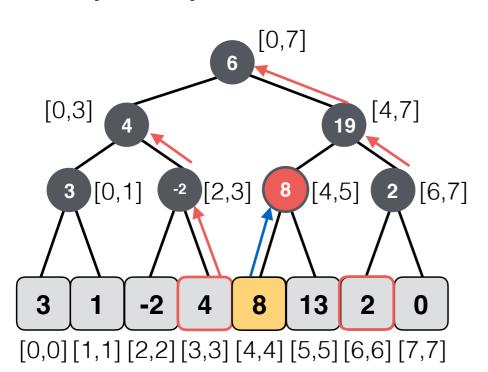
#### Remember

An efficient solution is the one that gives guaranteed good running times for **all** operations.



#### Idea

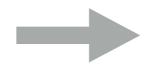
Impose a complete (static) binary tree over the array: a **segment tree**.



$$sum(3) = (4) + (-2) + (4) = 6$$
  
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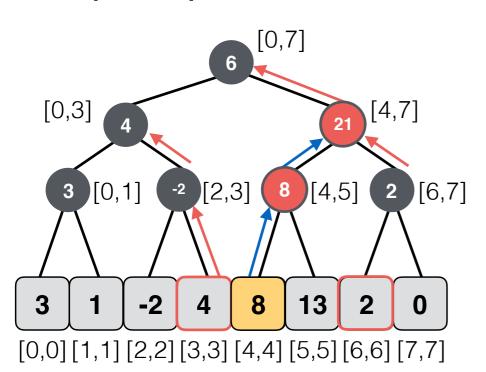
#### Remember

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#### Idea

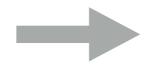
Impose a complete (static) binary tree over the array: a **segment tree**.



$$sum(3) = (4) + (-2) + (4) = 6$$
  
 $sum(6) = (2) + (19) + (6) = 27$   
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#### Remember

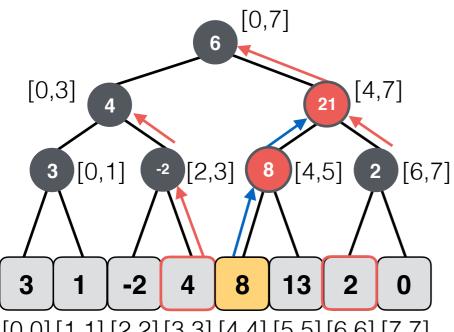
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#### Idea

Impose a complete (static) binary tree over the array: a segment tree.

## (Static) Prefix sums



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

$$sum(3) = (4) + (-2) + (4) = 6$$

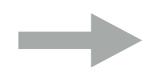
$$sum(6) = (2) + (19) + (6) = 27$$

update(4, 8)

sum and update in O(log n)

#### Remember

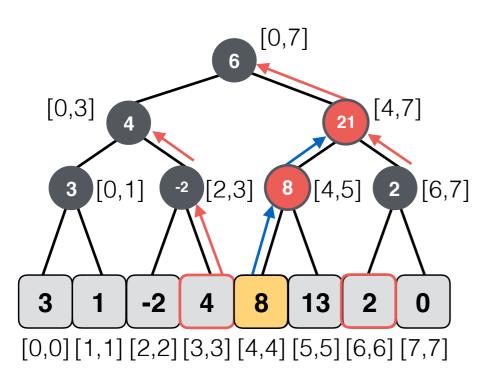
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#### Idea

Impose a complete (static) binary tree over the array: a **segment tree**.

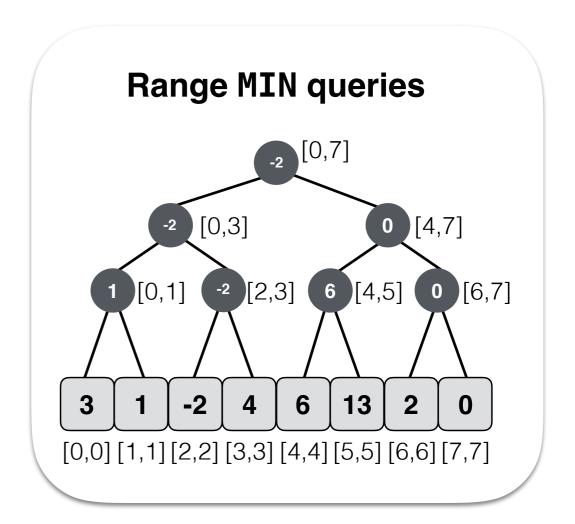
#### (Static) Prefix sums

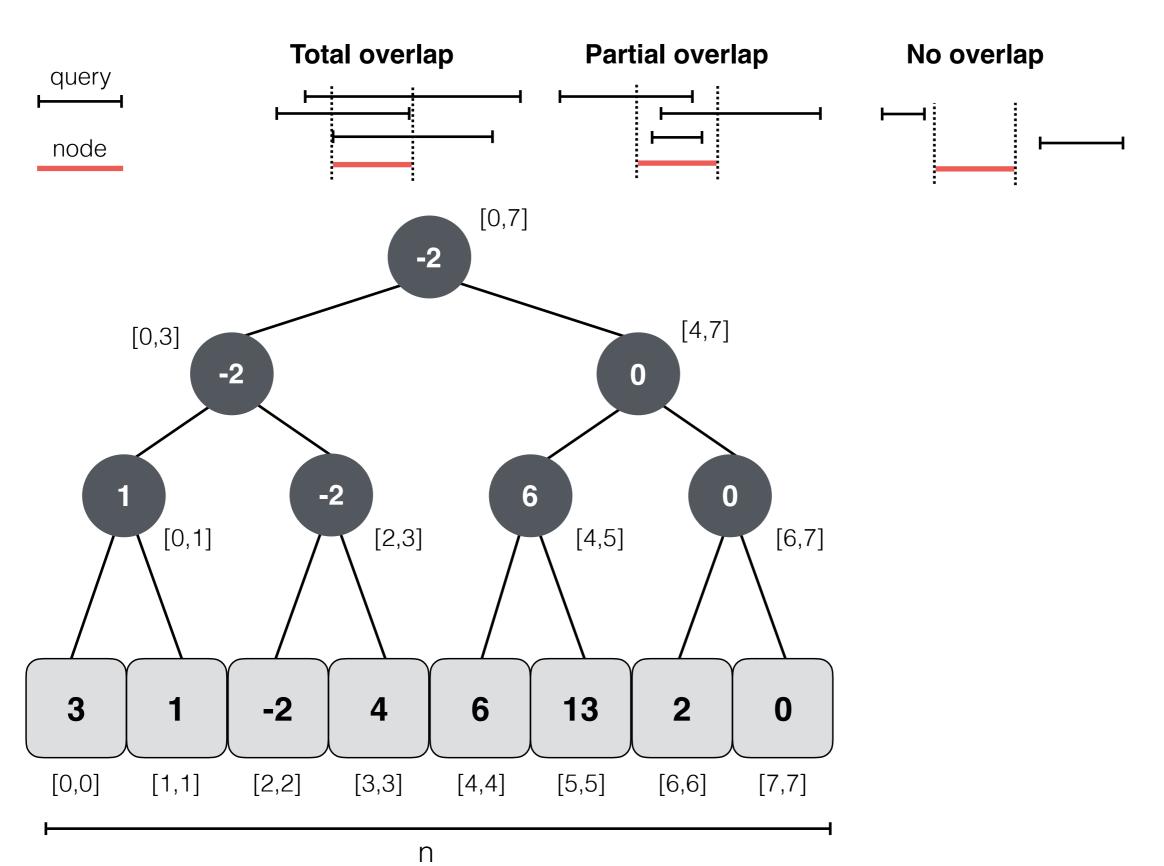


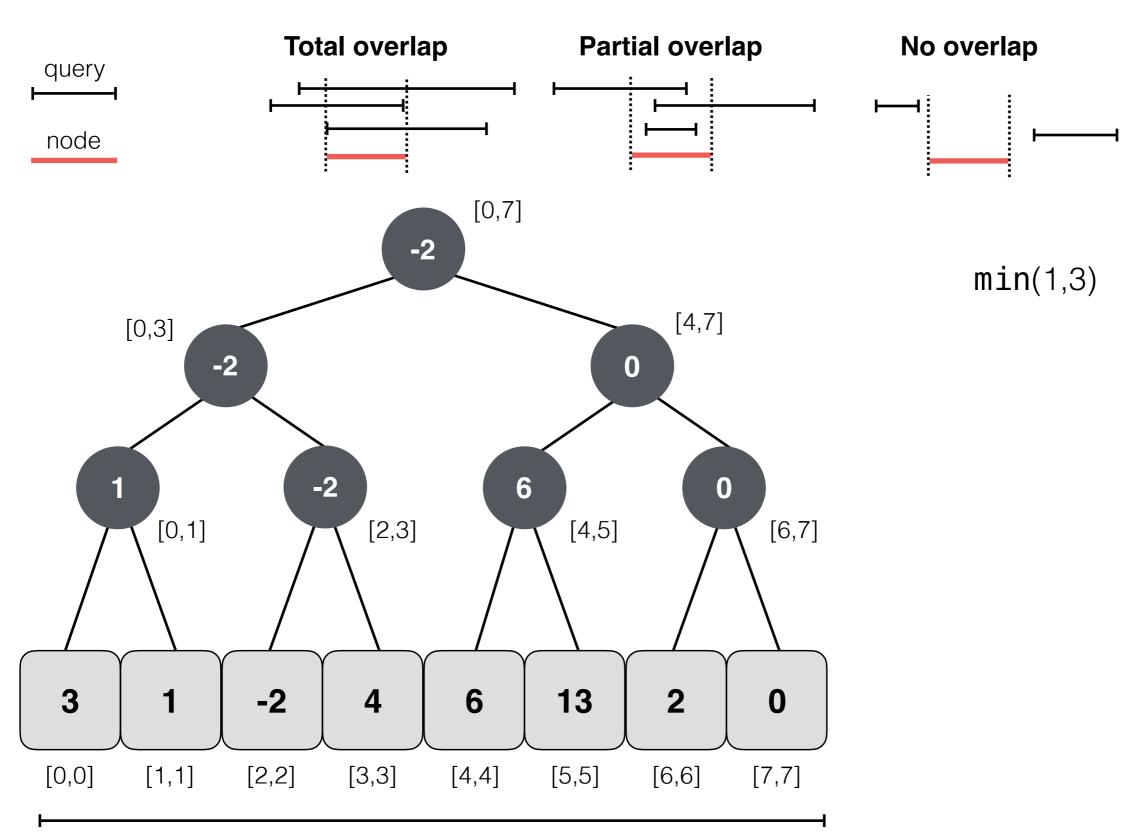
$$sum(3) = (4) + (-2) + (4) = 6$$
  
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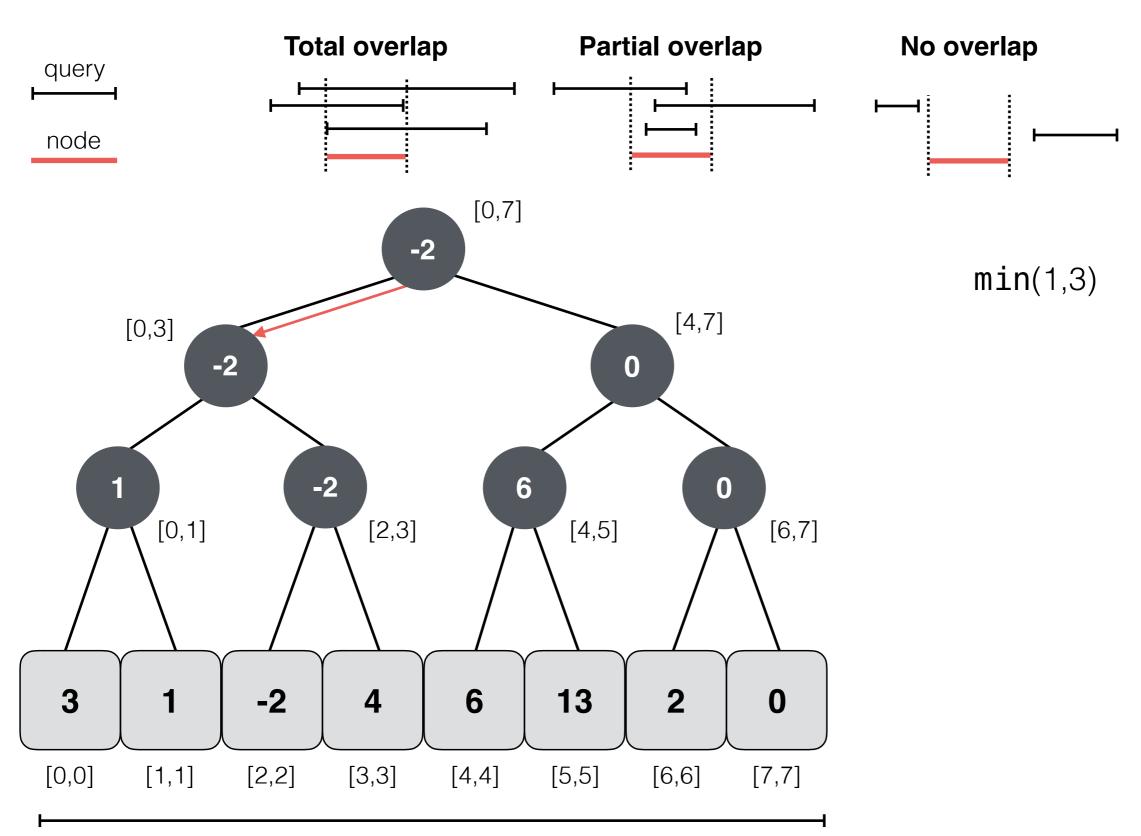
sum and update in O(log n)

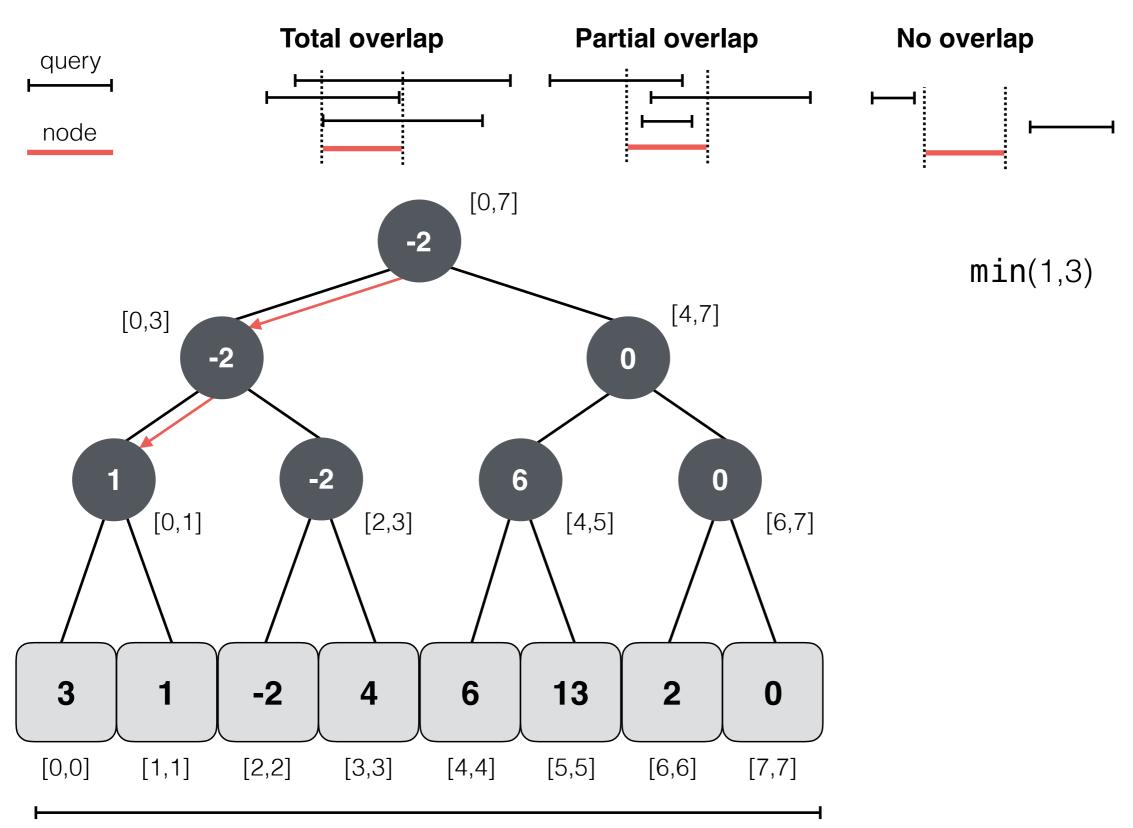
#### What we consider next, stay tuned!

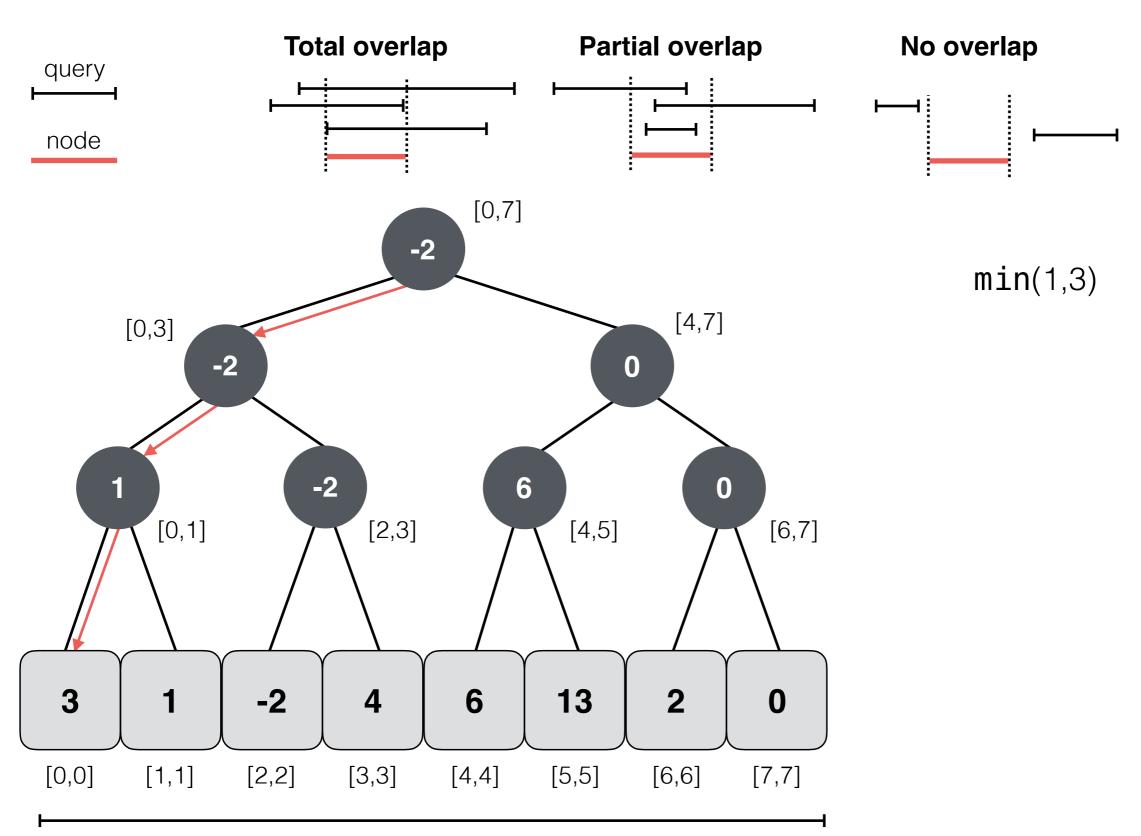


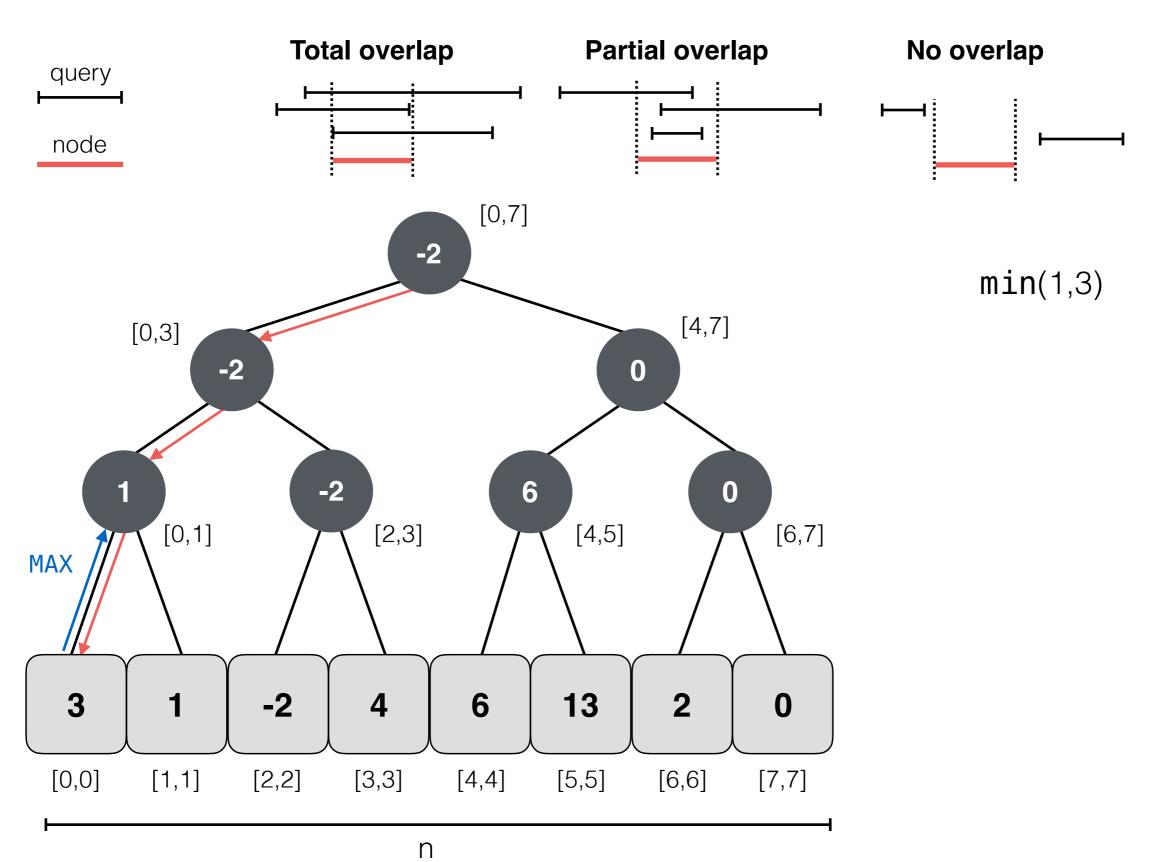


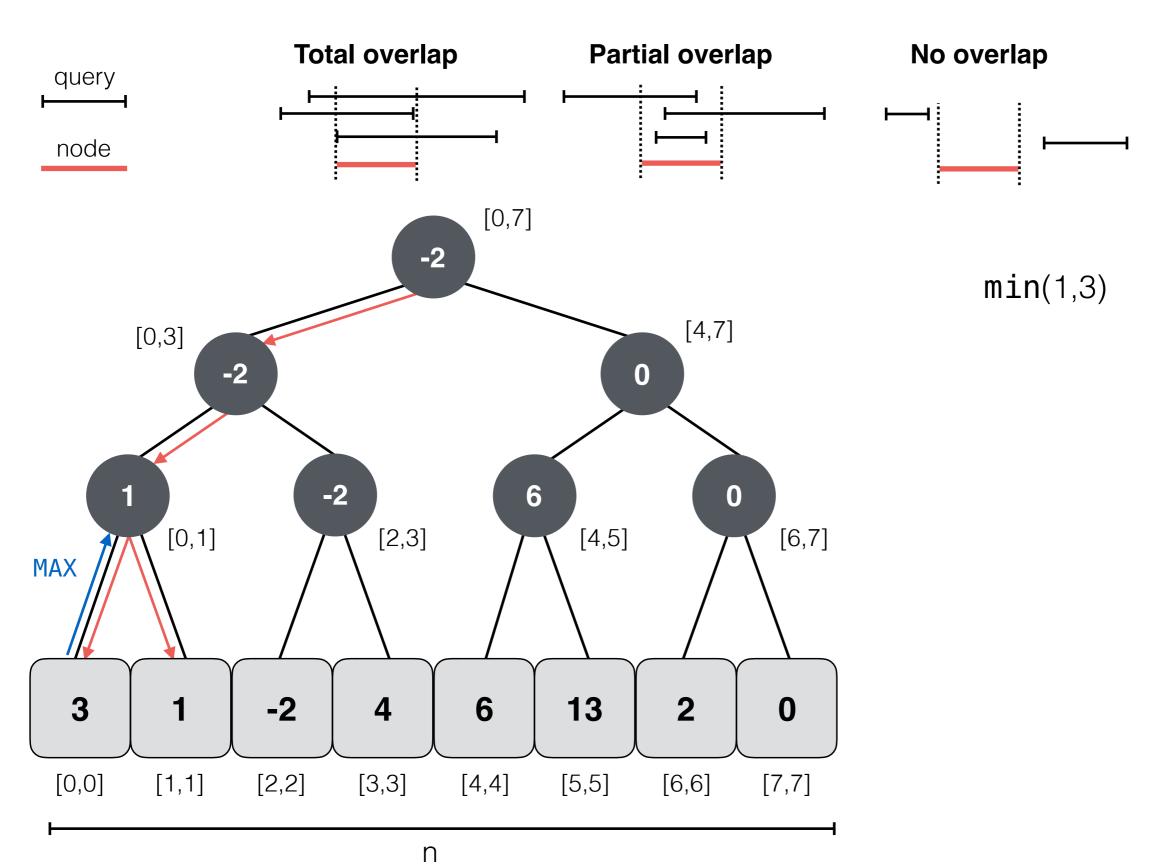


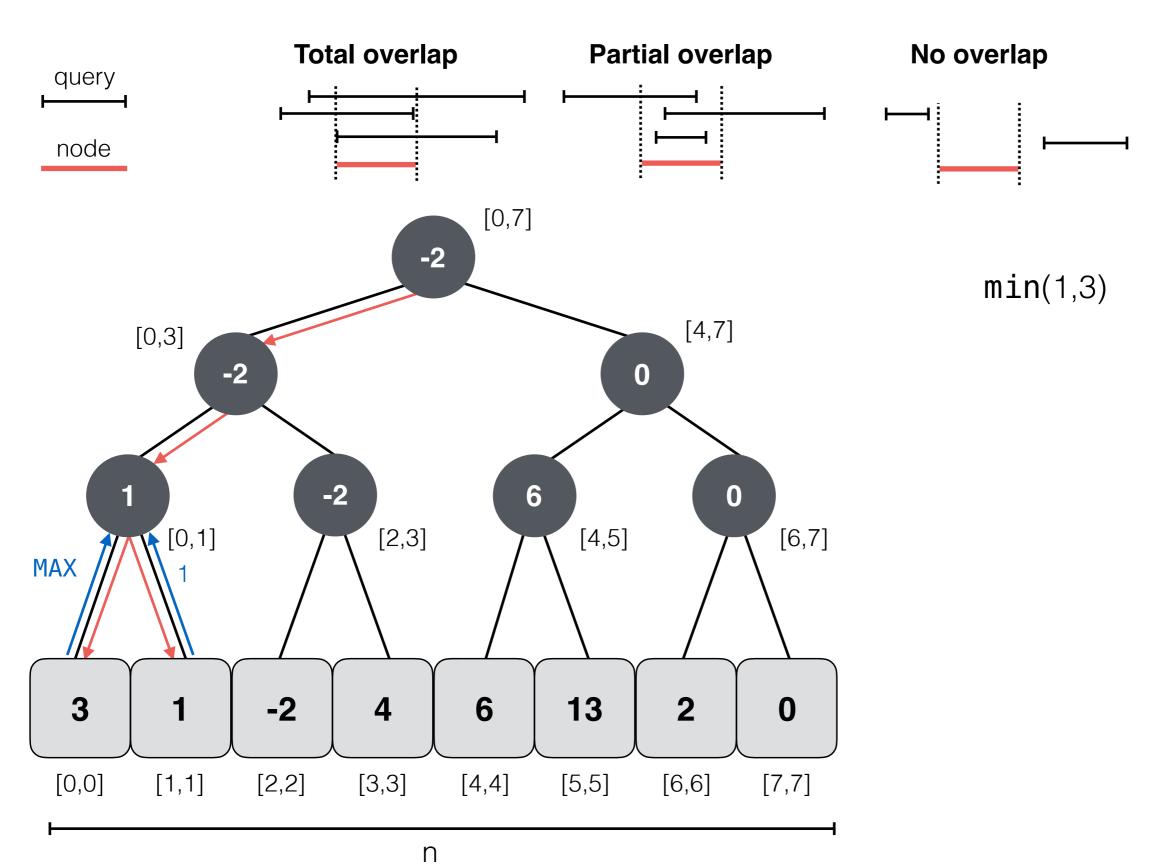


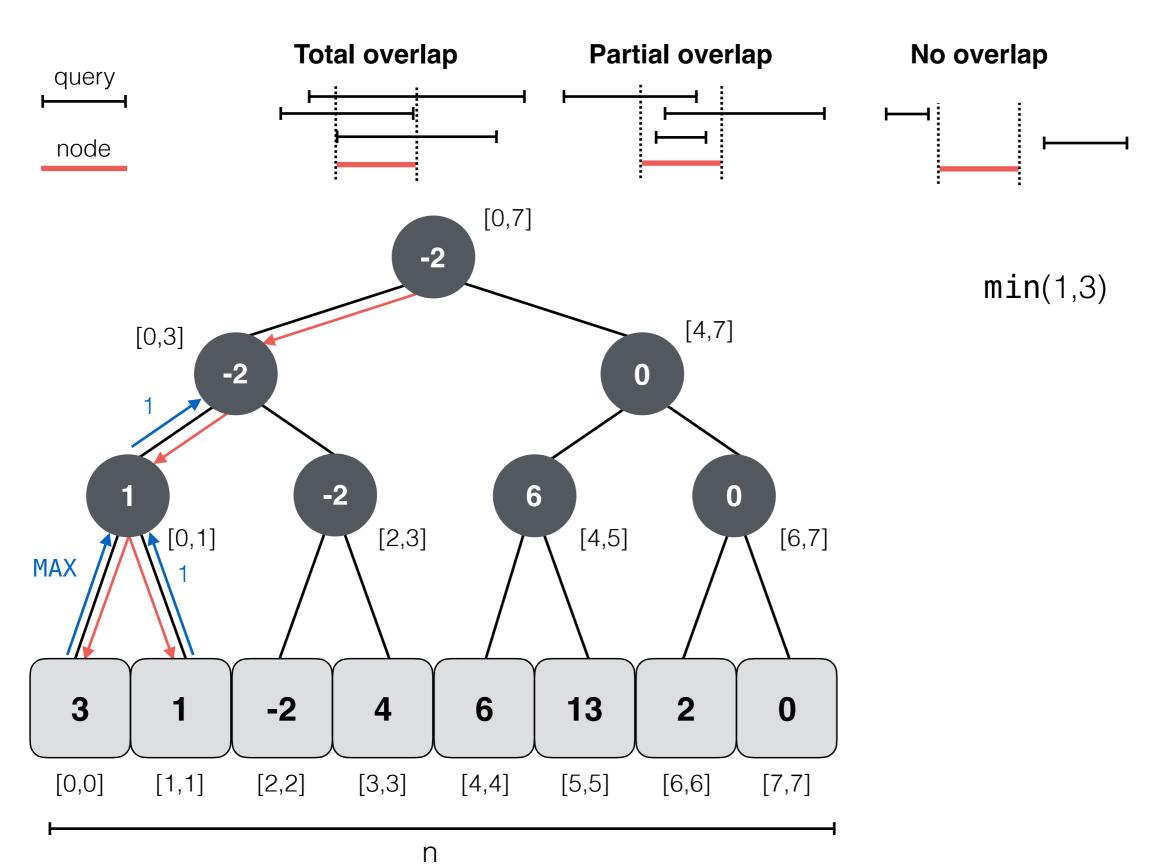


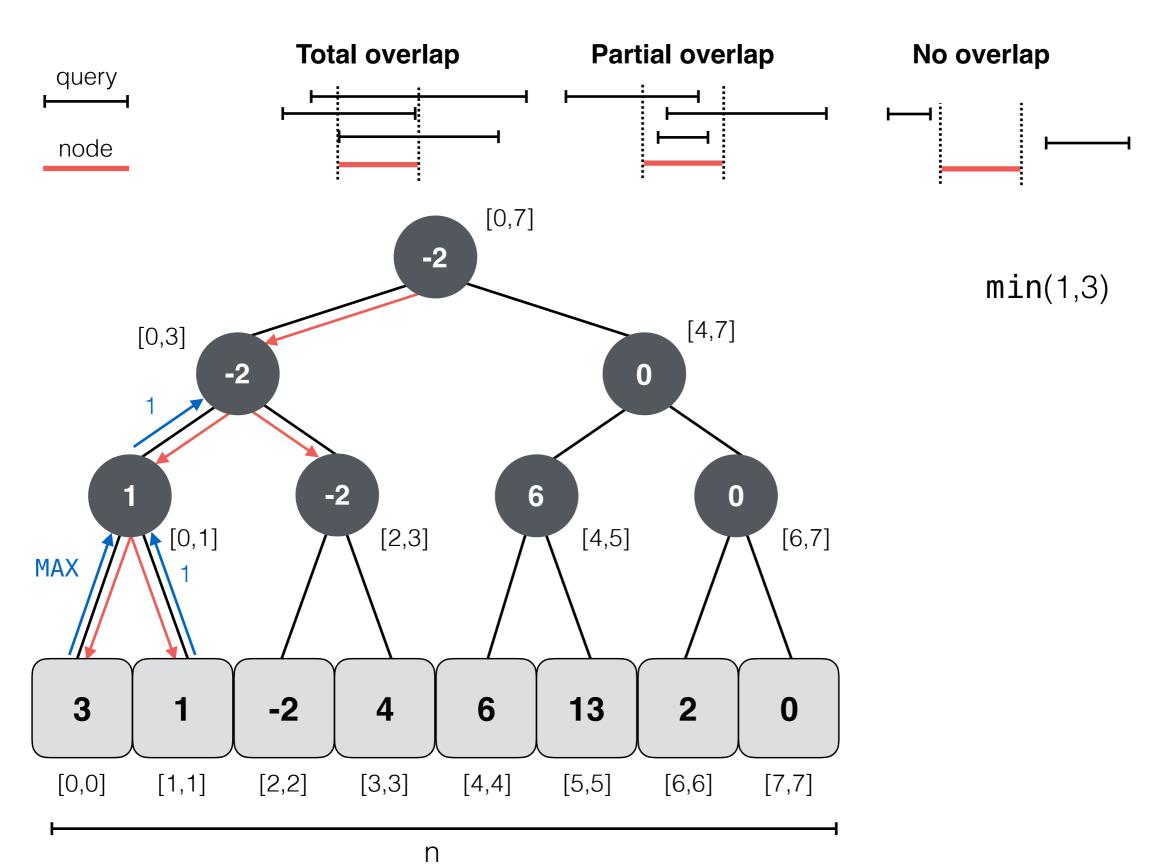


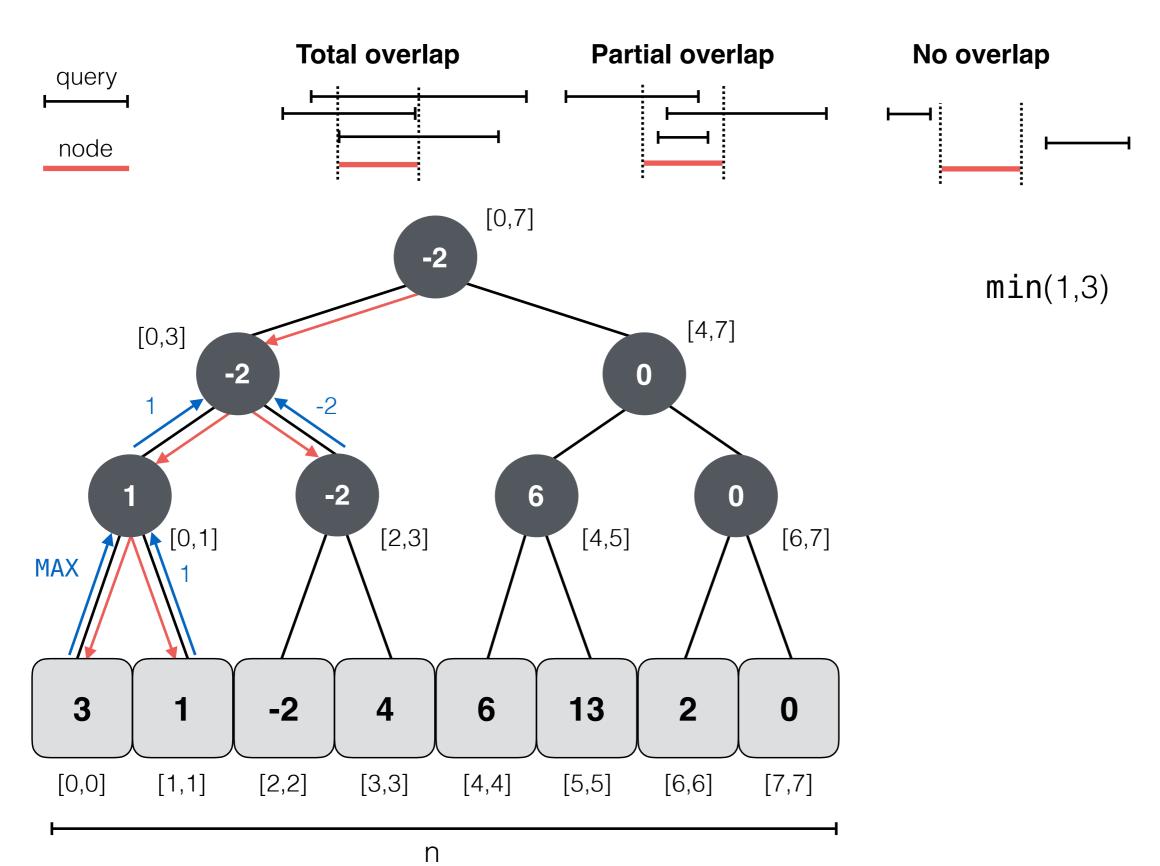


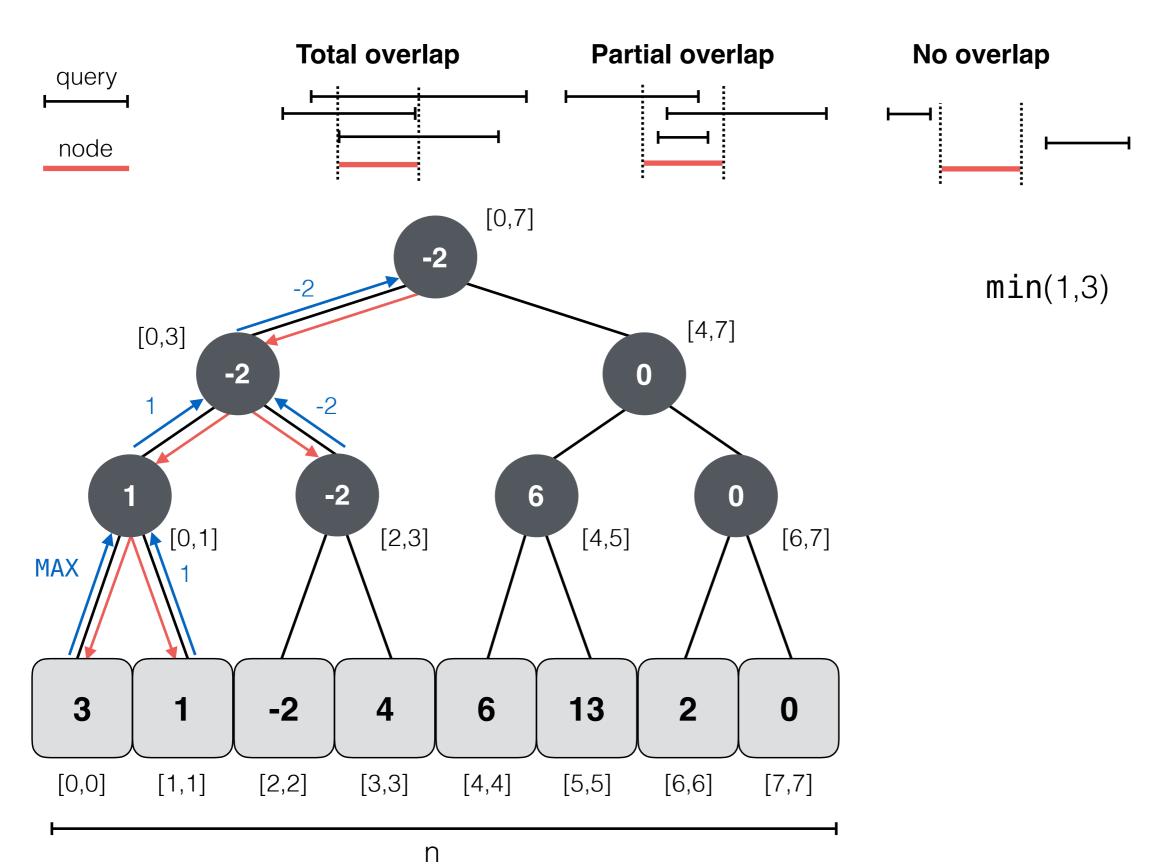


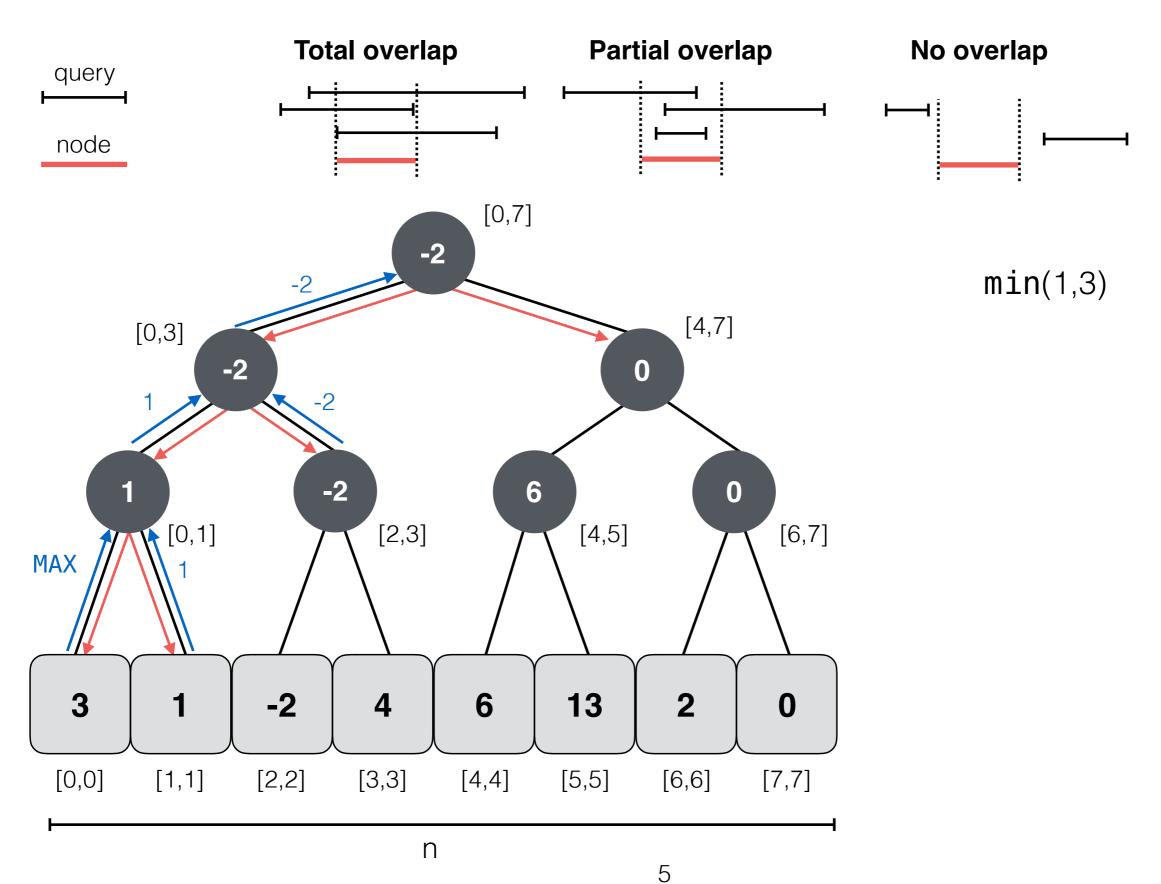


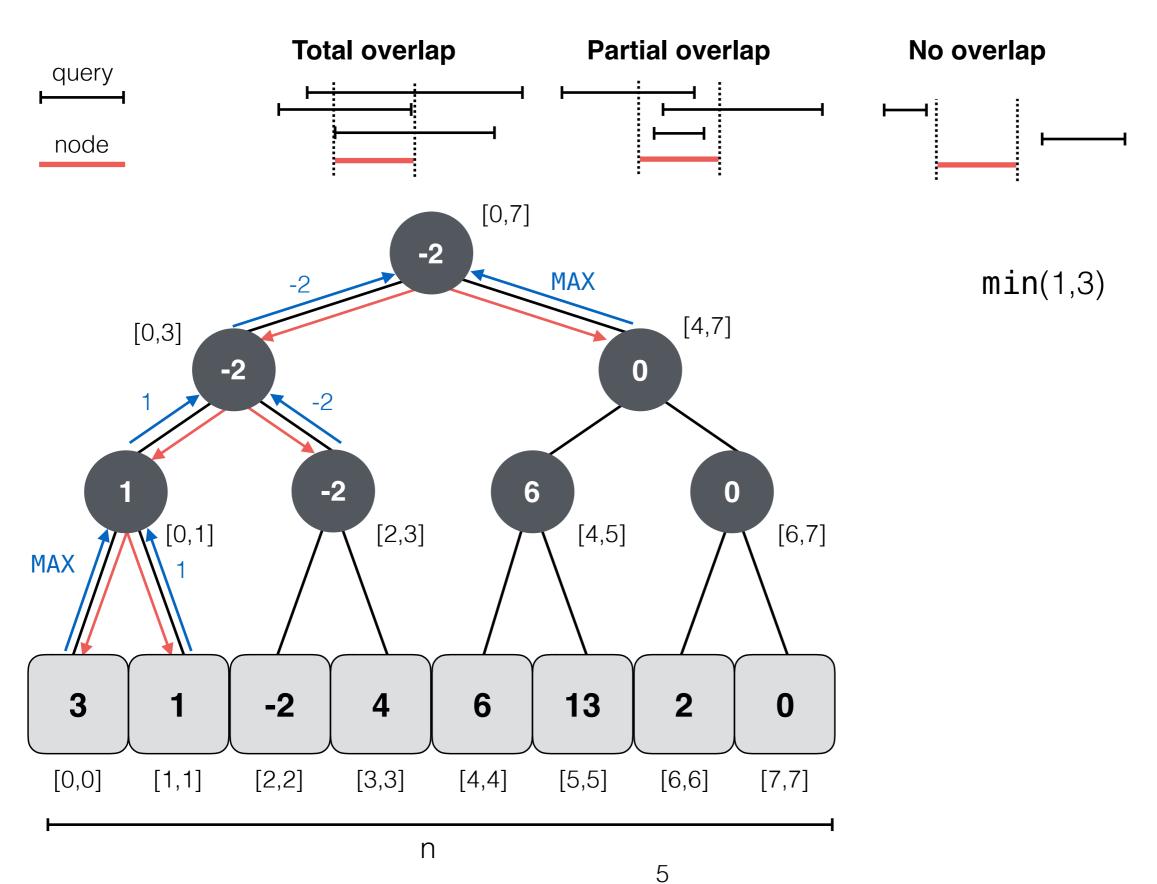


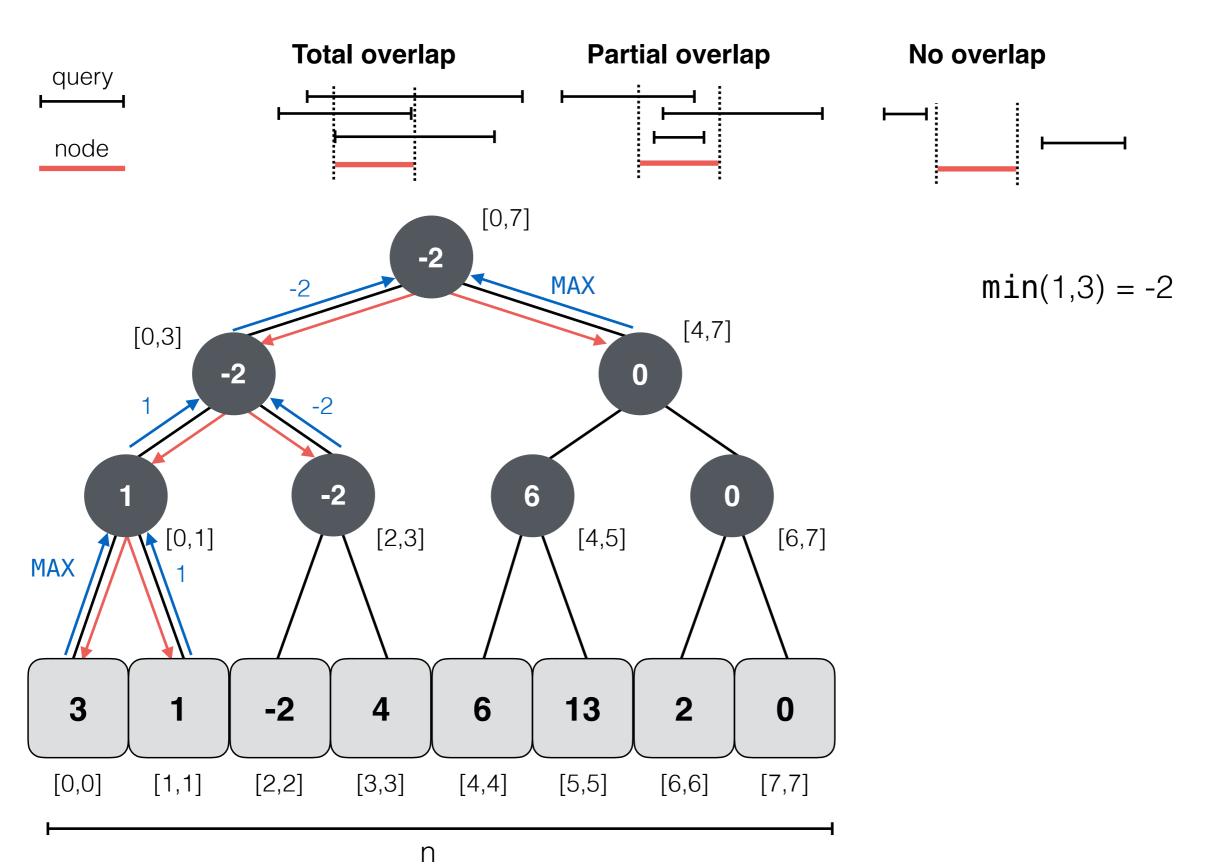


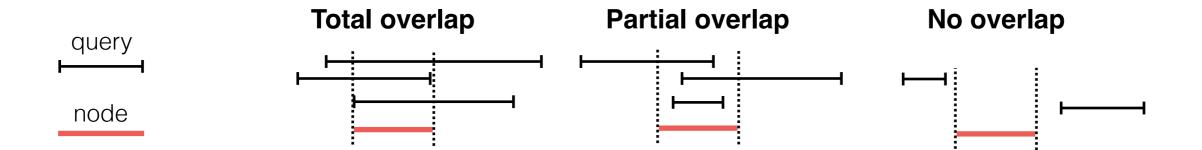






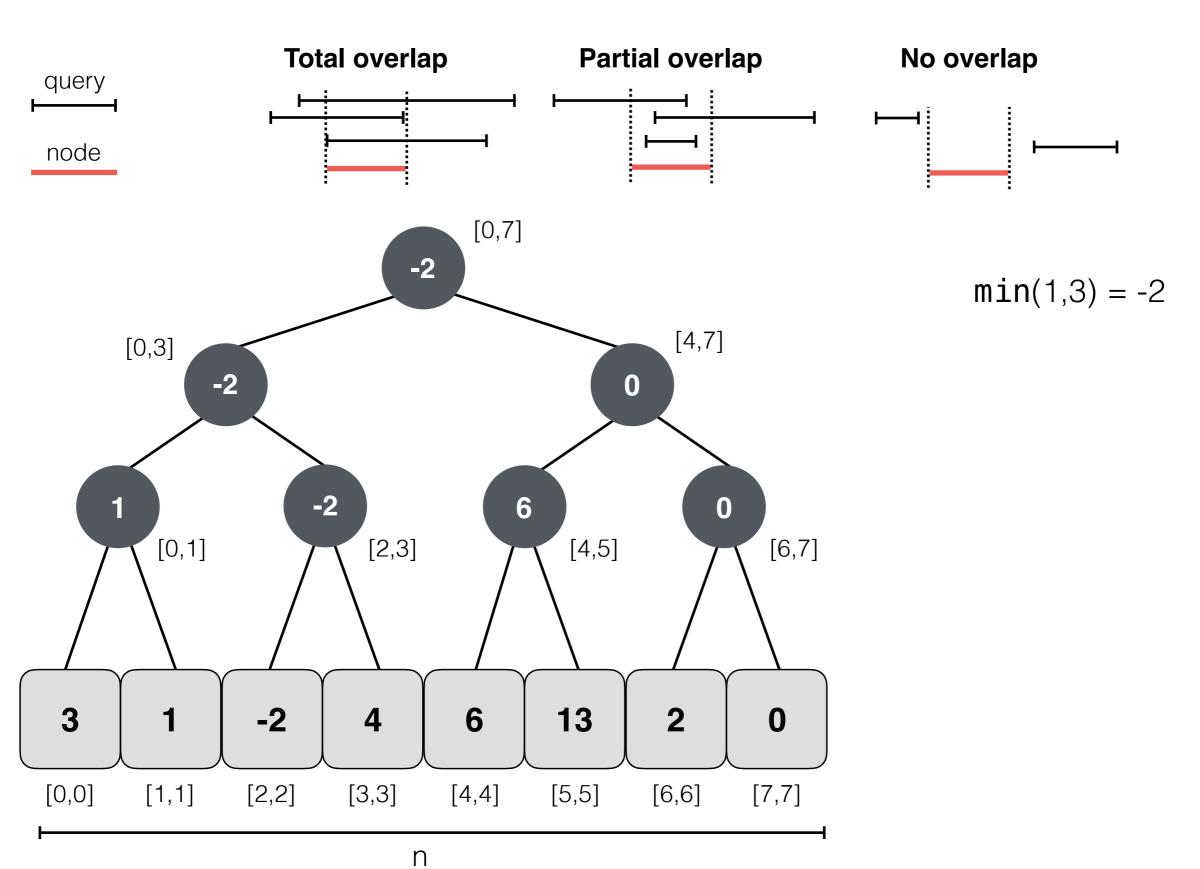


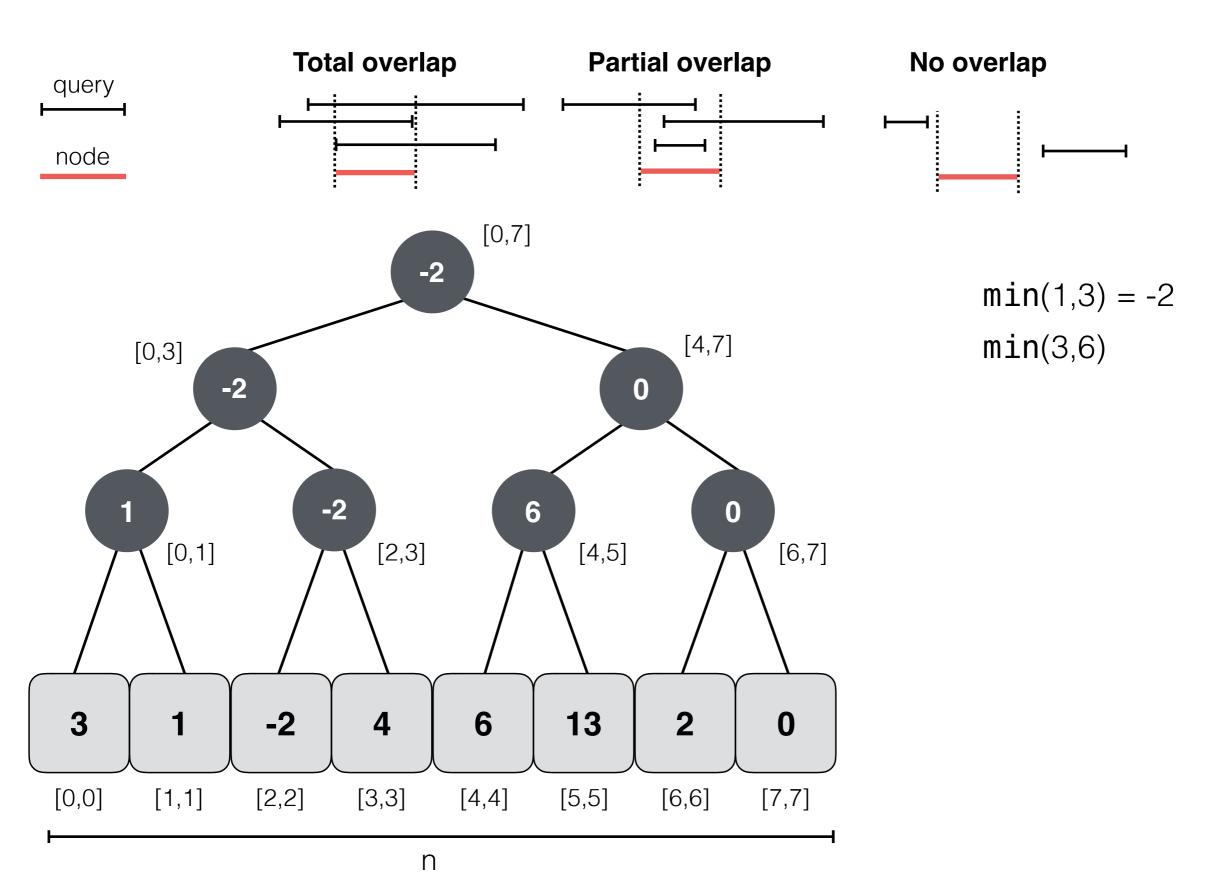


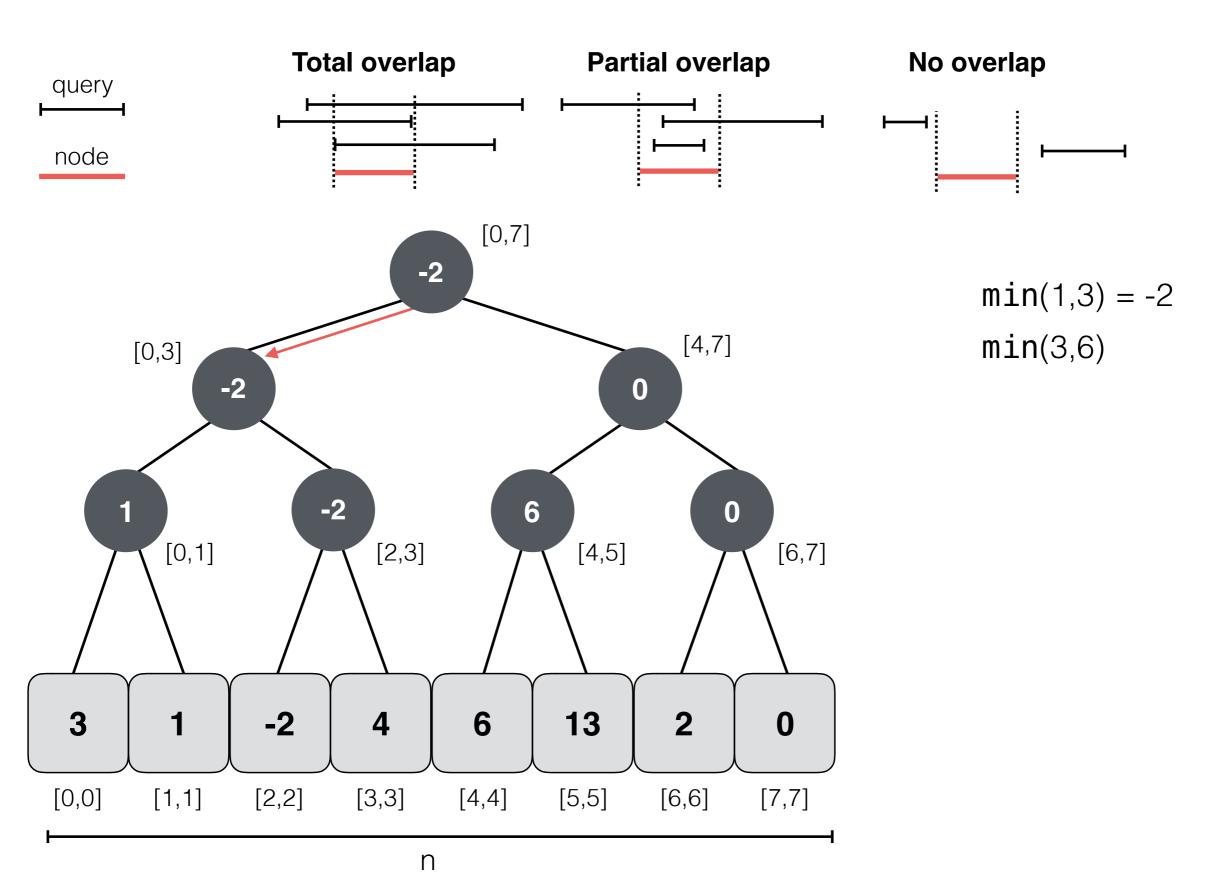


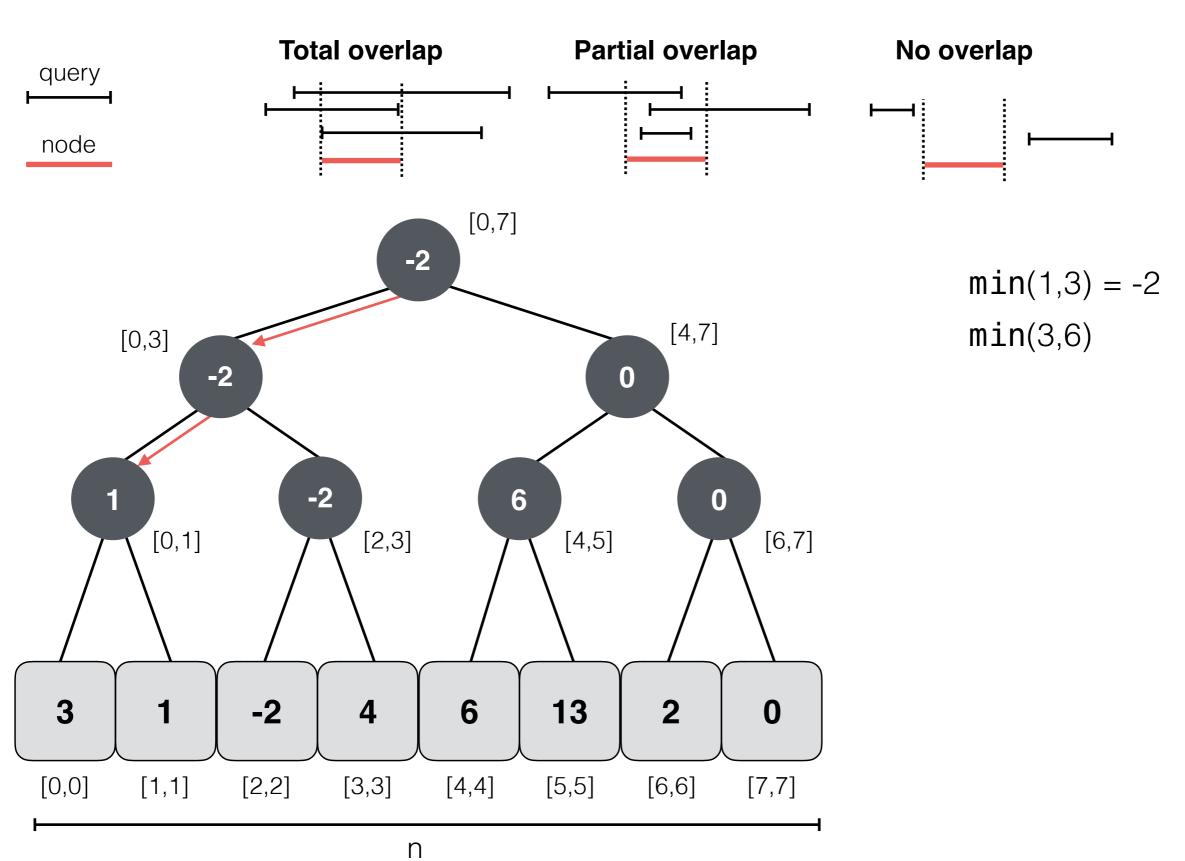
$$min(1,3) = -2$$

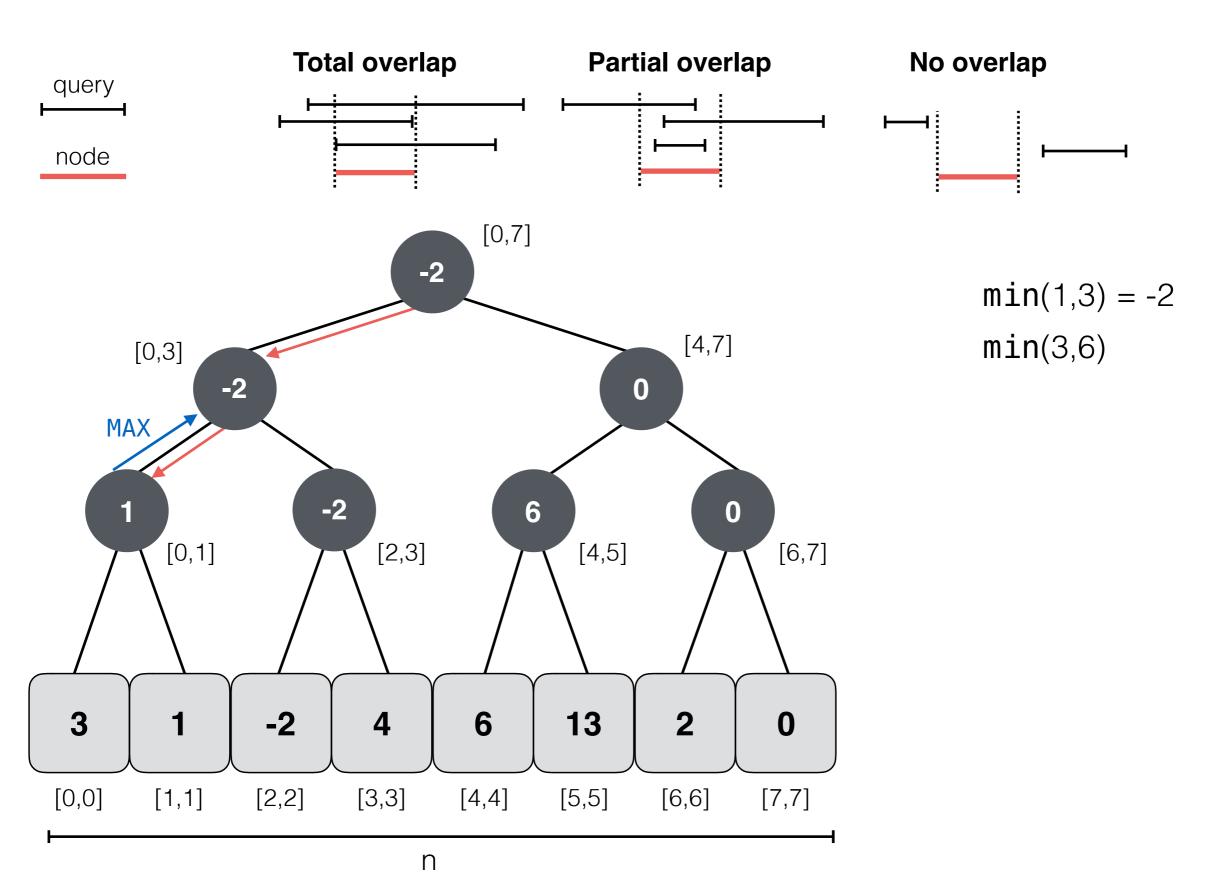
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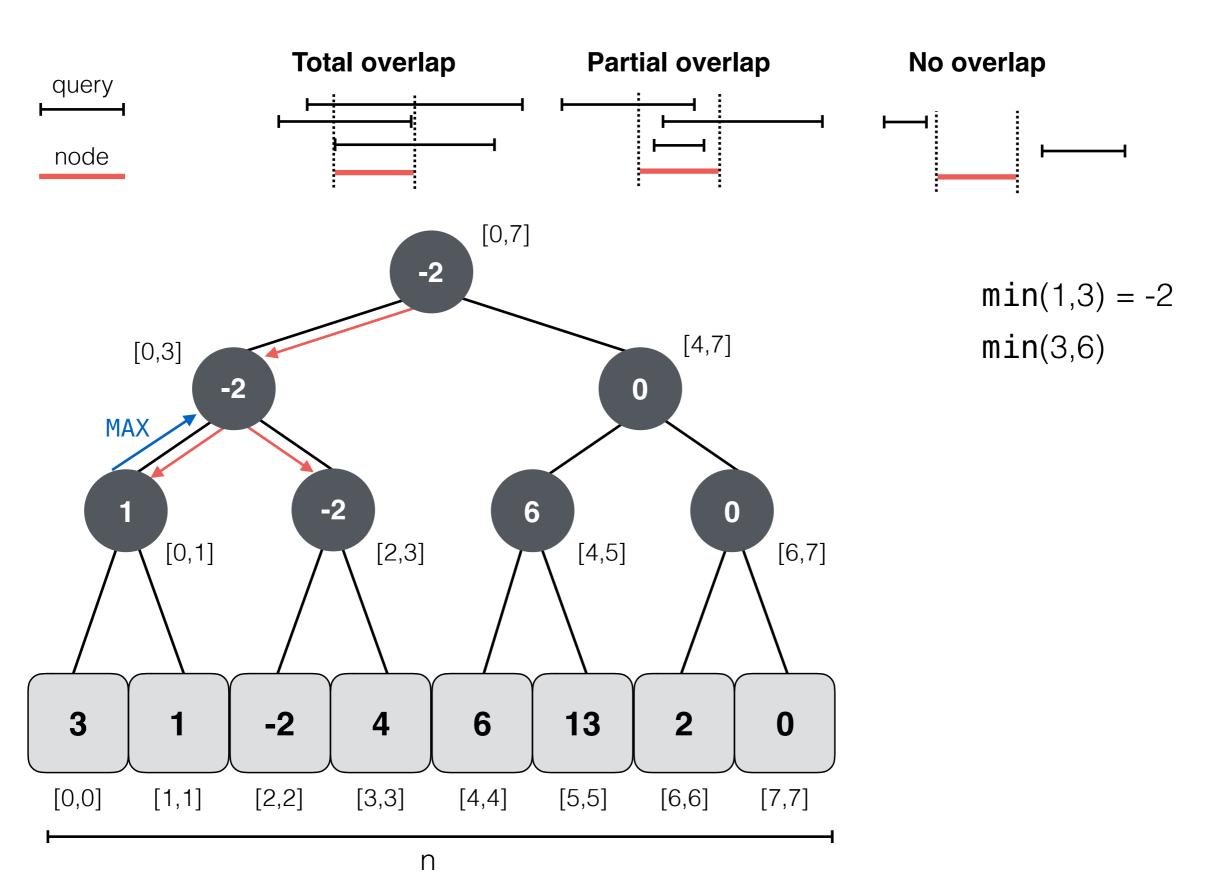


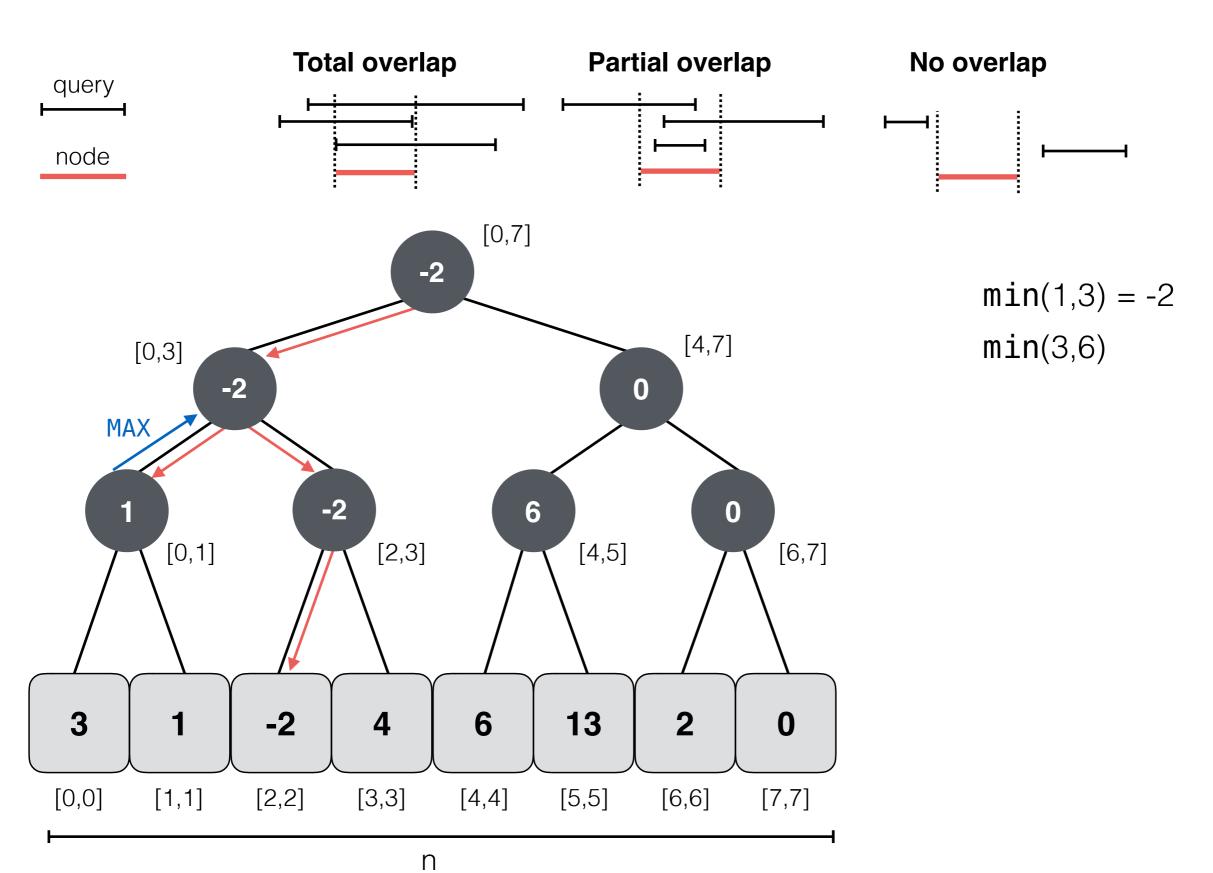


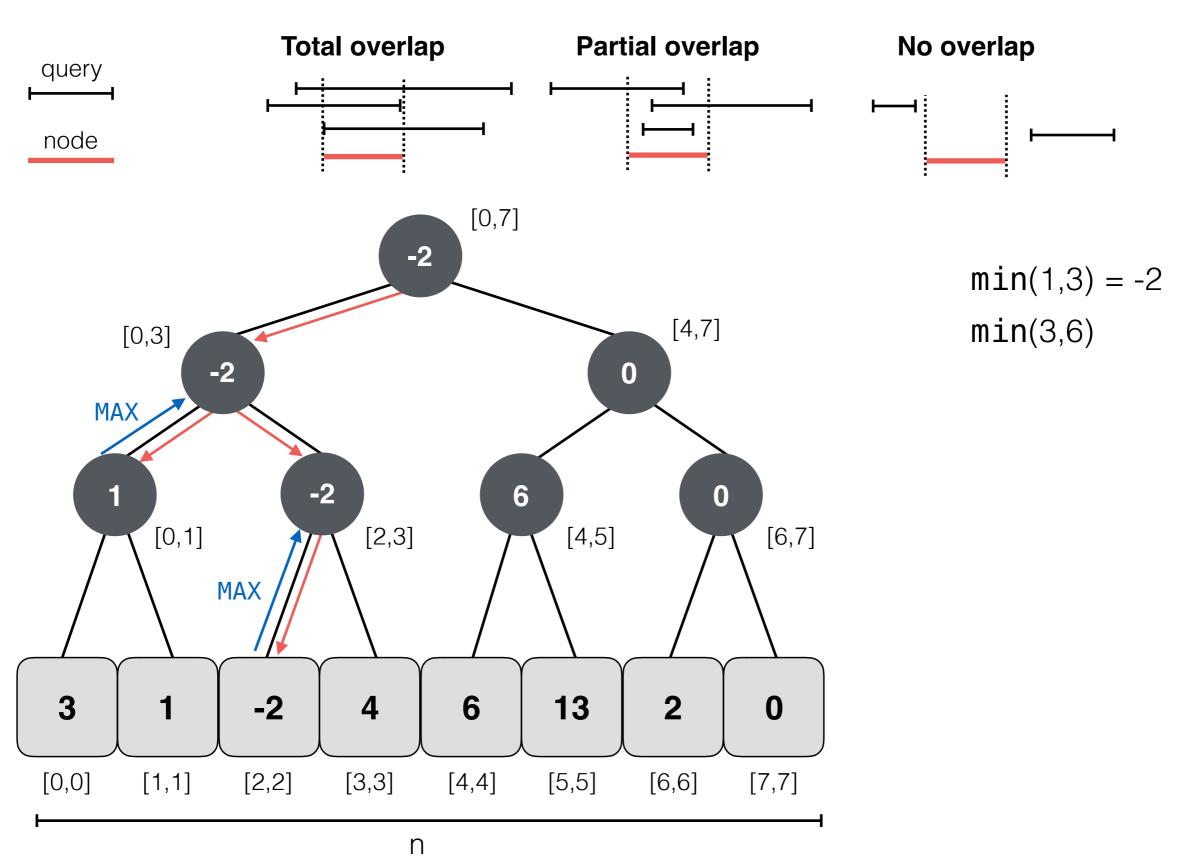


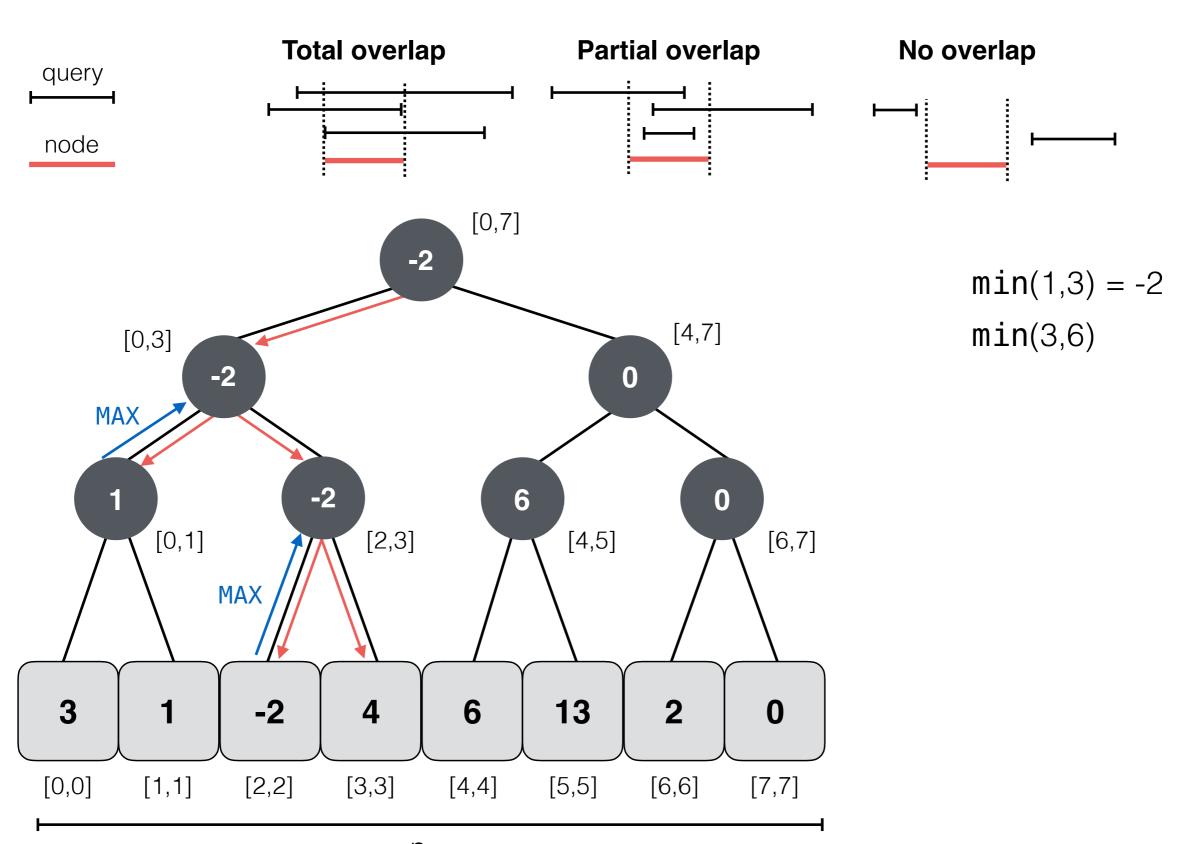


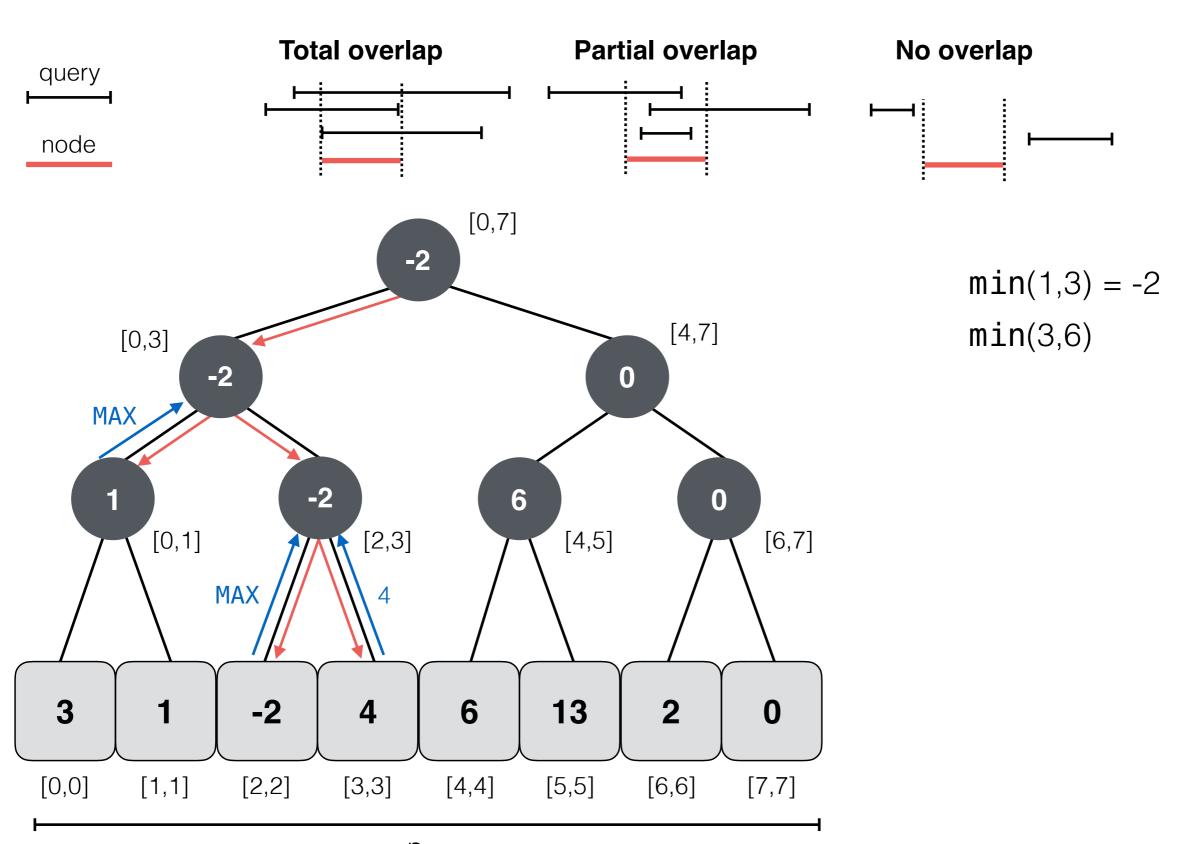


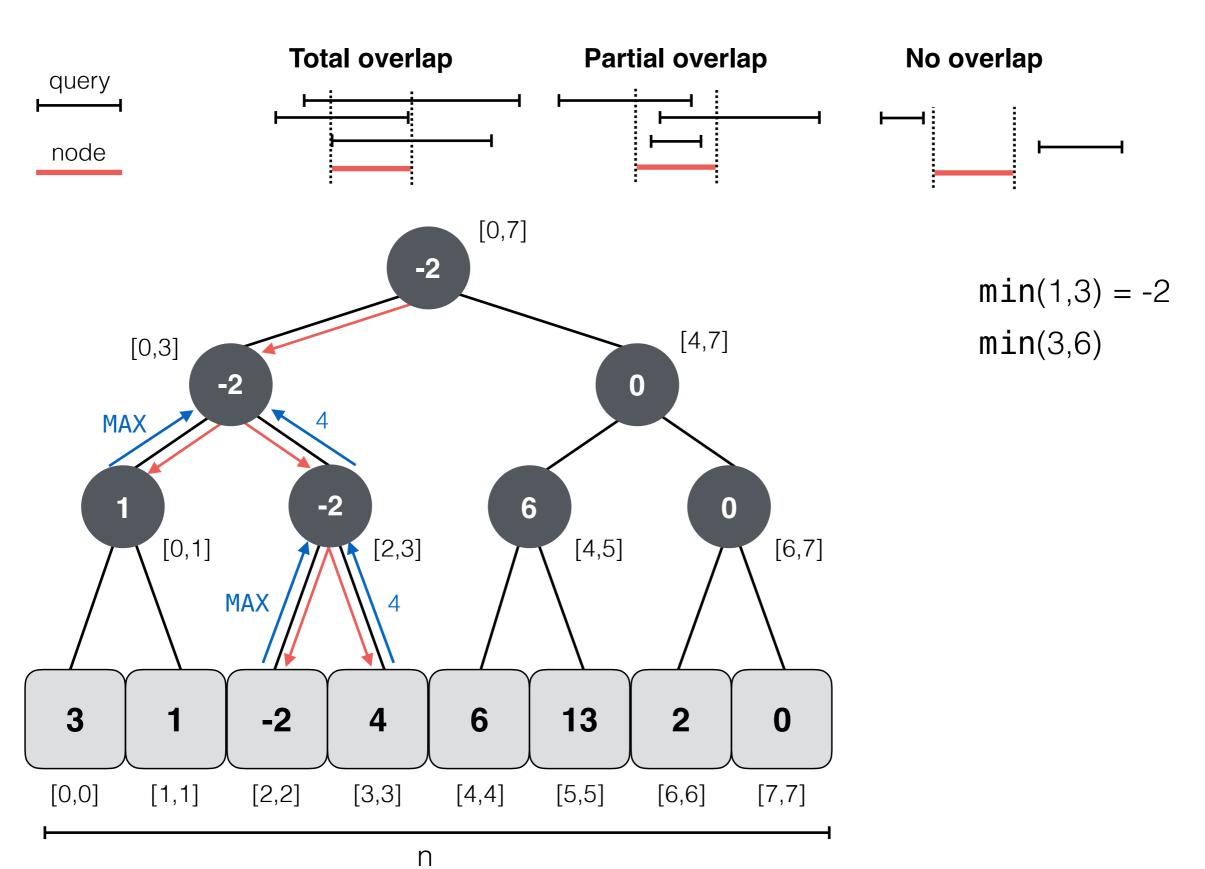


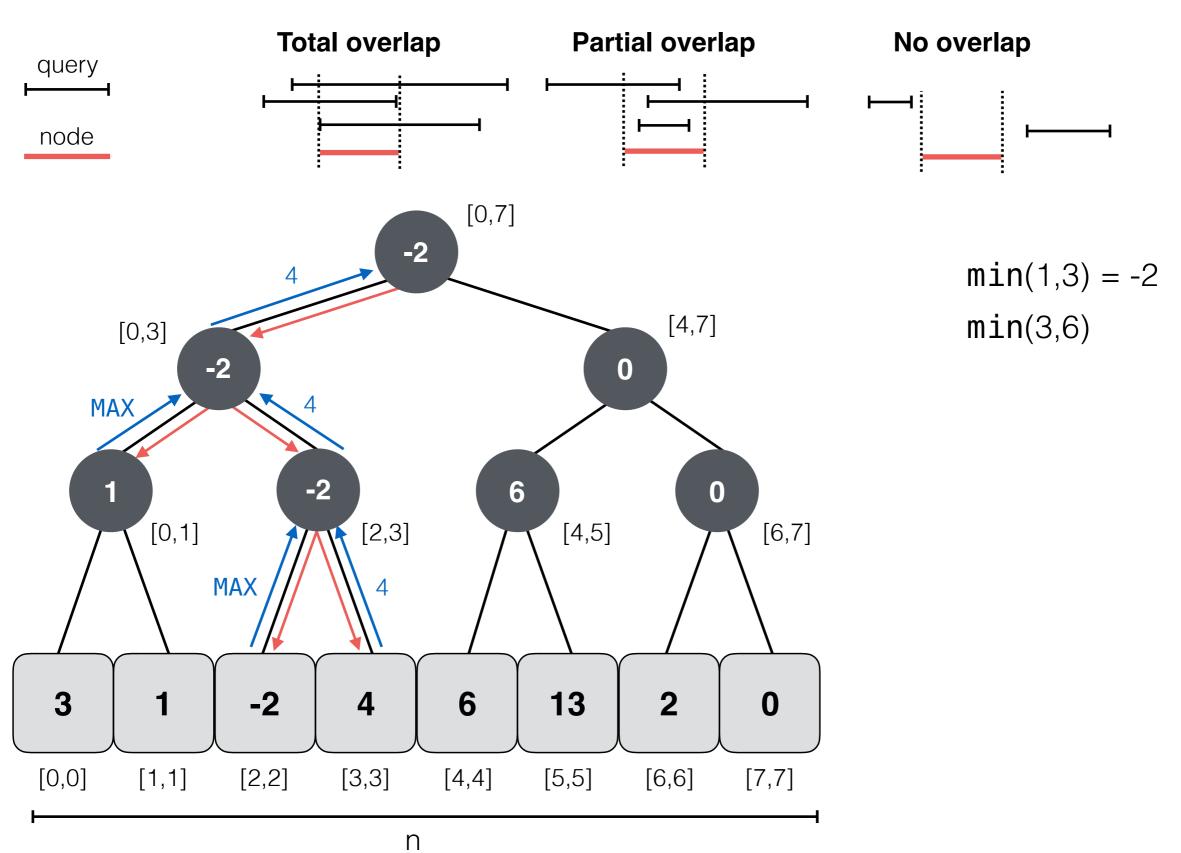


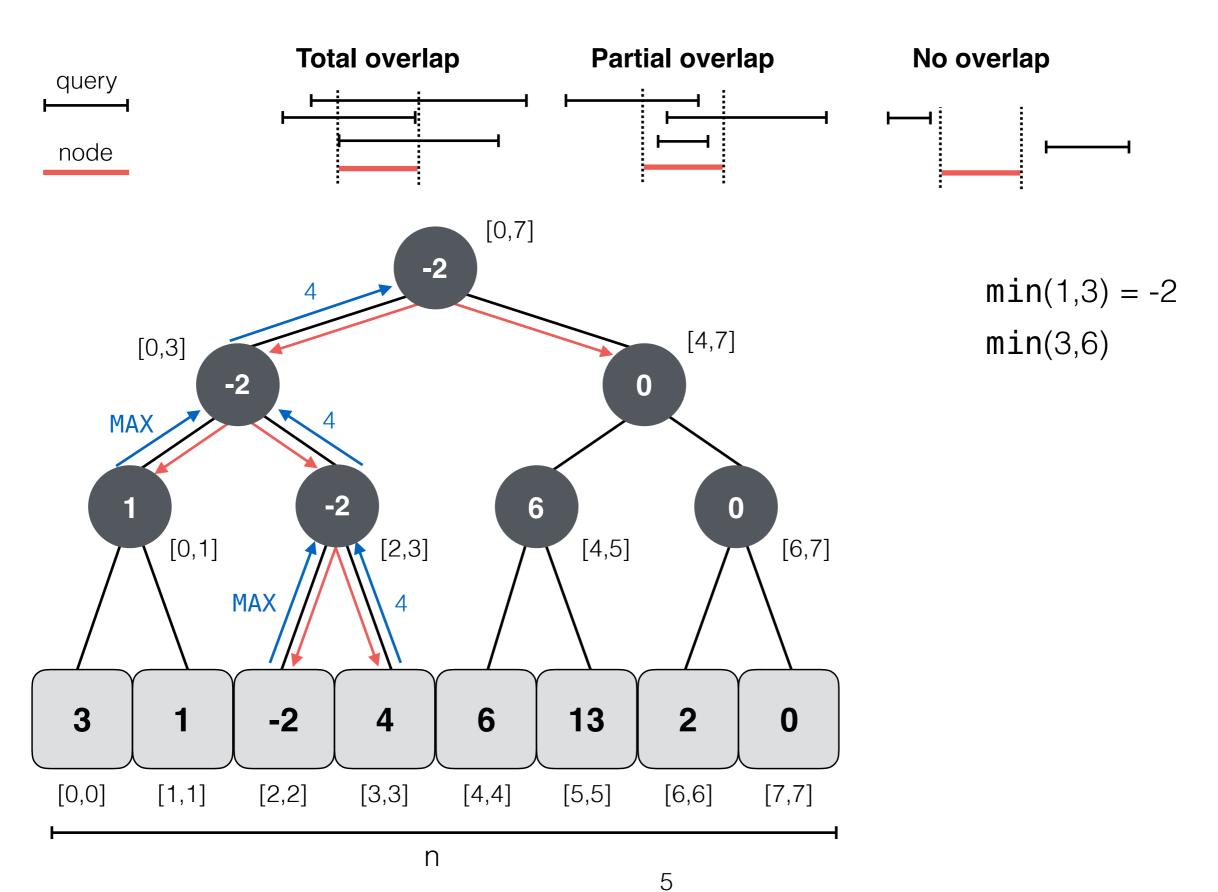


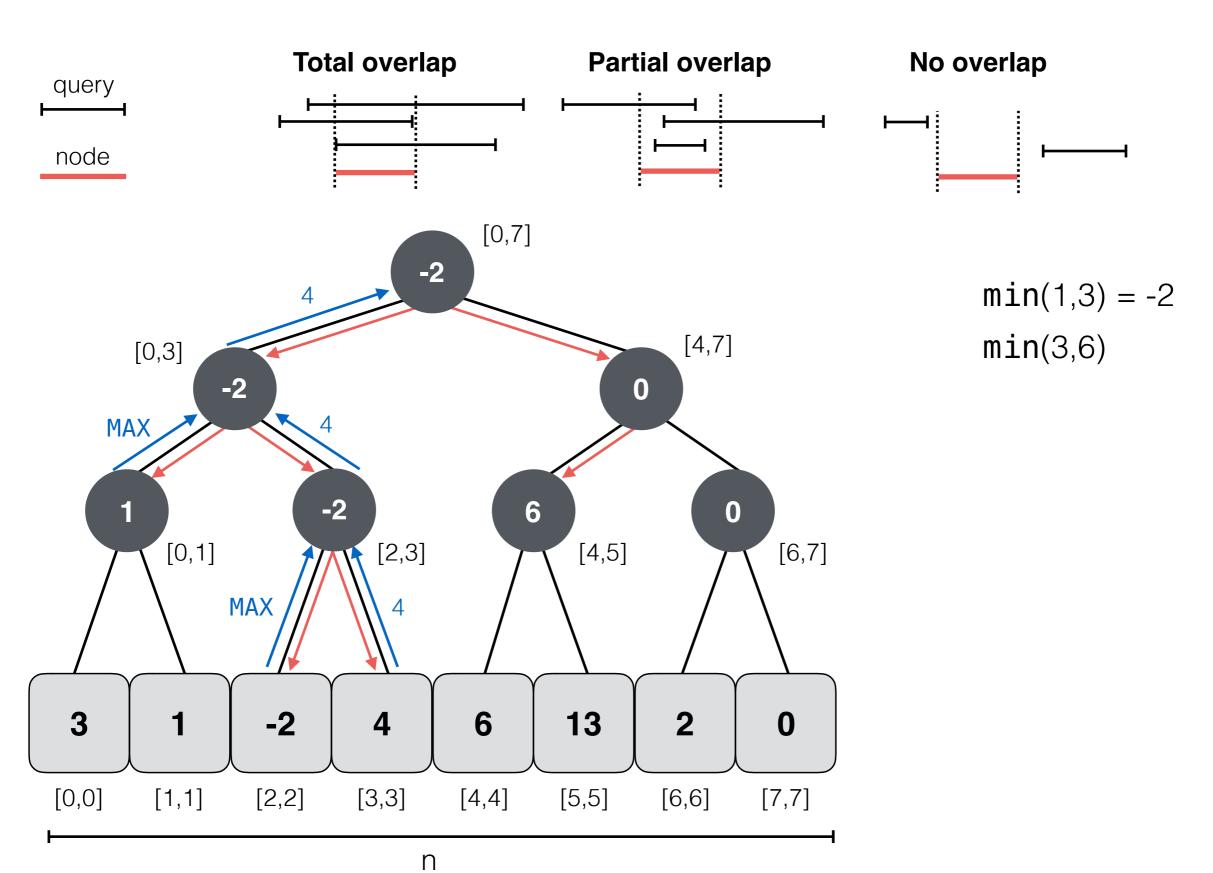


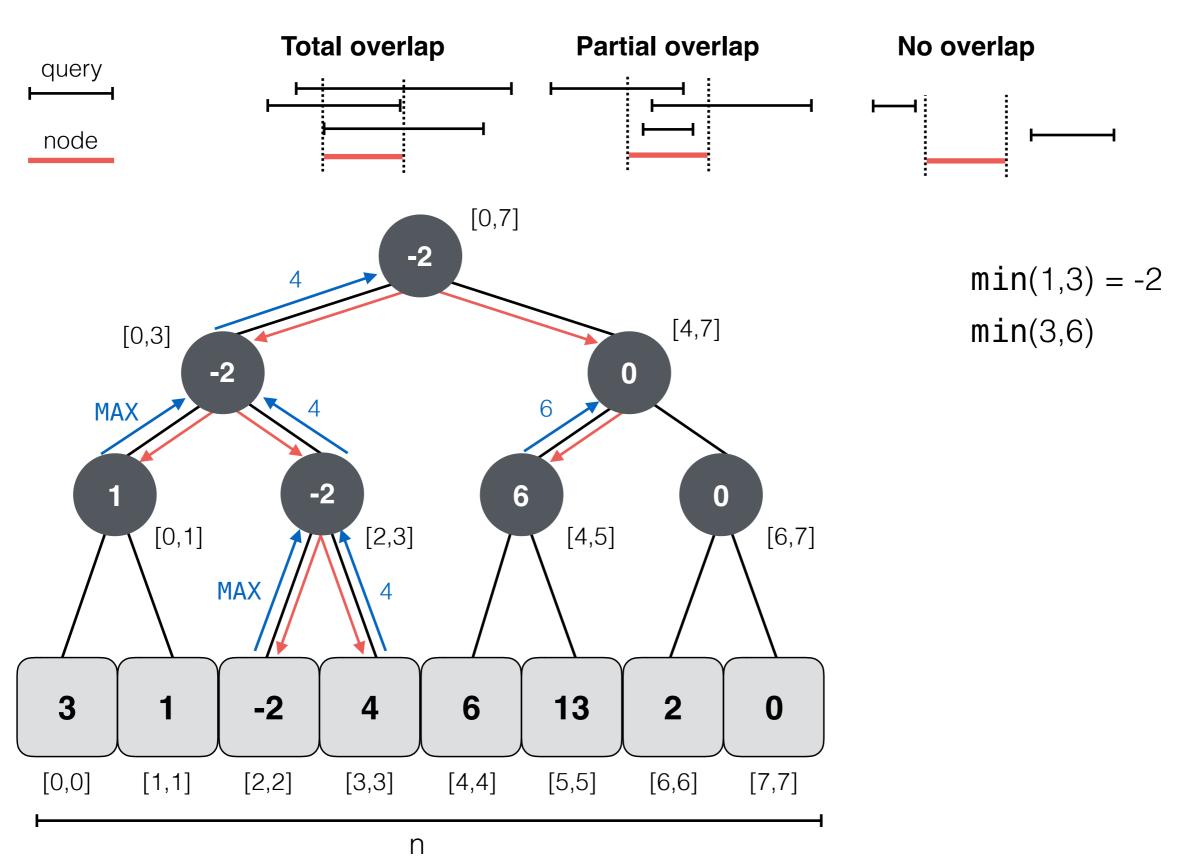


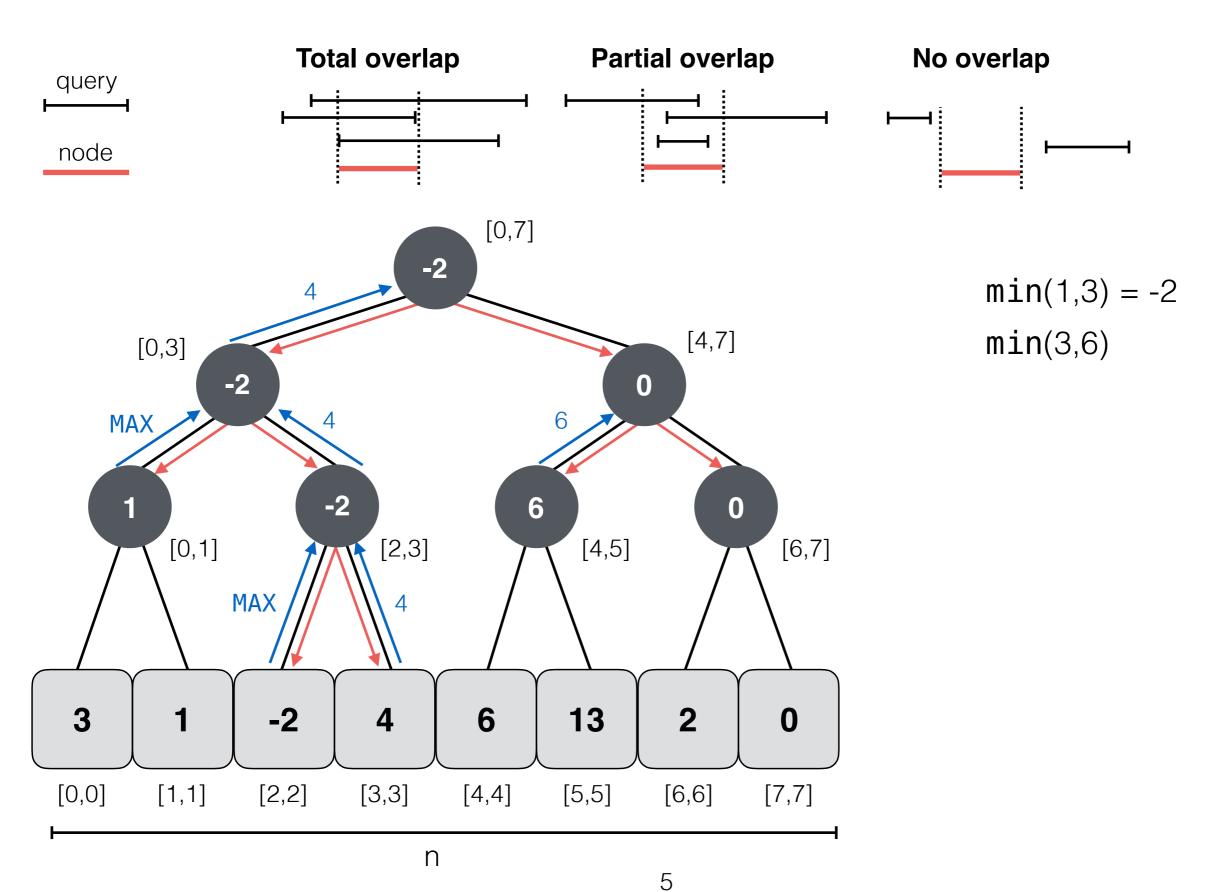


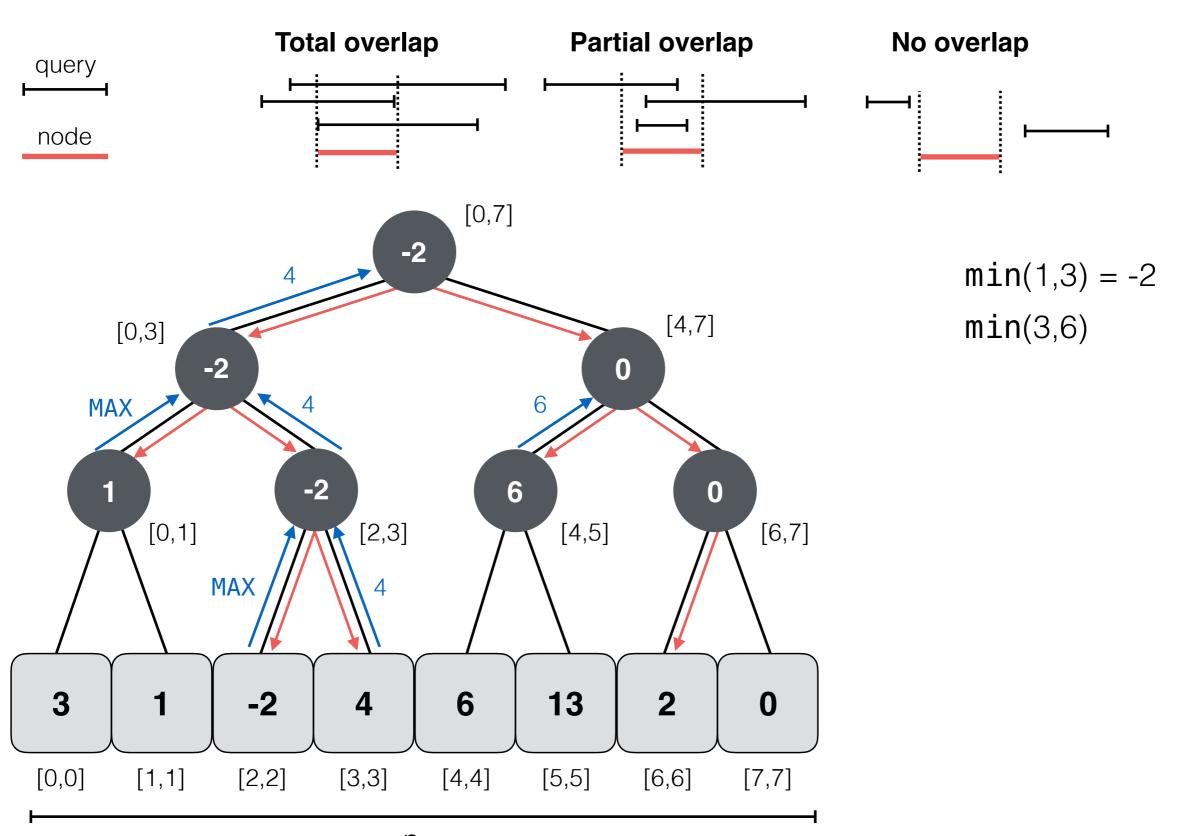


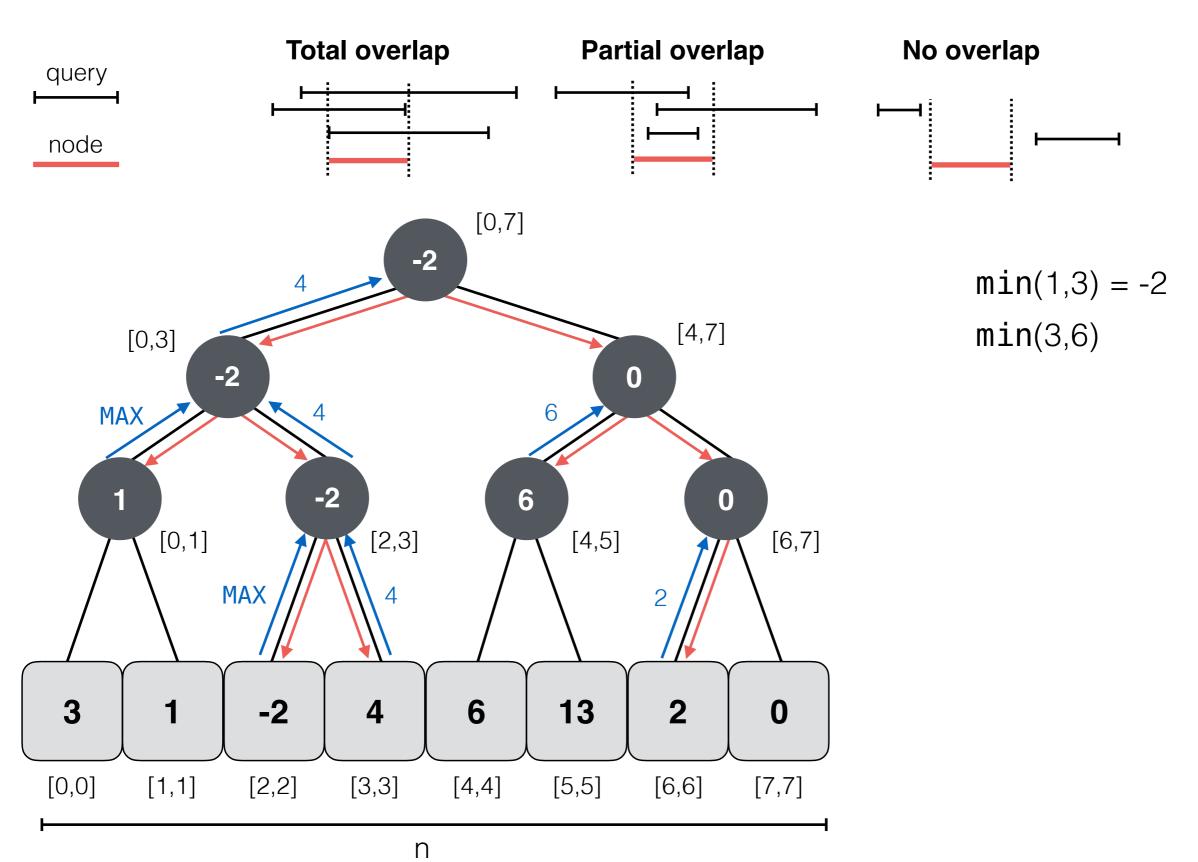


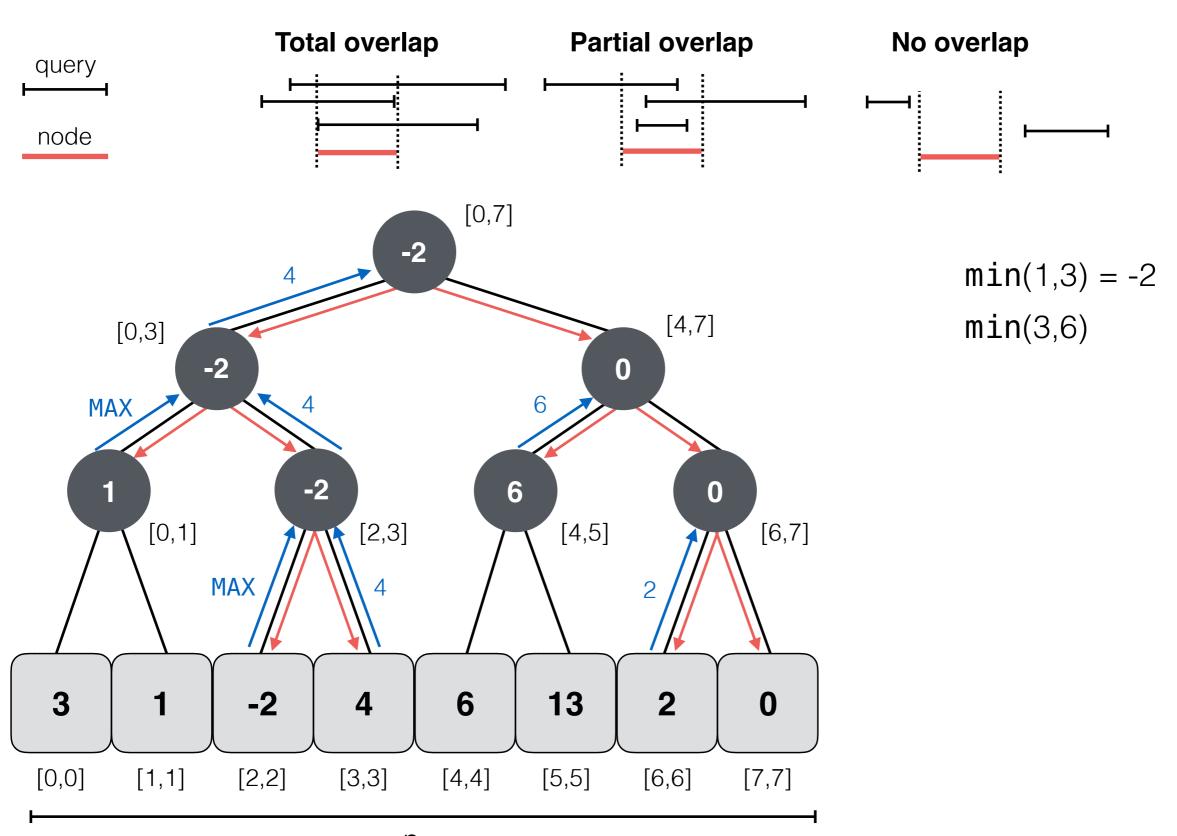


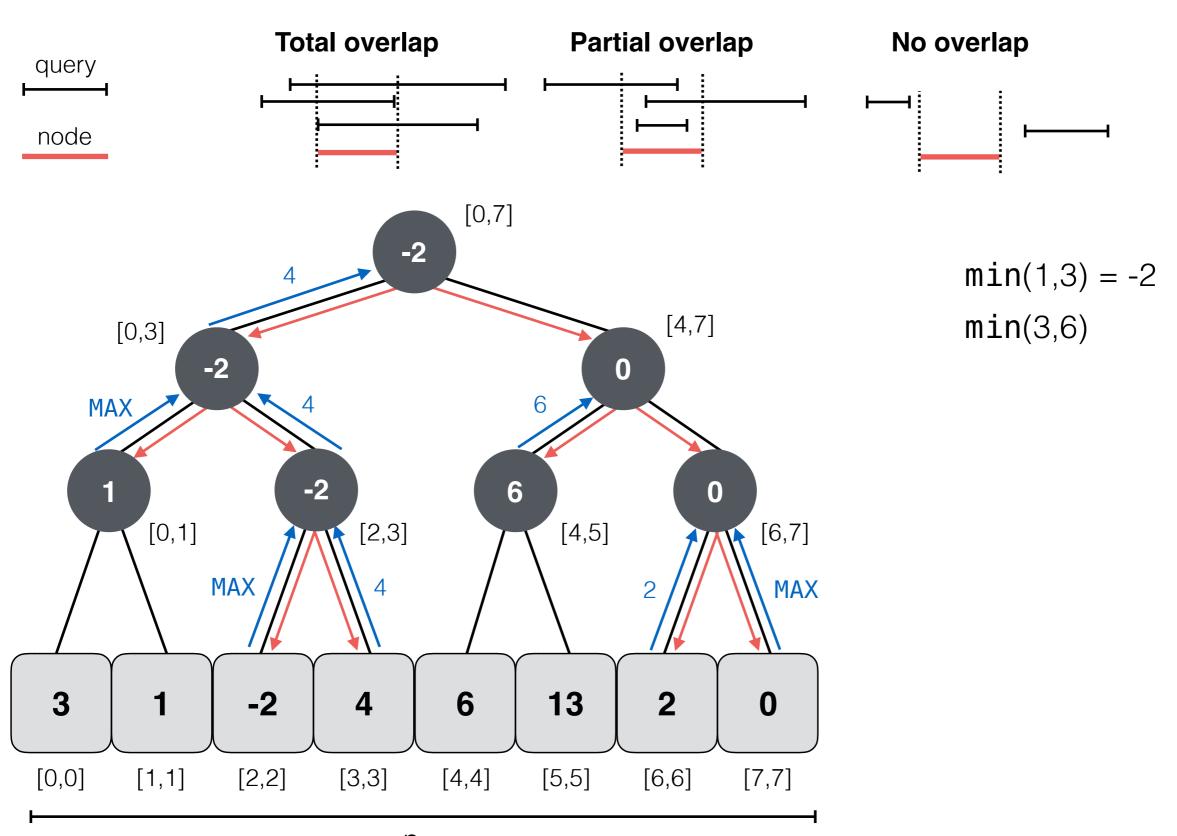


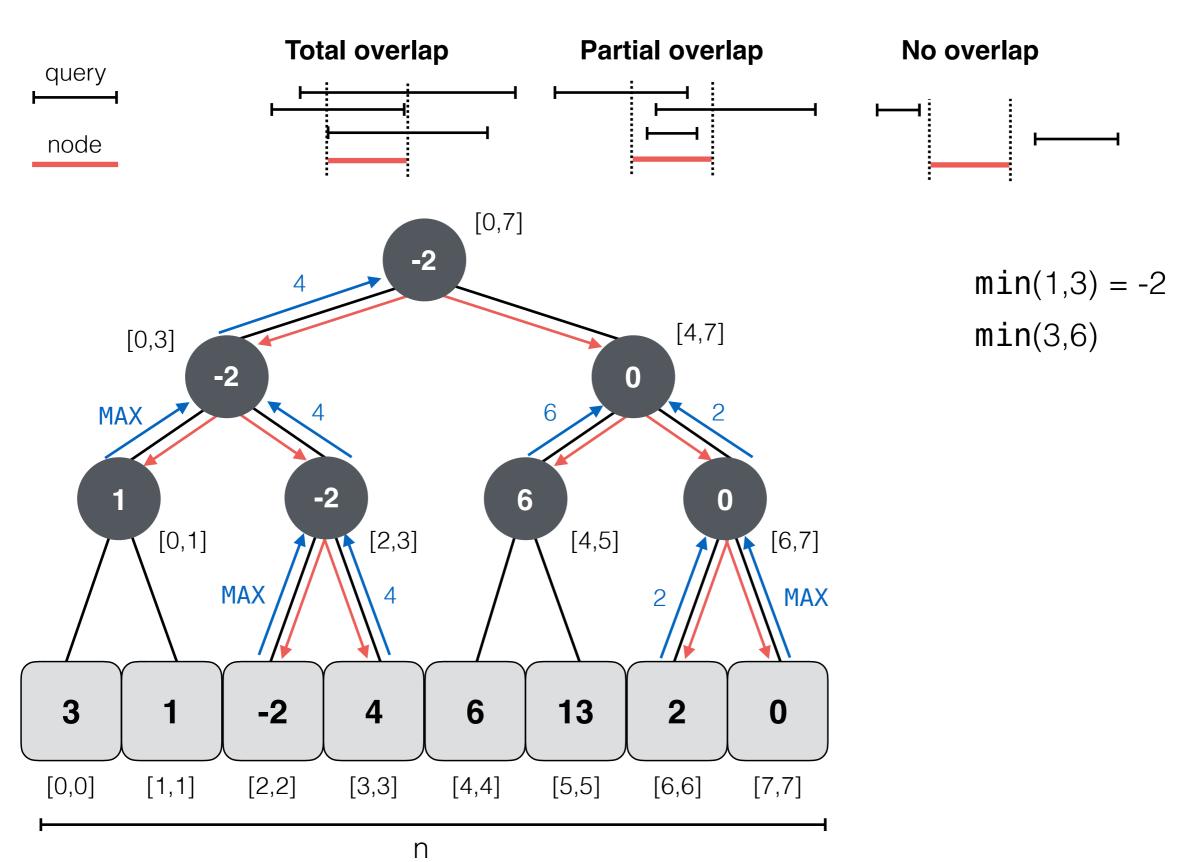


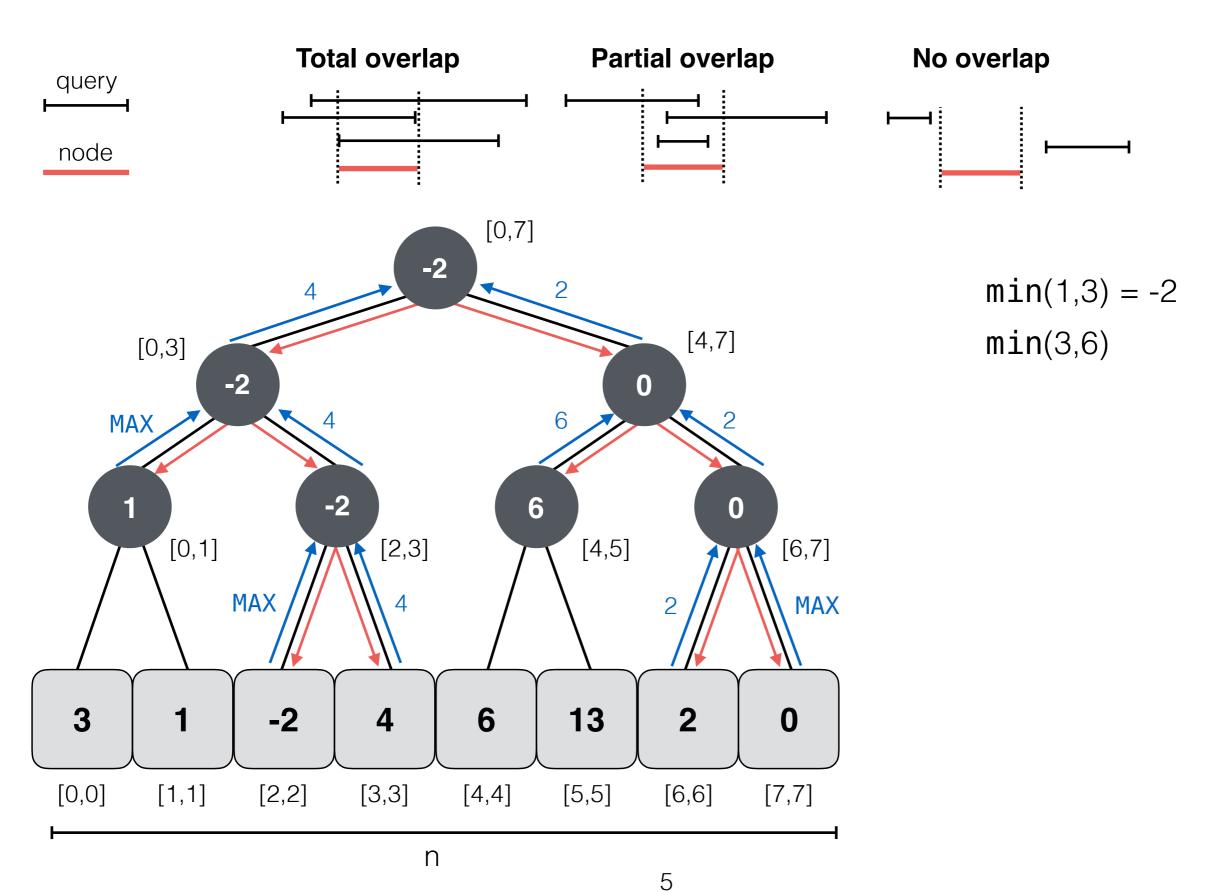


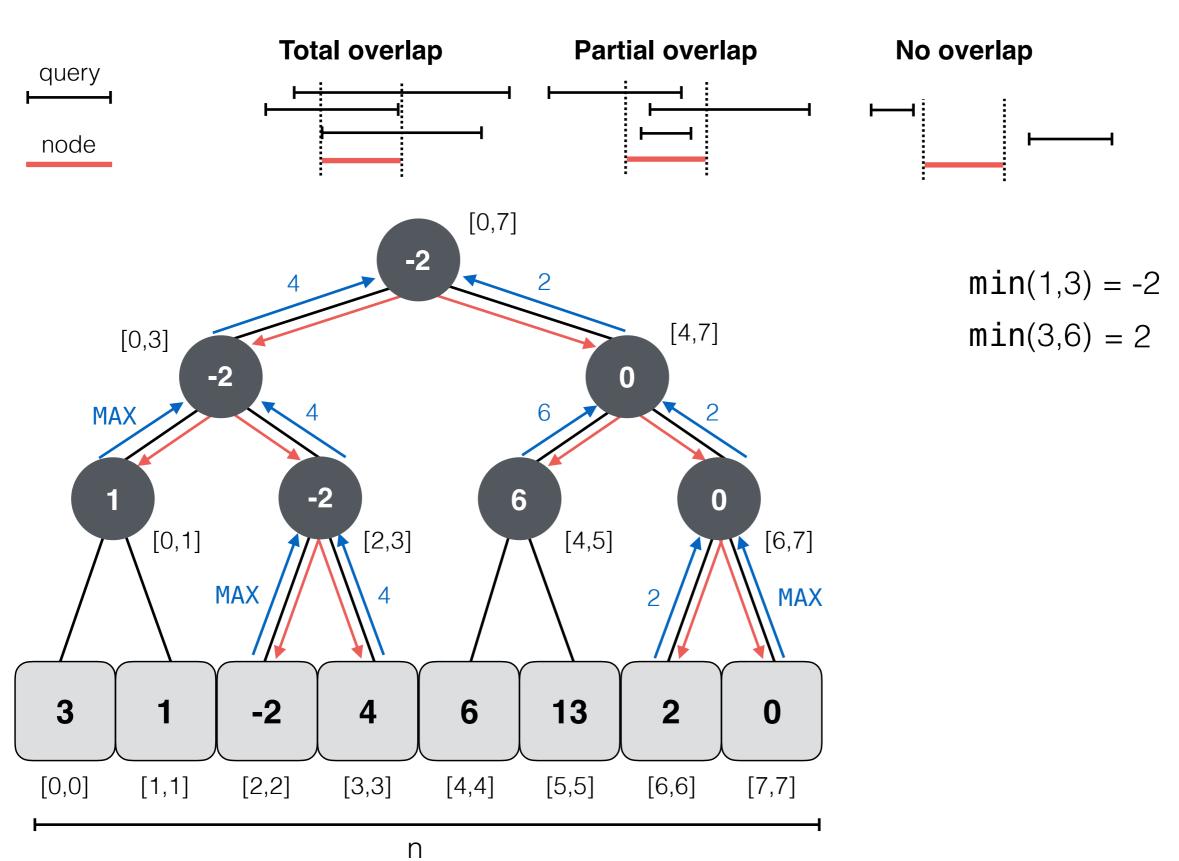


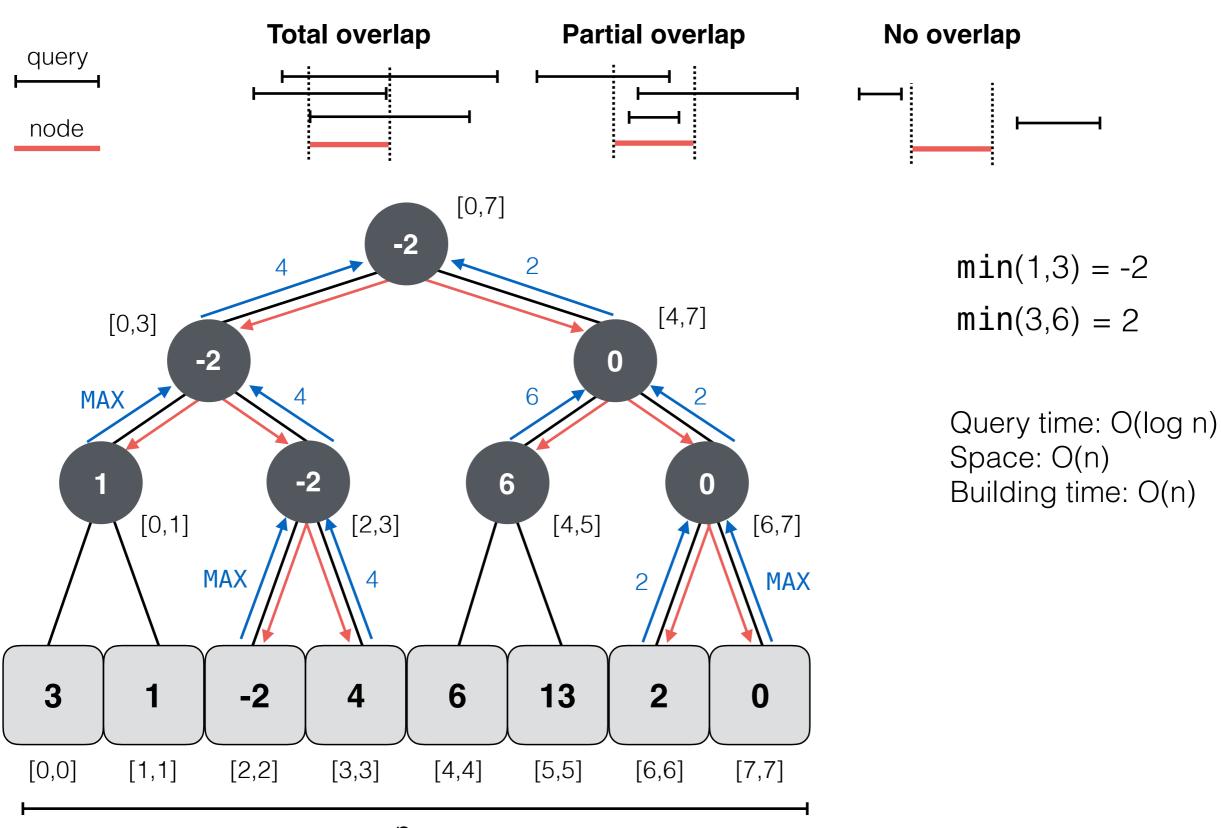


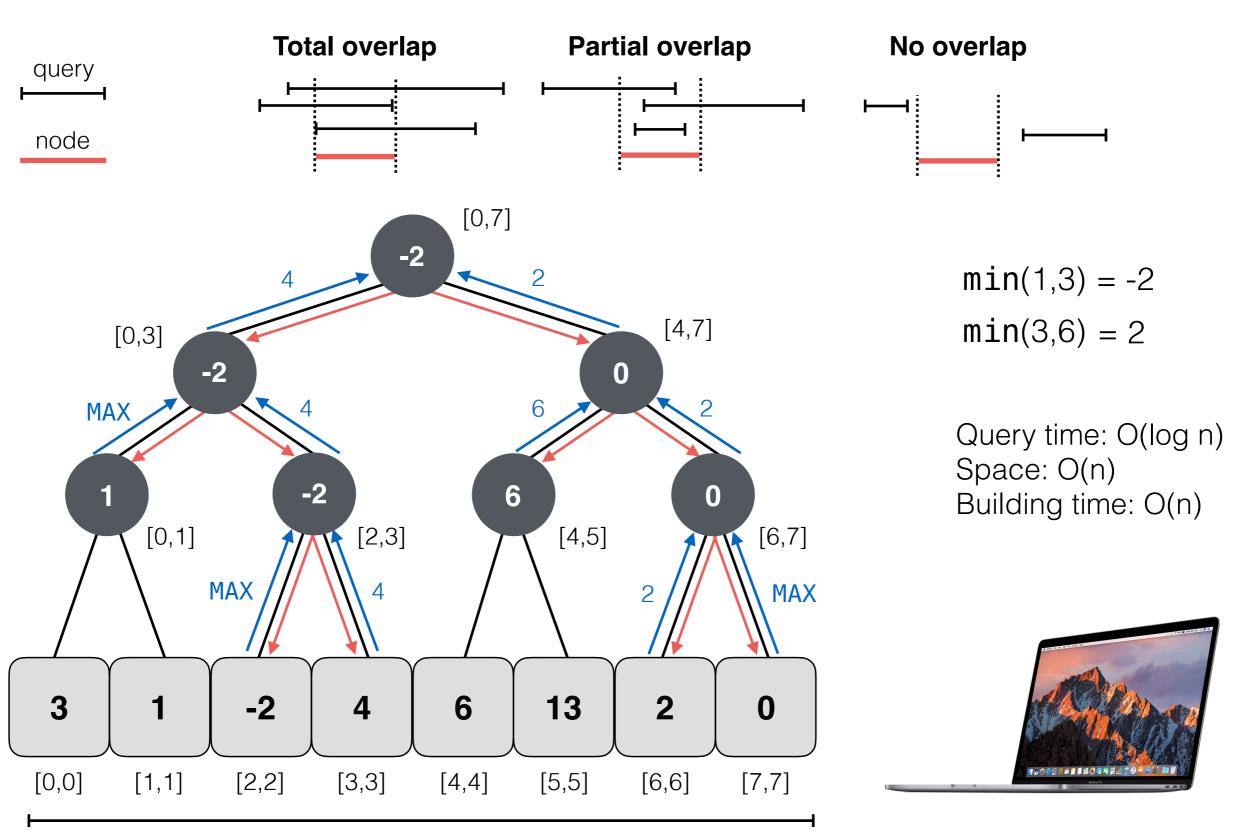








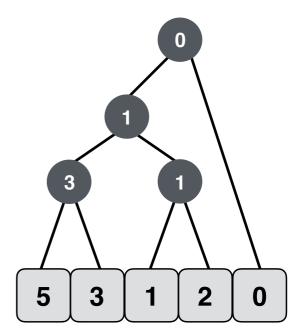




#### How do we represent trees?

```
node* root = nullptr;
std::deque<node*> q;
int n = 0;
std::cin >> n;
for (int i = 0; i < n; ++i) {
    int x = 0:
    std::cin >> x;
    node* n = new node(x);
    q.push_back(n);
}
node* last = nullptr;
if (n % 2) {
    last = q.back();
    q.pop_back();
}
auto min_parent = [&](node* left, node* right) {
    int min = std::min<int>(left->key, right->key);
    node* parent = new node(min, left, right);
    q.push back(parent);
};
while (q.size() != 1) {
    min_parent(q[0], q[1]);
    q.pop_front();
    q.pop_front();
}
if (last != nullptr) {
    min_parent(q.front(), last);
    q.pop front();
}
root = q.front();
```

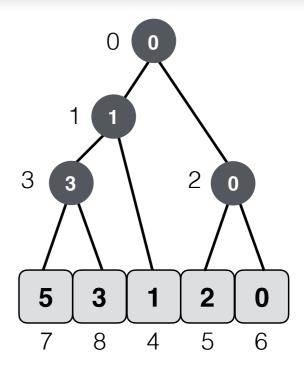
#### **Pointers**



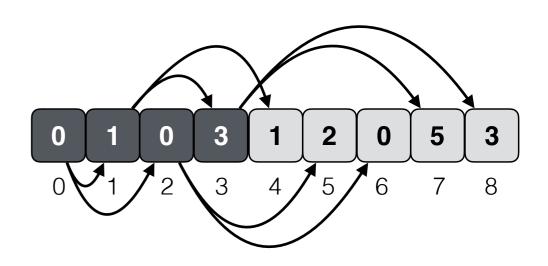
#### **Arrays**

```
std::vector<int> tree;
int n = 0:
std::cin >> n;
int tree_size = 2 * n - 1;
tree.resize(tree_size);
int h = ceil(log2(n));
// left-most internal node id
int left_most_node = (int(1) \ll (h - 1)) - 1;
int offset = LEFT(left_most_node);
// set leaves circularly
// 1. go forward
int i = 0;
for (int j = offset; j != tree_size; ++i, ++j) {
    int x = 0;
    std::cin >> x;
    tree[j] = x;
// 2. fall back
for (int j = 0; i != n; ++i, ++j) {
    int x = 0;
    std::cin >> x;
    tree[n - 1 + j] = x;
// set internal nodes
for (int i = tree_size - 1; i != 0; i -= 2) {
    int min = std::min<int>(tree[i], tree[i - 1]);
    tree[PARENT(i)] = min;
}
```

```
#define LEFT(i) 2 * i + 1
#define RIGHT(i) 2 * i + 2
#define PARENT(i) (i - 1) / 2
```



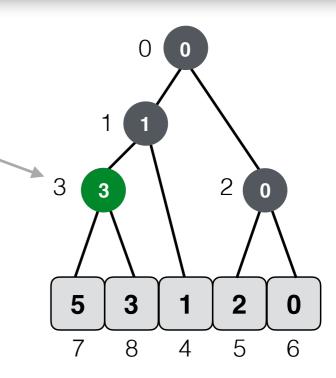
#### Pointers are implicit!



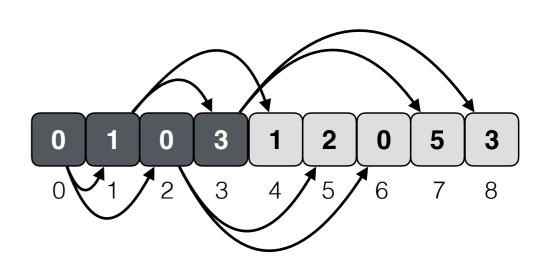
#### std::vector<int> tree; int n = 0: std::cin >> n; int tree\_size = 2 \* n - 1; tree.resize(tree\_size); int h = ceil(log2(n)); // left-most internal node id int left\_most\_node = (int(1) << (h - 1)) - 1;</pre> int offset = LEFT(left\_most\_node); // set leaves circularly // 1. go forward int i = 0; for (int j = offset; j != tree\_size; ++i, ++j) { int x = 0; std::cin >> x; tree[j] = x;// 2. fall back for (int j = 0; i != n; ++i, ++j) { int x = 0; std::cin >> x; tree[n-1+j]=x; // set internal nodes for (int i = tree\_size - 1; i != 0; i -= 2) { int min = std::min<int>(tree[i], tree[i - 1]); tree[PARENT(i)] = min; }

#### **Arrays**

```
#define LEFT(i) 2 * i + 1
#define RIGHT(i) 2 * i + 2
#define PARENT(i) (i - 1) / 2
```



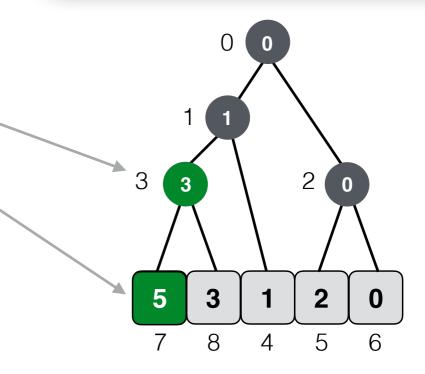
#### **Pointers are implicit!**



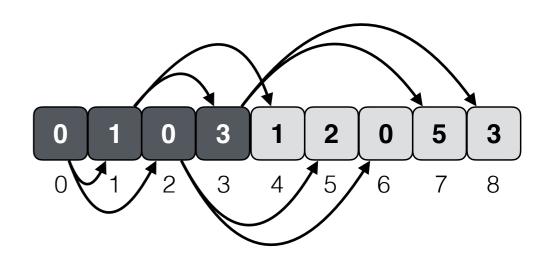
#### std::vector<int> tree; int n = 0: std::cin >> n; int tree\_size = 2 \* n - 1; tree.resize(tree\_size); int h = ceil(log2(n)); // left-most internal node id int left most node = $(int(1) \ll (h-1)) - 1$ ; int offset = LEFT(left most node); // set leaves circularly // 1. go forward int i = 0; for (int j = offset; j != tree\_size; ++i, ++j) { int x = 0; std::cin >> x; tree[j] = x;// 2. fall back for (int j = 0; i != n; ++i, ++j) { int x = 0; std::cin >> x; tree[n-1+j]=x; // set internal nodes for (int i = tree\_size - 1; i != 0; i -= 2) { int min = std::min<int>(tree[i], tree[i - 1]); tree[PARENT(i)] = min; }

#### **Arrays**

```
#define LEFT(i) 2 * i + 1
#define RIGHT(i) 2 * i + 2
#define PARENT(i) (i - 1) / 2
```



#### Pointers are implicit!



#### Remember

Be skeptic: *measure* first and then conclude.

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Pointers VS. Arrays

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#### Pointers VS. Arrays

#### **Experiment over 5 million nodes**

Visit the tree and compute the sum of all nodes.

#### Remember

Be skeptic: *measure* first and then conclude.

#### Pointers VS. Arrays

#### **Experiment over 5 million nodes**

Visit the tree and compute the sum of all nodes.

#### Remember

Be skeptic: *measure* first and then conclude.

#### Pointers VS. Arrays

#### **Experiment over 5 million nodes**

Visit the tree and compute the sum of all nodes.

OK, we are going to adopt the array-based representation!

#### **Building Segment Trees recursively**

```
size_t n = leaves.size();
                                                                   struct type_traits {
// round up to the next power of 2
                                                                       IntType invalid;
size_t m = size_t(1) << static_cast<size_t>(ceil(log2(n)));
                                                                       BinaryFunct funct;
m_{\text{tree.resize}}(2 * m - 1, m_{\text{traits.invalid}});
                                                                  };
build(leaves, 0, n - 1, 0);
void build(std::vector<IntType> const& leaves, size_t lo, size_t hi, size_t pos) {
    if (lo == hi) {
        m_tree[pos] = leaves[lo];
                                                      #define LEFT(i) 2 * i + 1
        return;
                                                      #define RIGHT(i) 2 * i + 2
                                                      #define PARENT(i) (i - 1) / 2
    size_t = (lo + hi) / 2;
    build(leaves, lo, mid, LEFT(pos));
    build(leaves, mid + 1, hi, RIGHT(pos));
    m_tree[pos] = m_traits.funct(m_tree[LEFT(pos)], m_tree[RIGHT(pos)]);
}
```



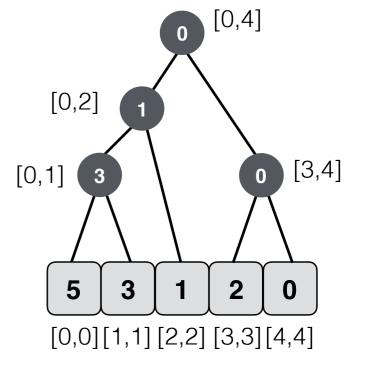
#### Range (MIN) Queries with Segment Trees

```
IntType rmq(range const& query, range node_segment, size_t pos) {
    if (query.lo <= node_segment.lo
        and query.hi >= node_segment.hi) { // total overlap
            return m_tree[pos];
    }
    if (query.lo > node_segment.hi
    or query.hi < node_segment.lo) { // no overlap
        return m_traits.invalid;
    }

    // partial overlap
    size_t mid = (node_segment.lo + node_segment.hi) / 2;
    return m_traits.funct(
        rmq(query, {node_segment.lo, mid}, LEFT(pos)),
        rmq(query, {mid + 1, node_segment.hi}, RIGHT(pos))
    );
}</pre>
```

```
struct range {
    range(size_t l, size_t h)
        : lo(l), hi(h)
    {}
    size_t lo, hi;
};
```





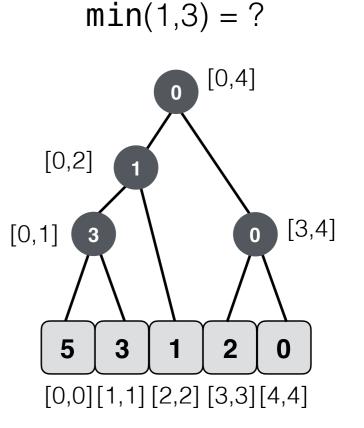
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    }
    if (query.lo > node_segment.hi
    or query.hi < node_segment.lo) { // no overlap
        return m_traits.invalid;
    }

    // partial overlap
    size_t mid = (node_segment.lo + node_segment.hi) / 2;
    return m_traits.funct(
        rmq(query, {node_segment.lo, mid}, LEFT(pos)),
        rmq(query, {mid + 1, node_segment.hi}, RIGHT(pos))
    );
}</pre>
```

```
struct range {
    range(size_t l, size_t h)
        : lo(l), hi(h)
    {}
    size_t lo, hi;
};
```





#### **Updating Segment Trees**

Let's add two new operations (updates):

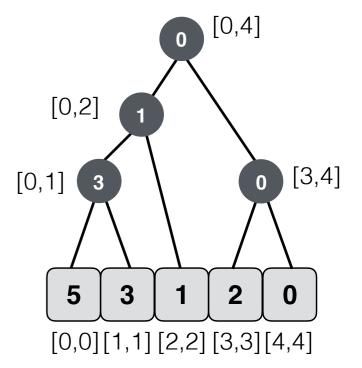
- update(i, x) which increments the i-th leaf by x;
- update\_range(i, j,x) which increments all leaves from i to j by x.

```
void update(size_t i, IntType delta, range node_segment, size_t pos) {
    if (i > node_segment.hi
    or i < node_segment.lo) {
        return;
    }

    if (node_segment.lo == node_segment.hi) { // leaf
        m_tree[pos] += delta;
        return;
    }

    size_t mid = (node_segment.lo + node_segment.hi) / 2;
    update(i, delta, {node_segment.lo, mid}, LEFT(pos));
    update(i, delta, {mid + 1, node_segment.hi}, RIGHT(pos));
    m_tree[pos] = m_traits.funct(m_tree[LEFT(pos)], m_tree[RIGHT(pos)]);
}</pre>
```





#### **Updating Segment Trees**

Let's add two new operations (updates):

- update(i, x) which increments the i-th leaf by x;
- update\_range(i, j,x) which increments all leaves from i to j by x.

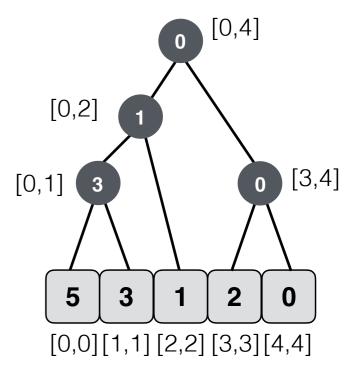
```
range const& query
void update(size_t i, IntType delta, range node_segment, size_t pos) {

if (i = node_segment.hi
    or i < node_segment.lo) {
        return;
}

if (node_segment.lo == node_segment.hi) { // leaf
        m_tree[pos] += delta;
        return;
}

size_t mid = (node_segment.lo + node_segment.hi) / 2;
    update(i, delta, {node_segment.lo, mid}, LEFT(pos));
    update(i, delta, {mid + 1, node_segment.hi}, RIGHT(pos));
    m_tree[pos] = m_traits.funct(m_tree[LEFT(pos)], m_tree[RIGHT(pos)]);
}</pre>
```





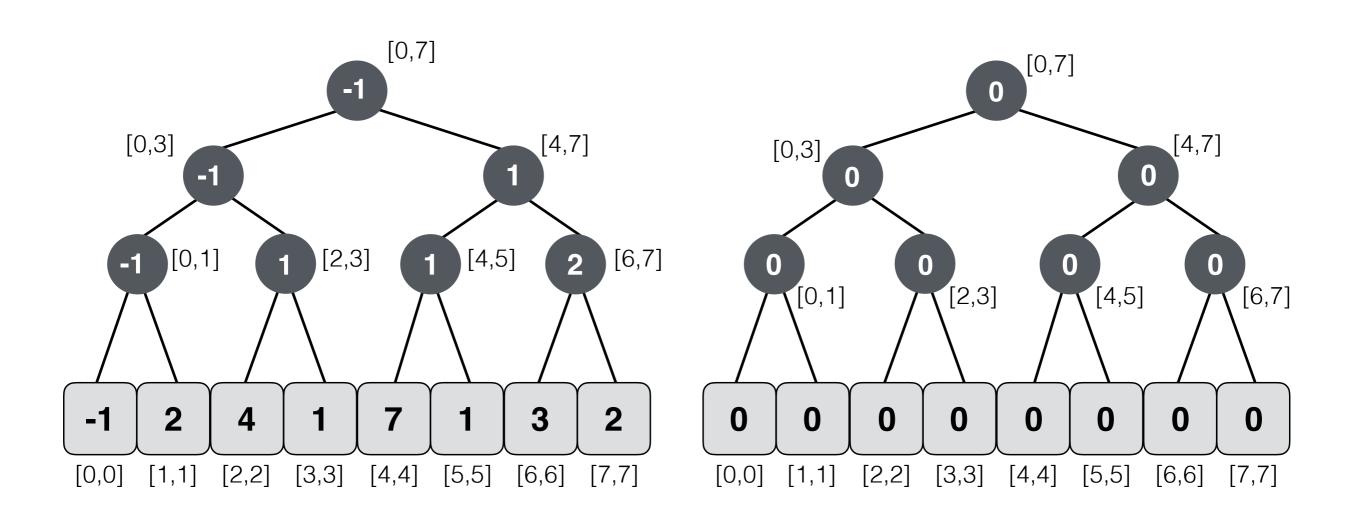
#### **Benchmarking Segment Trees**



```
→ segment_trees git:(master) x python gen_data.py 5000000 100000 100000 > input13
→ segment_trees git:(master) x ./rmq_segment_tree < input13
parsing the input took: 18.5193 [sec]
building tree with 5000000 leaves
building took: 0.314939 [sec]
executing 100000 range queries
average query time: 1.74382 [musec]
executing 10000 updates
average update time: 0.561733 [musec]
executing 10000 range updates
average range update time: 2.55461 [musec]
→ segment_trees git:(master) x</pre>
```

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



13

**Lazy Tree** 

**Segment Tree** 

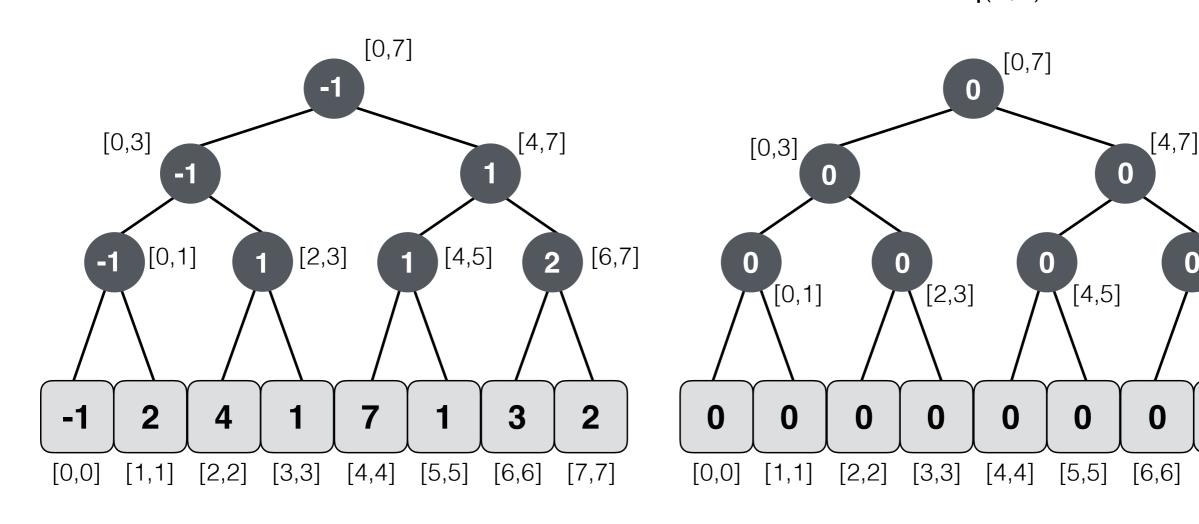
Avoid going down to the leaves and then up updating the internal nodes. Only update when needed.

> update\_range(0,3,3) update\_range(0,3,1) update\_range(0,0,2) rmq(3,5) = ?

> > 0

[6,7]

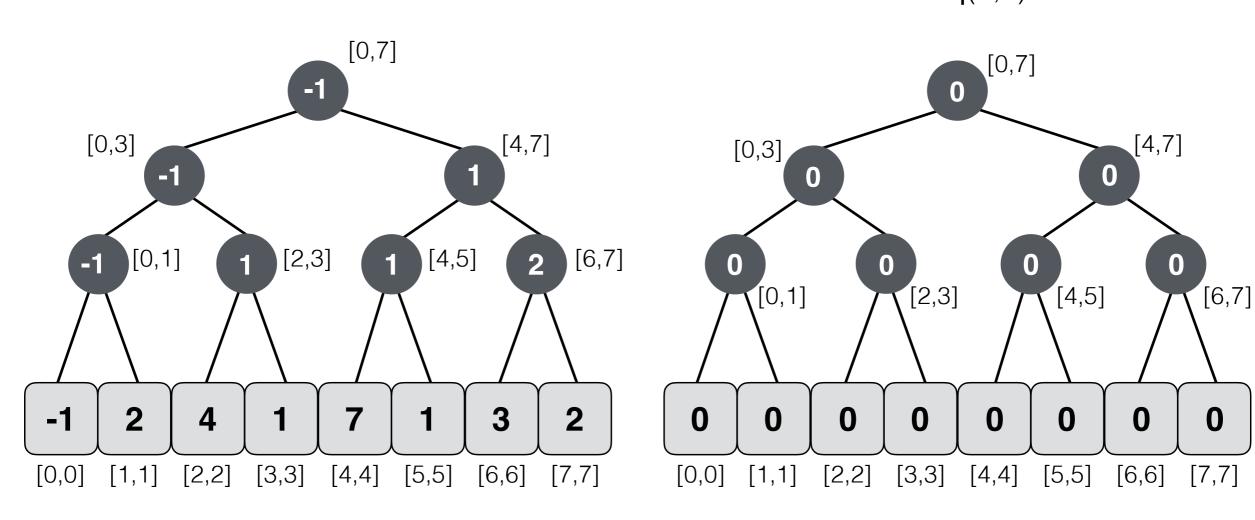
0



**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

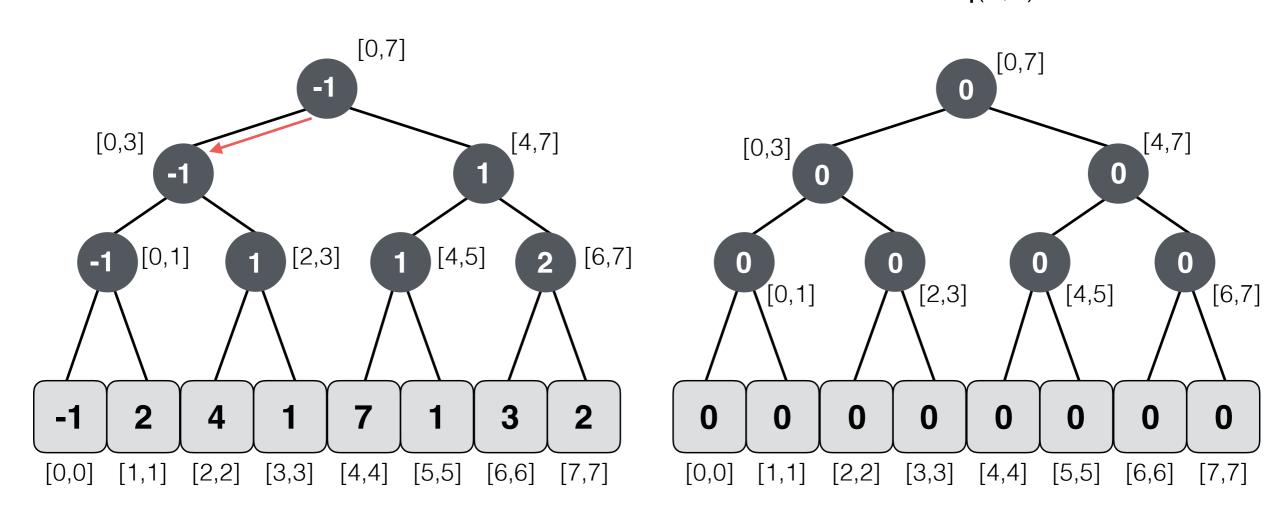
update\_range(0,3,3)
update\_range(0,3,1)
update\_range(0,0,2)
rmq(3,5) = ?



**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3)
update\_range(0,3,1)
update\_range(0,0,2)
rmq(3,5) = ?

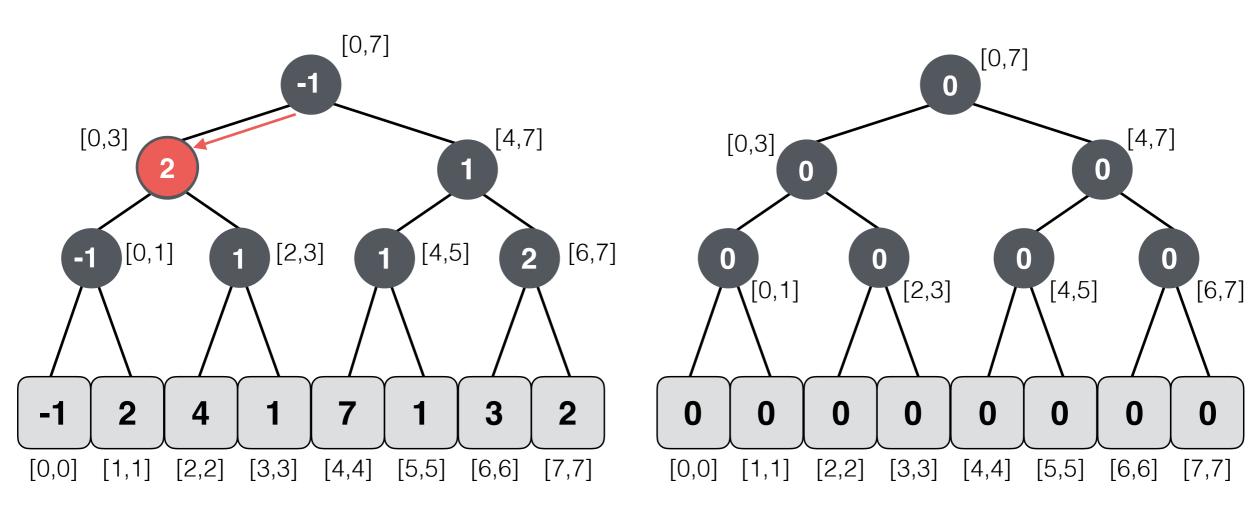


**Segment Tree** 

**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3)
update\_range(0,3,1)
update\_range(0,0,2)
rmq(3,5) = ?



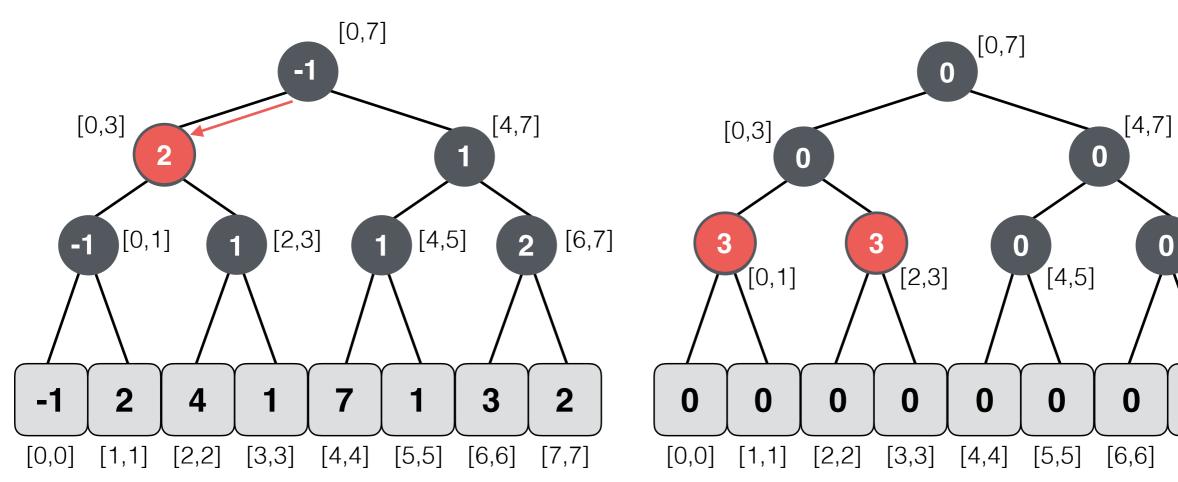
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3)
update\_range(0,3,1)
update\_range(0,0,2)
rmq(3,5) = ?

[6,7]

0



**Segment Tree** 

Avoid going down to the leaves and then up updating the internal nodes. Only update when needed.

> update\_range(0,3,3) update\_range(0,3,1) update\_range(0,0,2) rmq(3,5) = ?

> > [4,7]

0

0

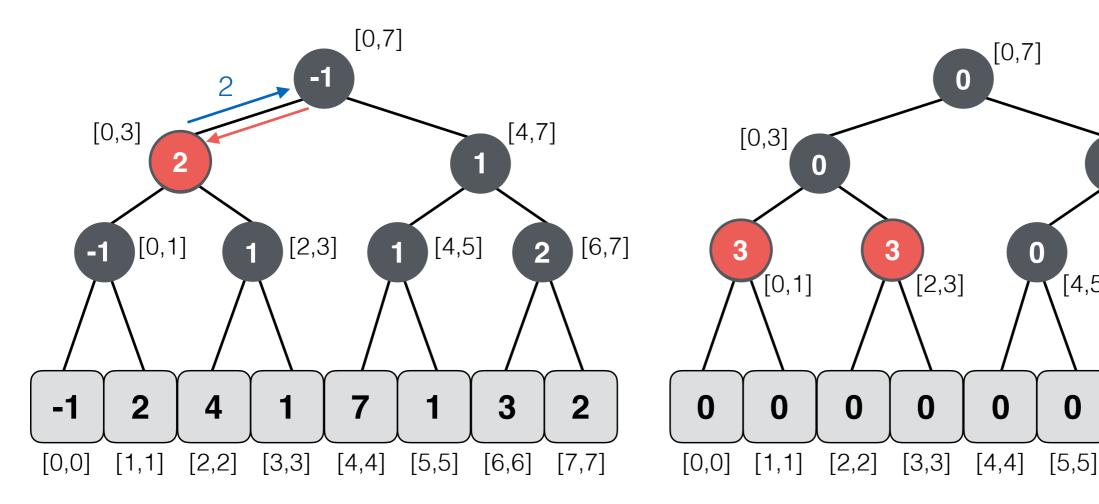
[6,6]

[6,7]

0

[4,5]

0



**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3)
update\_range(0,3,1)
update\_range(0,0,2)
rmq(3,5) = ?
[0,7]
[0,7]
[0,7]

[0,3] [4,7][0,3]0 [4,5] [0,1][2,3] [6,7] -1 3 [0,1] -1 3 0 0 4 [0,0][1,1] [2,2] [3,3] [5,5][7,7][0,0][1,1] [4,4][6,6]

[4,7]0 0 [2,3] [4,5] [6,7]0 0 0 0 0 0 [2,2][3,3] [5,5][6,6][4,4]

**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3)
update\_range(0,3,1)
update\_range(0,0,2)
rmq(3,5) = ?
[0,7]

[0,7]

[0,7]

[0,7]

[0,7]

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[0

[0,1][2,3] [4,5] [6,7] -1 -1 3 4 [0,0][1,1] [2,2] [3,3] [5,5][7,7][4,4][6,6]

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

**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3) update\_range(0,3,1) update\_range(0,0,2) rmq(3,5) = ?[0,7][0,7][0,3] [4,7][4,7][0,3][0,1][2,3] [4,5] [6,7] -1 3 0 0 [0,1] [2,3] [4,5] [6,7]

**Segment Tree** 

[3,3]

4

[2,2]

-1

[0,0]

[1,1]

**Lazy Tree** 

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[3,3]

0

[1,1]

0

[2,2]

0

[0,0]

3

[6,6]

[7,7]

[5,5]

[4,4]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3) update\_range(0,3,1) update\_range(0,0,2) rmq(3,5) = ?[0,7][0,7][0,3][4,7][4,7][0,3][4,5] [0,1][2,3] [6,7] -1 3 0 0 [0,1] [2,3] [4,5] [6,7]

**Segment Tree** 

[3,3]

4

[2,2]

-1

[0,0]

[1,1]

**Lazy Tree** 

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[3,3]

0

[1,1]

0

[2,2]

0

[0,0]

3

[6,6]

[7,7]

[5,5]

[4,4]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3) update\_range(0,3,1) update\_range(0,0,2) rmq(3,5) = ?[0,7][0,7][0,3][4,7][4,7][0,3][4,5] [0,1][2,3] [6,7] -1 3 0 0 [0,1] [2,3] [4,5] [6,7]

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

Lazy Tree

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[3,3]

**Segment Tree** 

4

-1

0

[1,1]

0

[2,2]

0

[0,0]

3

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

 $\begin{array}{c} & \qquad \qquad \text{update\_range}(0,3,3) \\ & \qquad \qquad \text{update\_range}(0,3,1) \\ & \qquad \qquad \text{update\_range}(0,0,2) \\ & \qquad \qquad \text{rmq}(3,5) = ? \end{array}$ 

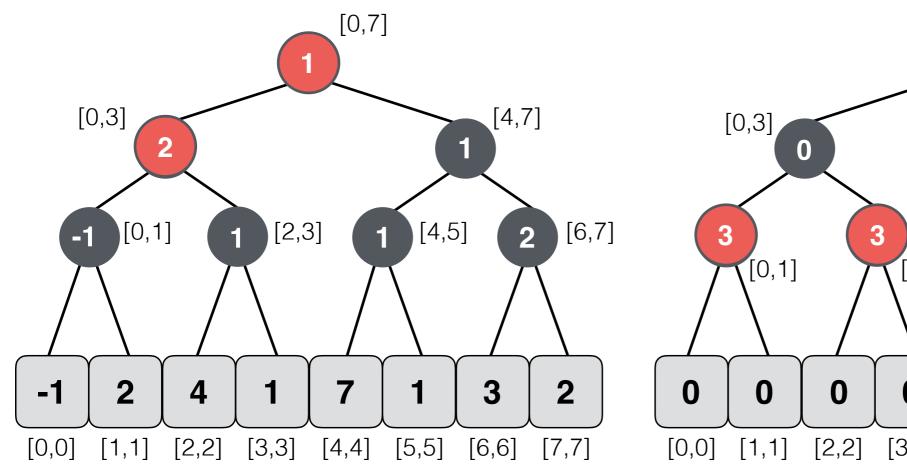
[2,3] [0,1][4,5] [6,7] -1 -1 3 4 [0,0][1,1] [2,2] [3,3] [5,5][7,7][4,4][6,6]

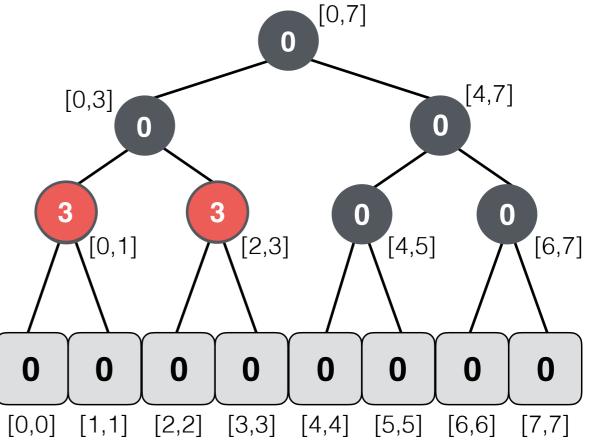
3 0 0 [0,1] [2,3] [4,5] [6,7]0 0 0 0 0 0 0 0 [0,0][1,1] [2,2][3,3] [5,5][6,6][4,4]

**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3)
update\_range(0,3,1)
update\_range(0,0,2)
rmq(3,5) = ?

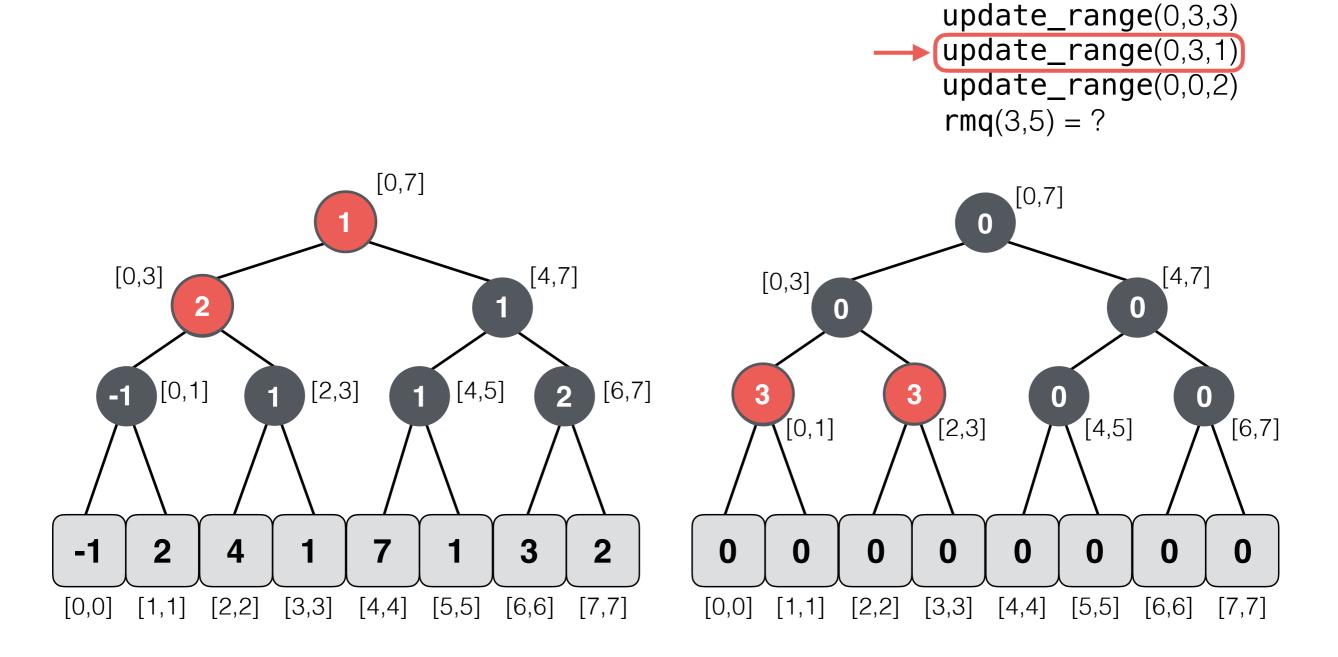




**Segment Tree** 

**Lazy Tree** 

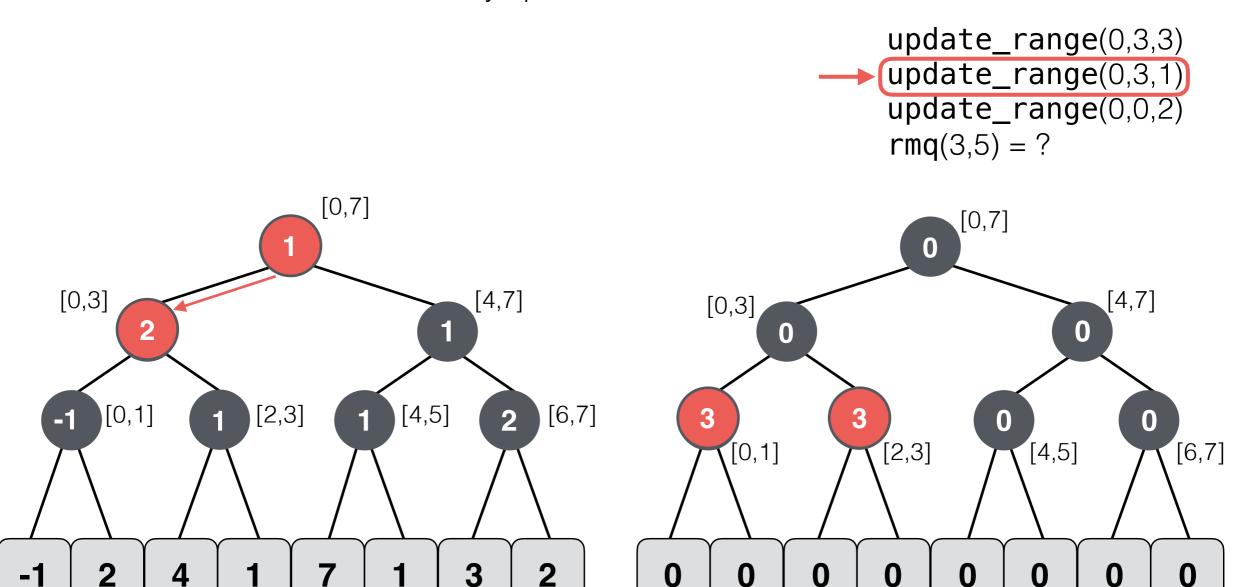
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Lazy Tree** 

**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[5,5]

[4,4]

[3,3]

[0,0]

[1,1]

[2,2]

**Lazy Tree** 

[4,4]

[5,5]

[6,6]

[3,3]

[0,0]

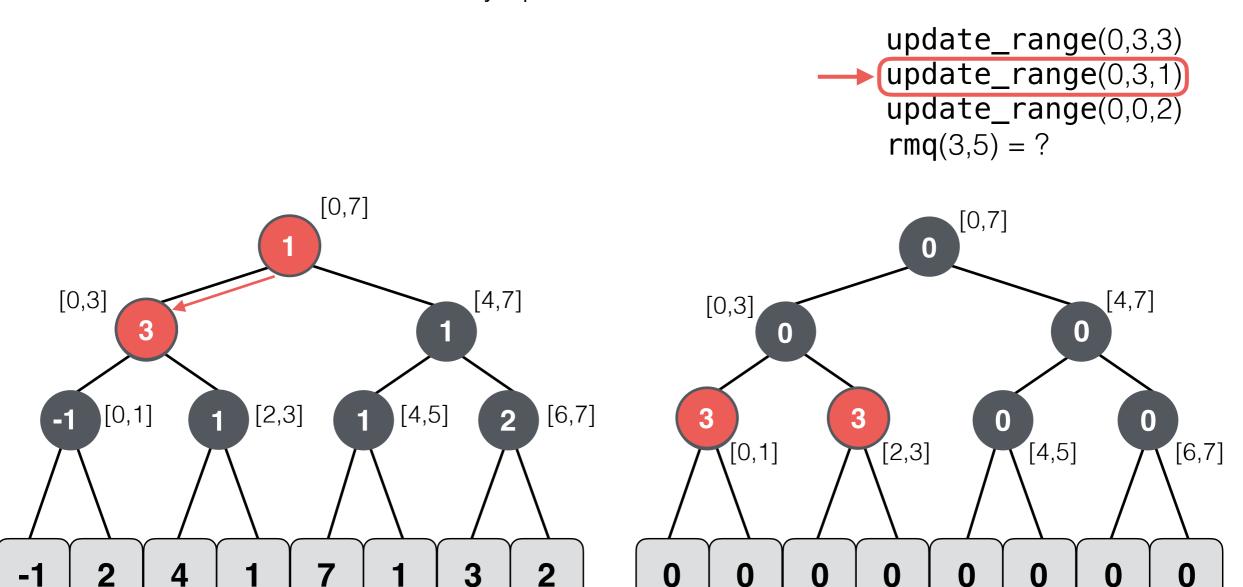
[1,1]

[2,2]

[7,7]

[6,6]

Avoid going down to the leaves and then up updating the internal nodes. Only update when needed.



**Segment Tree** 

[5,5]

[4,4]

[3,3]

4

[2,2]

[0,0]

[1,1]

**Lazy Tree** 

[3,3]

0

[4,4]

[5,5]

0

[6,6]

0

[0,0]

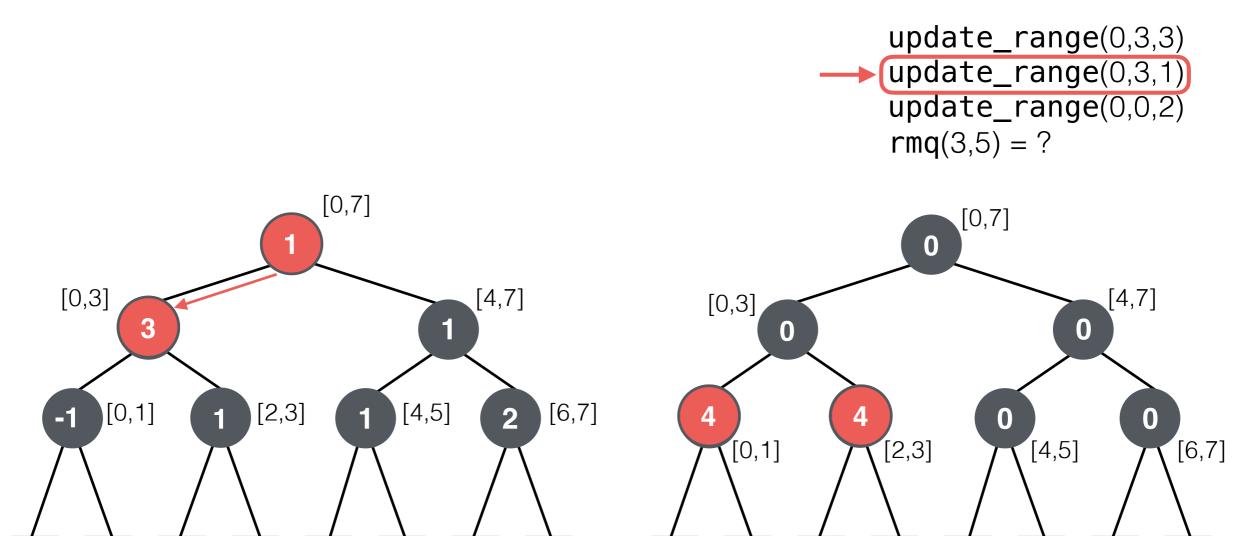
[1,1]

[2,2]

[7,7]

[6,6]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[3,3]

4

[2,2]

-1

[0,0]

[1,1]

**Lazy Tree** 

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[0,0]

0

[1,1]

0

[2,2]

0

[3,3]

3

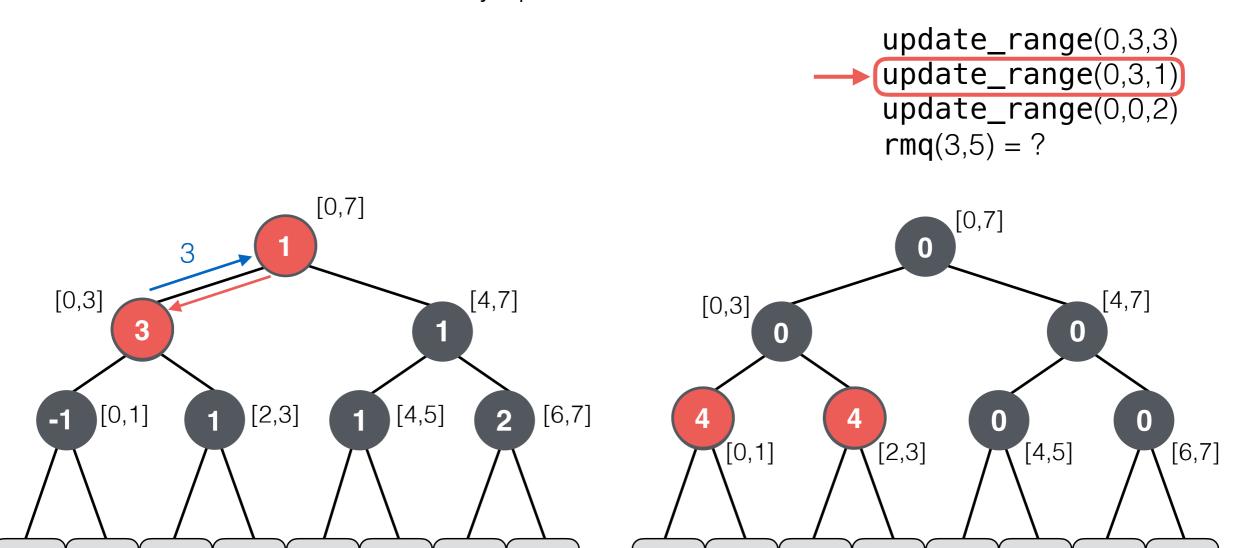
[6,6]

[7,7]

[5,5]

[4,4]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[3,3]

4

[2,2]

-1

[0,0]

[1,1]

**Lazy Tree** 

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[3,3]

0

[0,0]

0

[1,1]

0

[2,2]

3

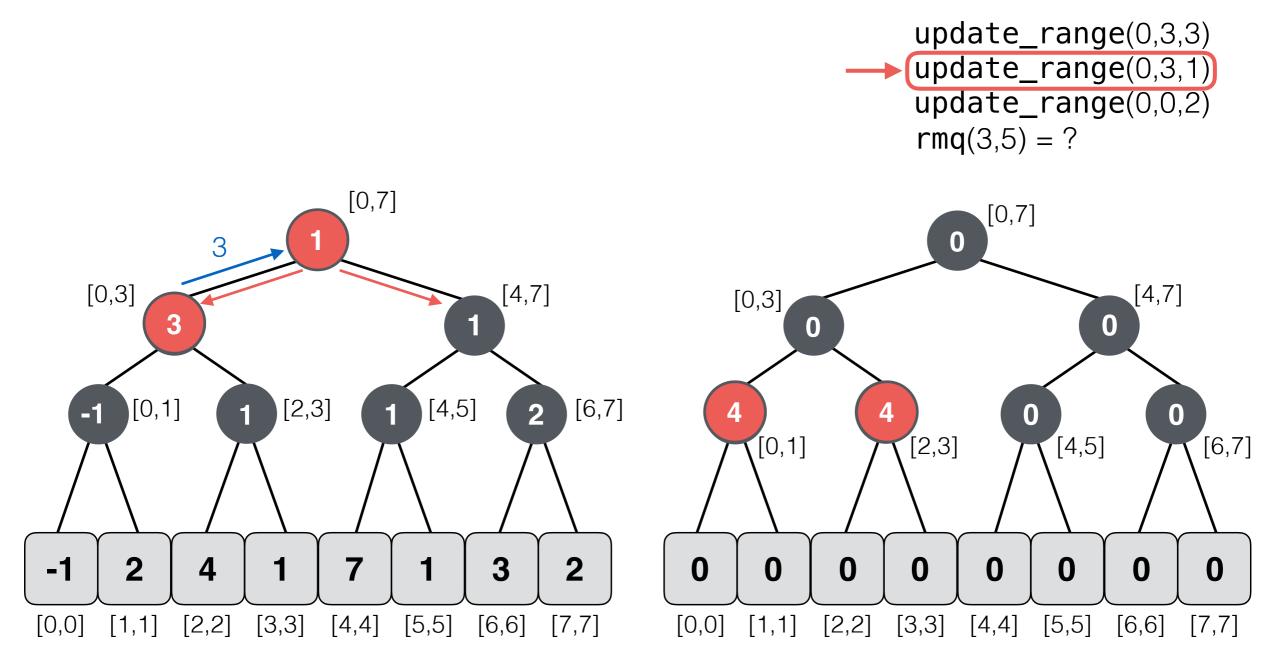
[6,6]

[7,7]

[5,5]

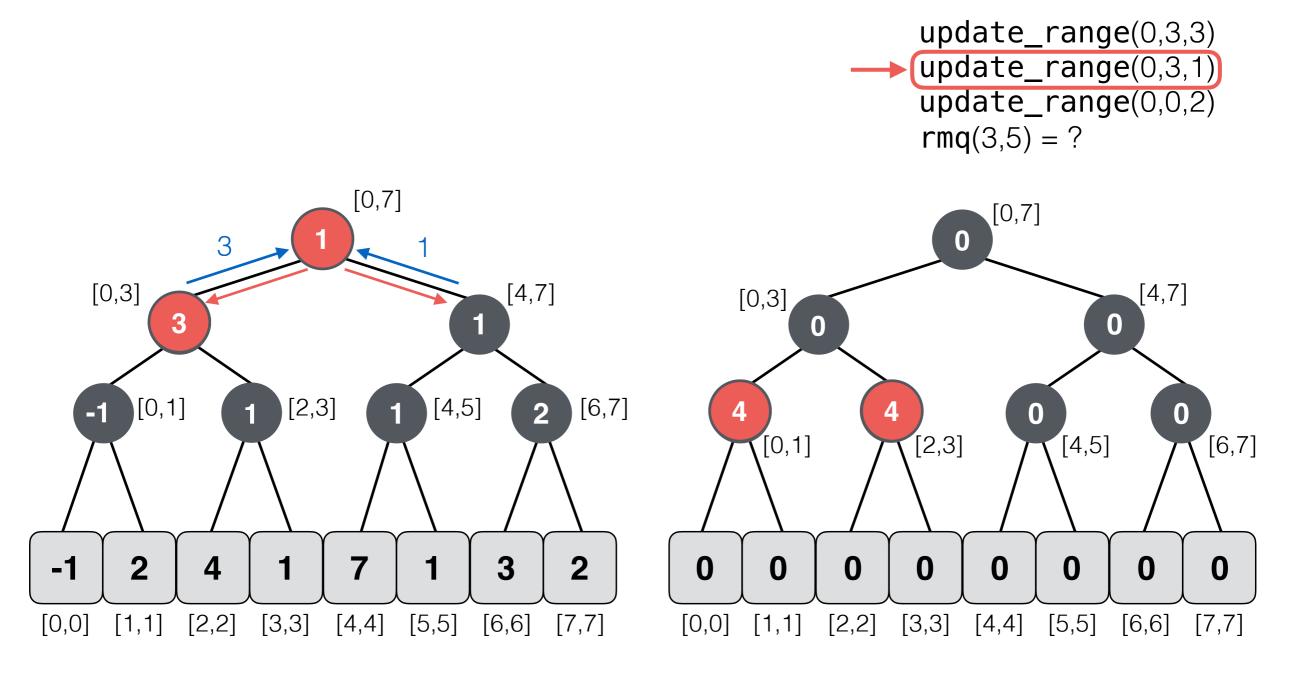
[4,4]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



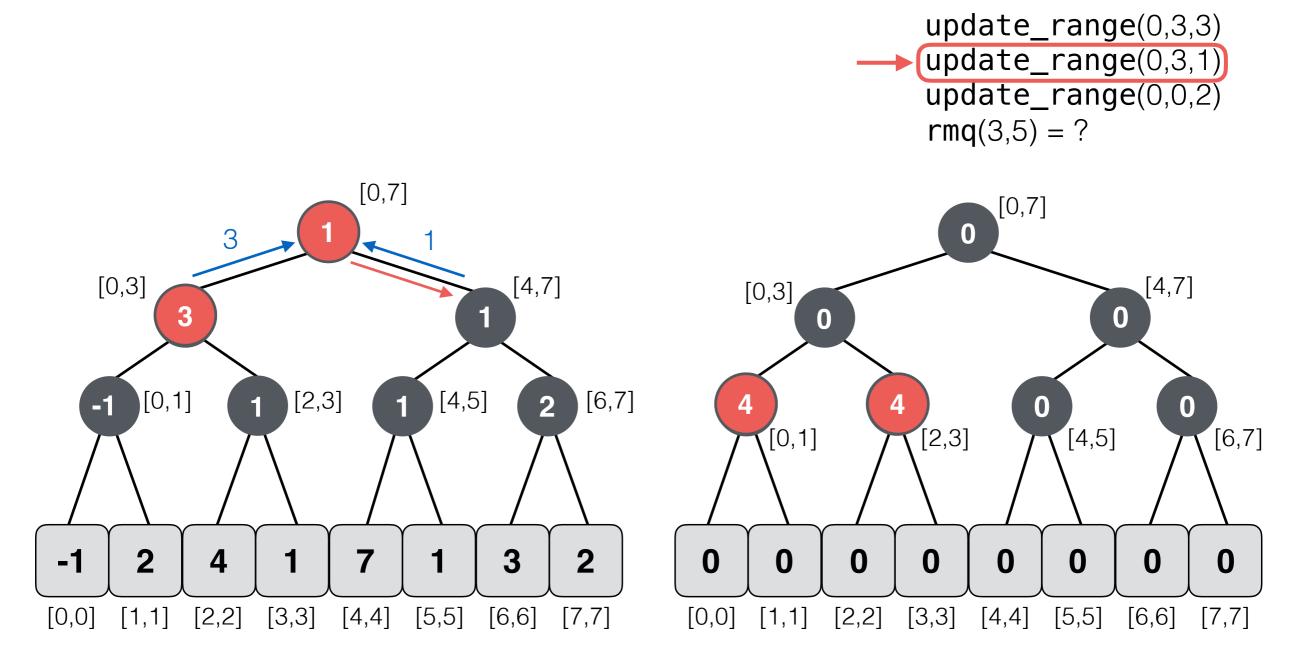
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



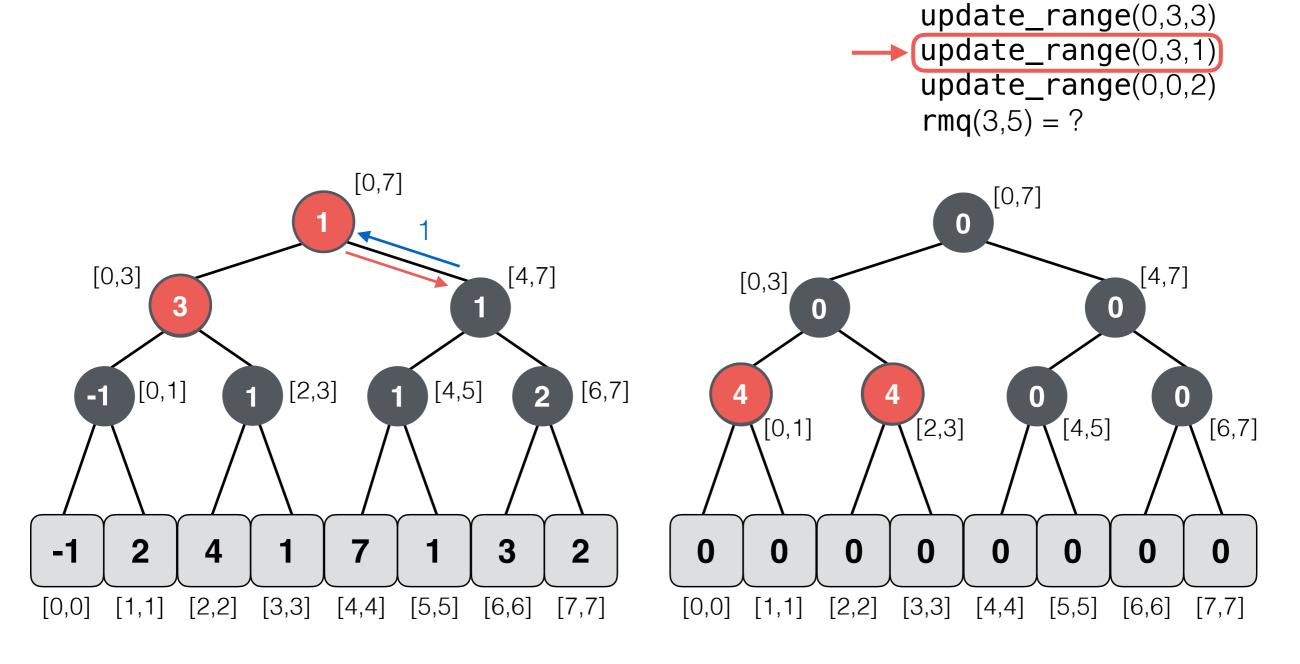
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



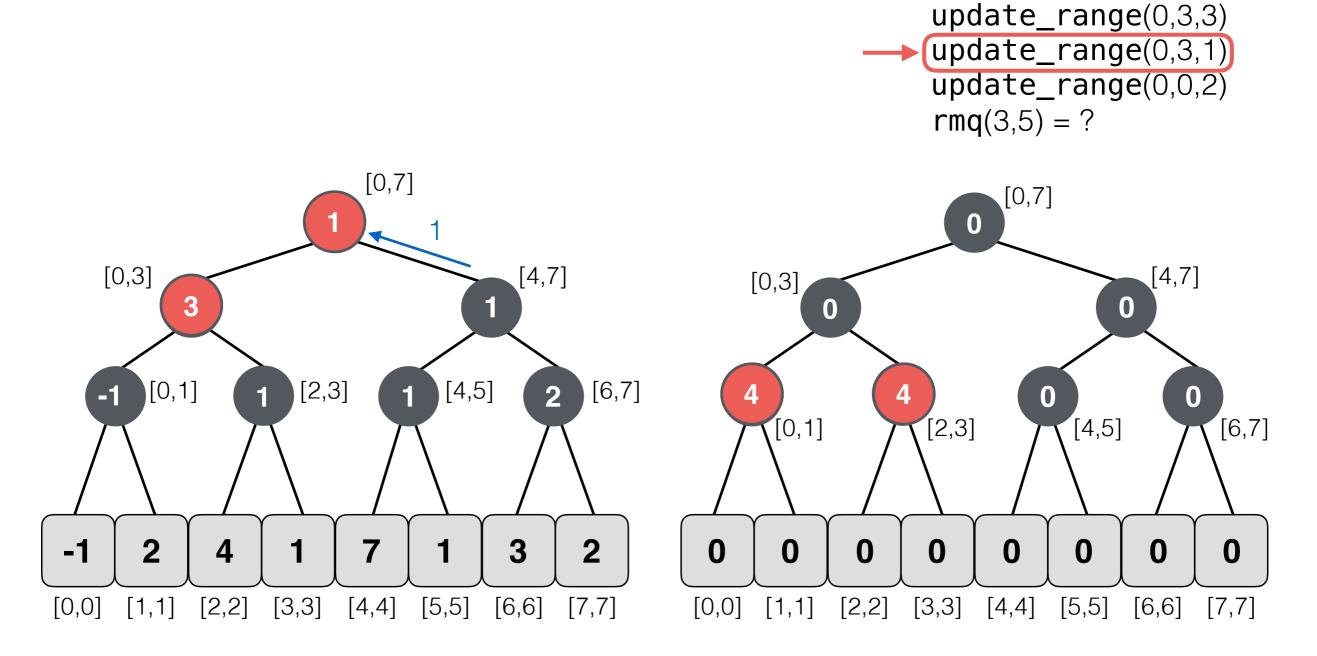
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



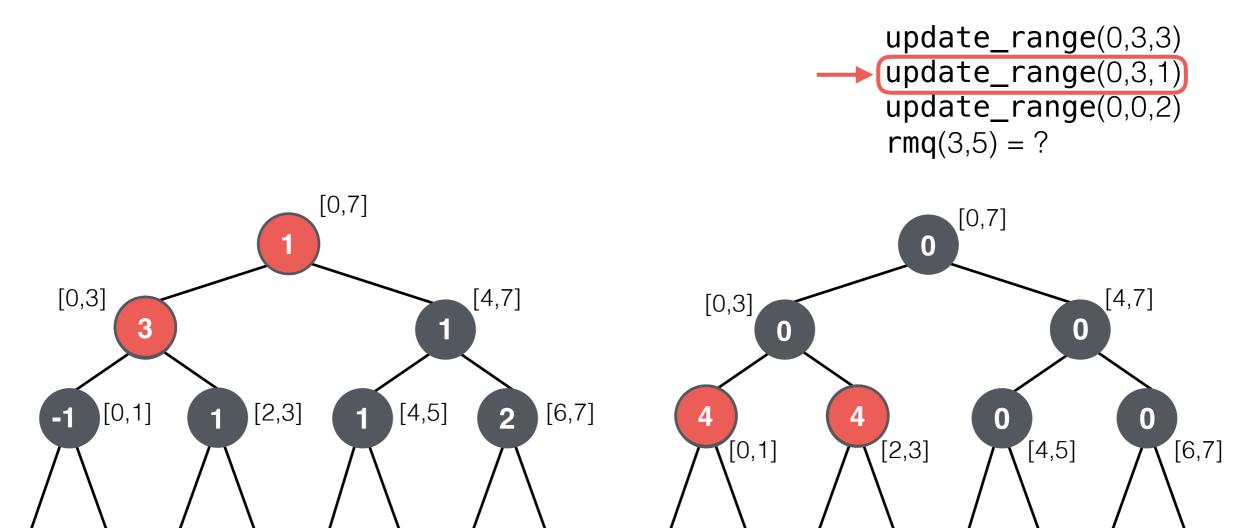
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[3,3]

4

[2,2]

-1

[0,0]

[1,1]

**Lazy Tree** 

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[3,3]

0

[0,0]

0

[1,1]

0

[2,2]

3

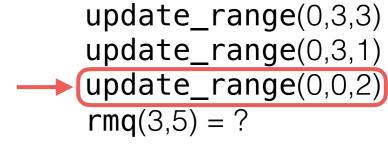
[6,6]

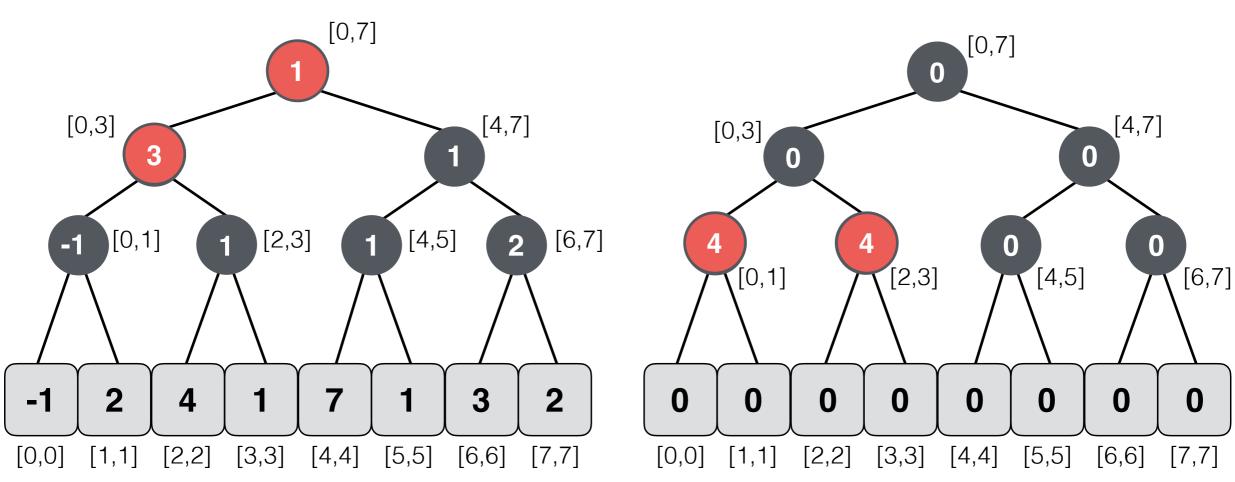
[7,7]

[5,5]

[4,4]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

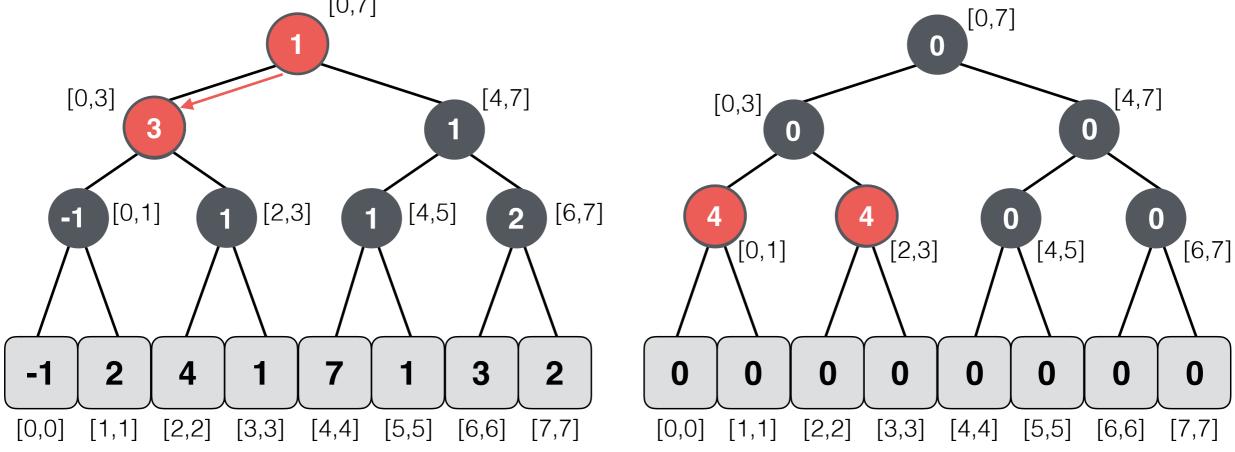




**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

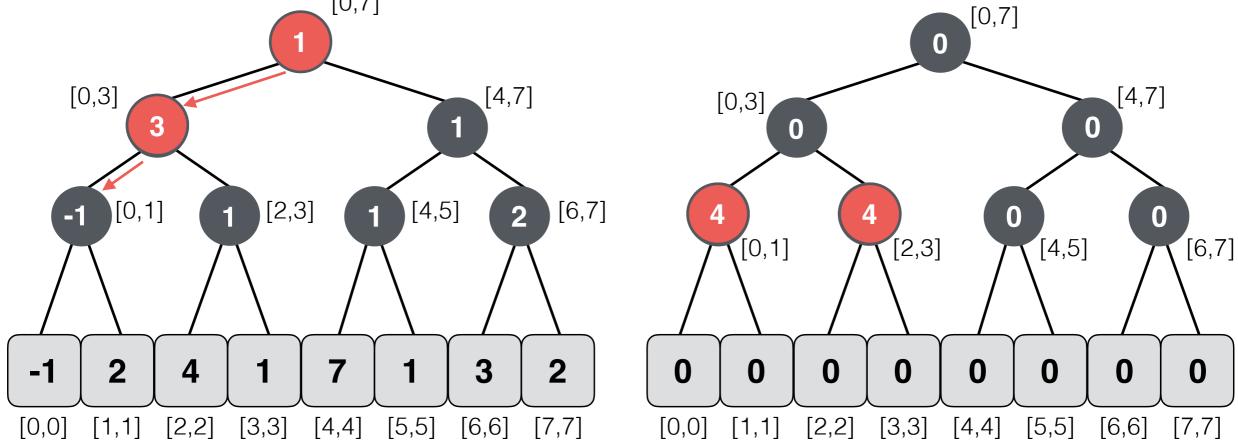




**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

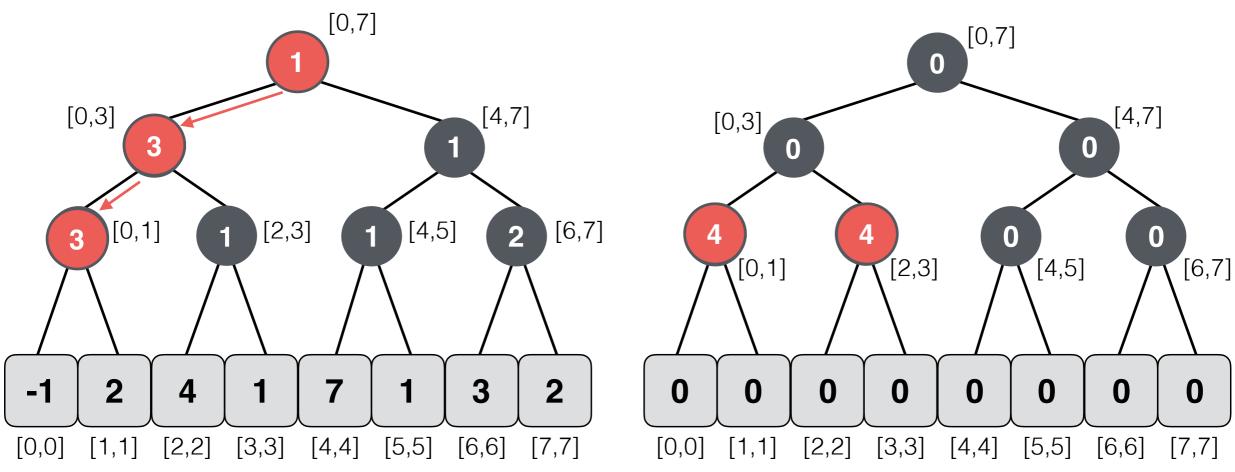




**Segment Tree** 

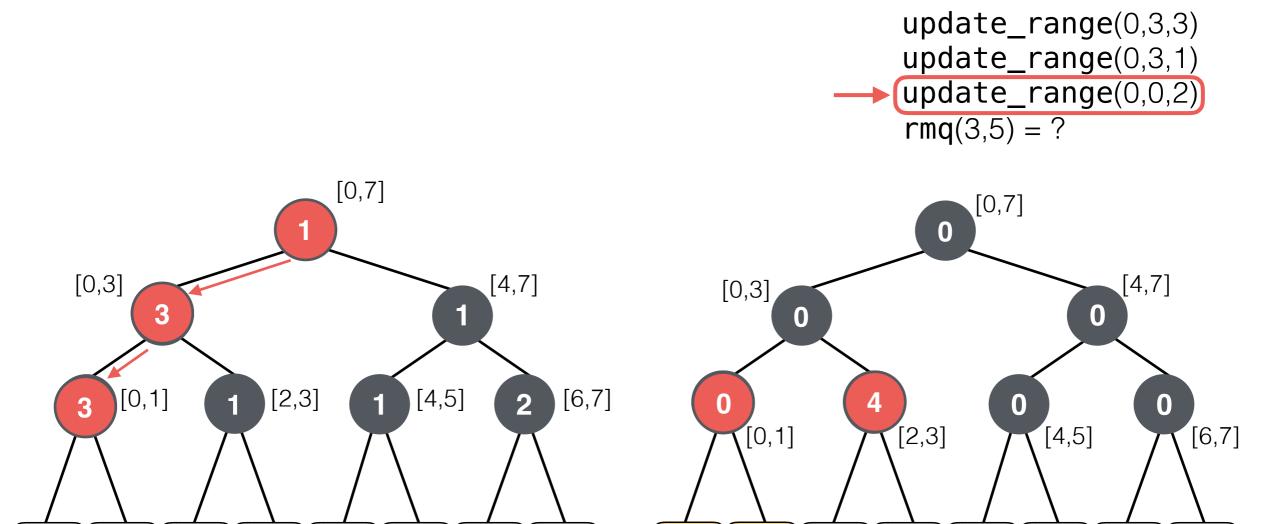
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.





**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[3,3]

4

[2,2]

-1

[0,0]

[1,1]

**Lazy Tree** 

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[3,3]

0

[2,2]

4

[1,1]

4

[0,0]

3

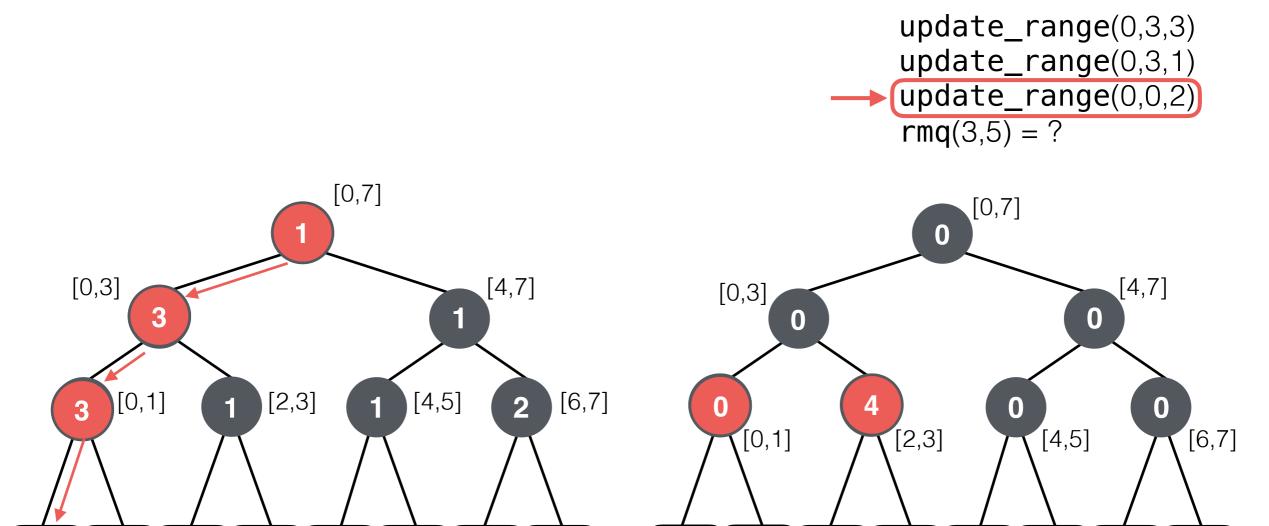
[6,6]

[7,7]

[5,5]

[4,4]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[3,3]

4

[2,2]

-1

[0,0]

[1,1]

**Lazy Tree** 

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[3,3]

0

[2,2]

4

[1,1]

4

[0,0]

3

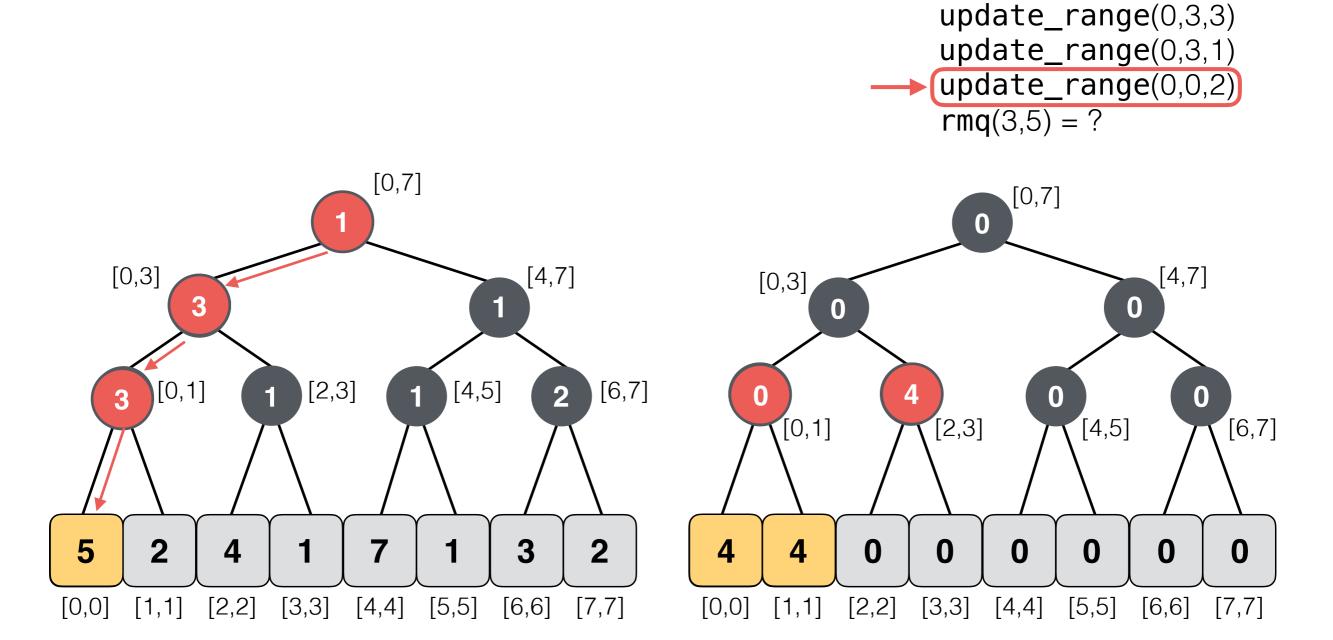
[6,6]

[7,7]

[5,5]

[4,4]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

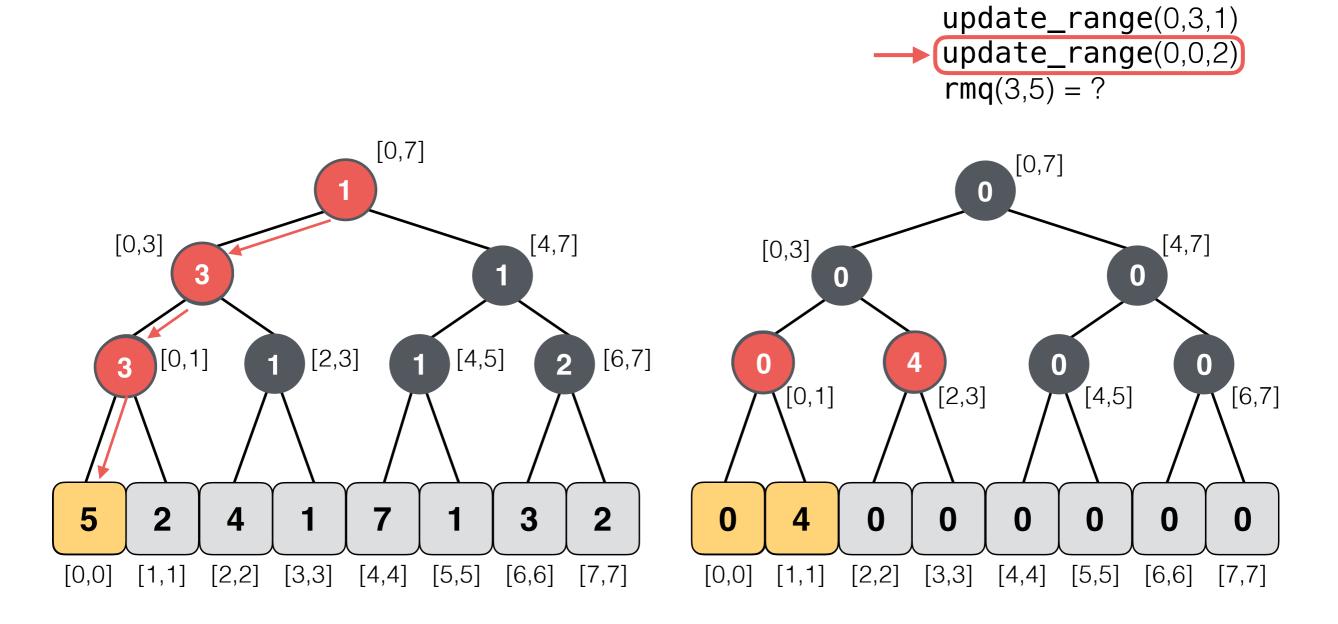


**Segment Tree** 

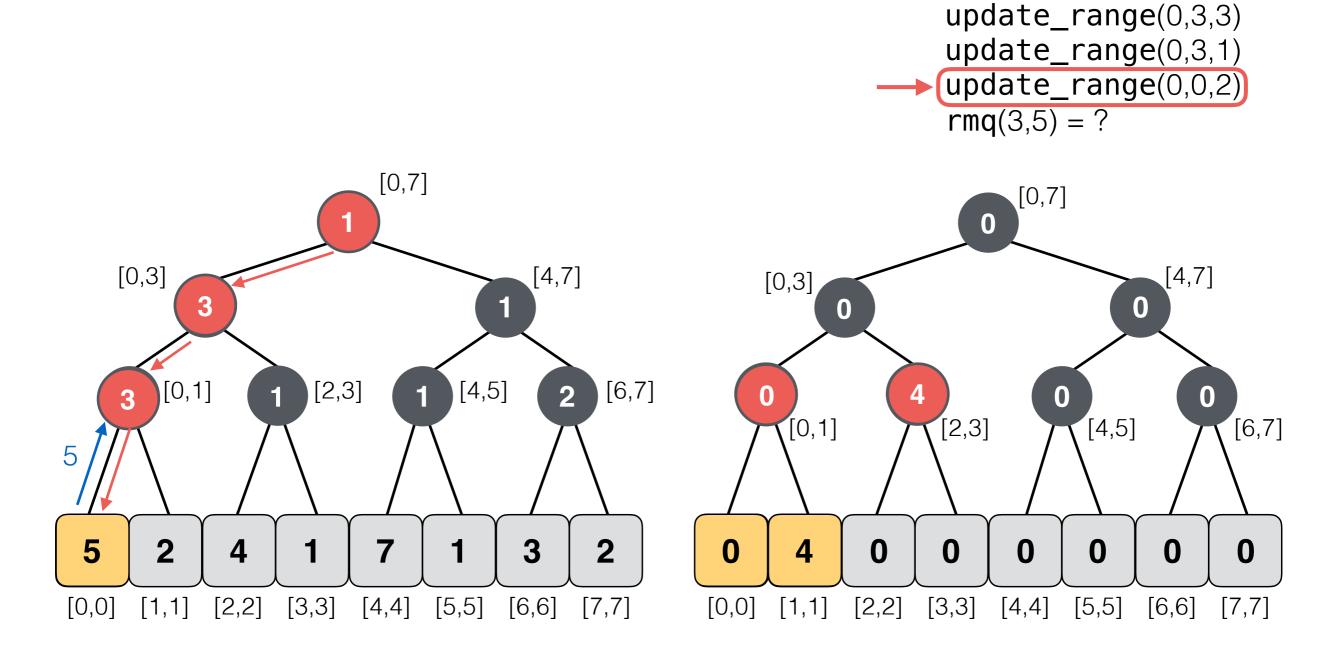
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.

update\_range(0,3,3)

**Lazy Tree** 

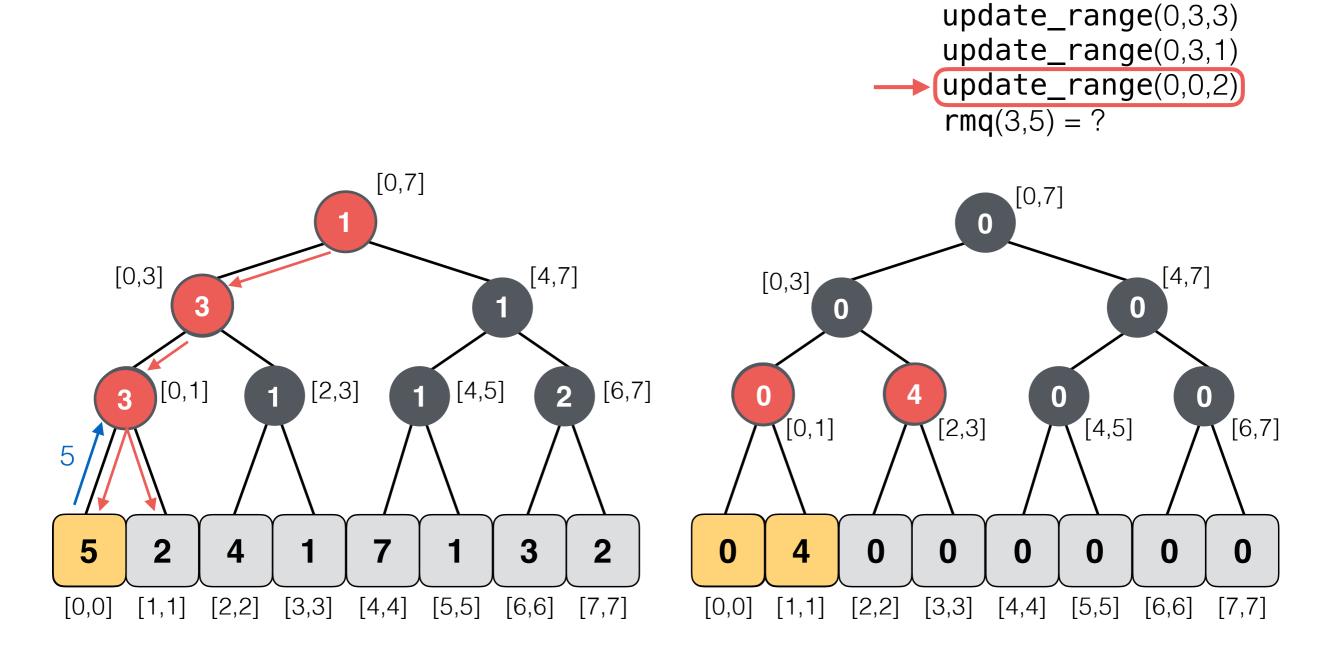


**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



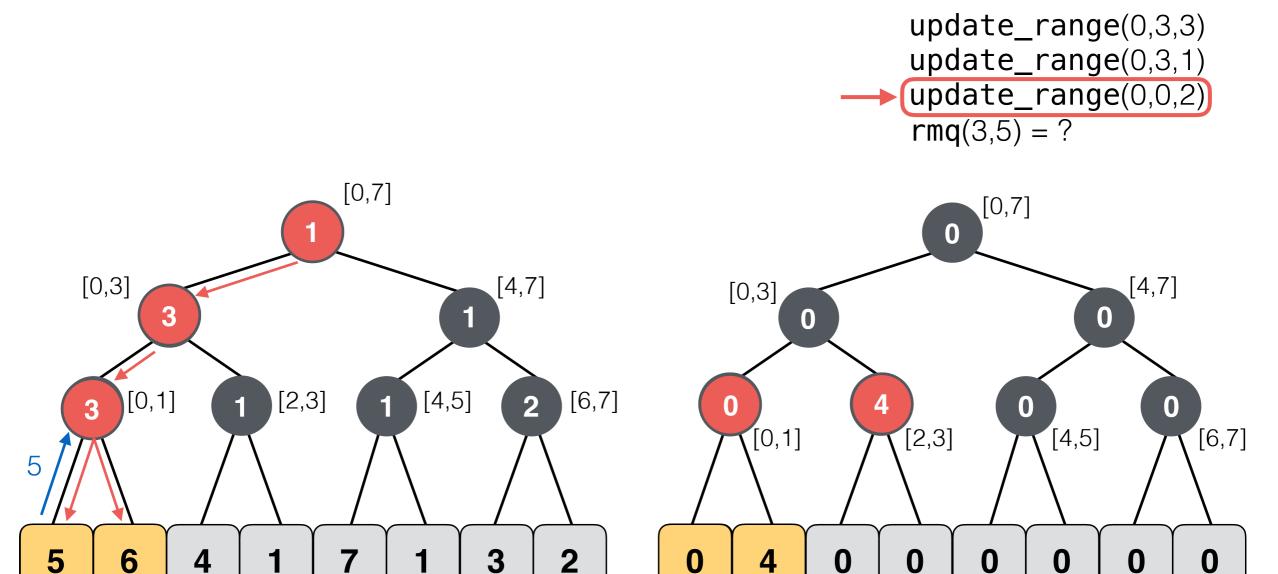
**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[5,5]

[4,4]

[3,3]

[0,0]

[1,1]

[2,2]

**Lazy Tree** 

[4,4]

[5,5]

[6,6]

[3,3]

[0,0]

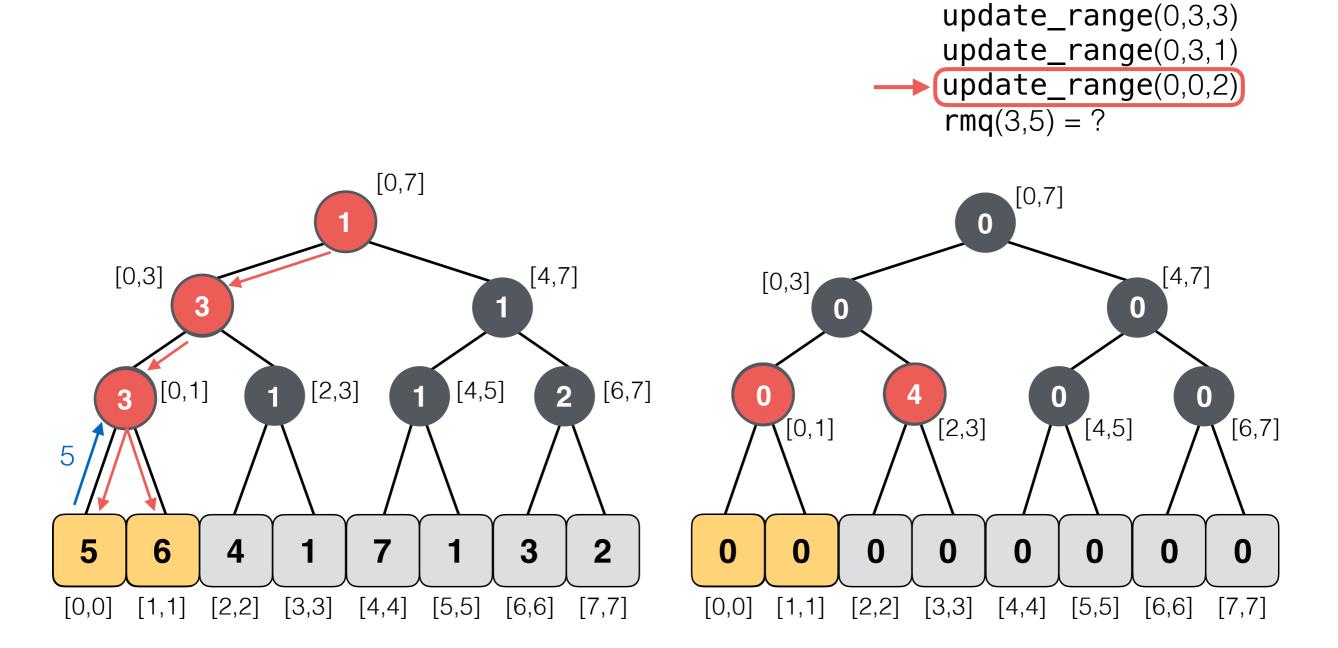
[1,1]

[2,2]

[7,7]

[6,6]

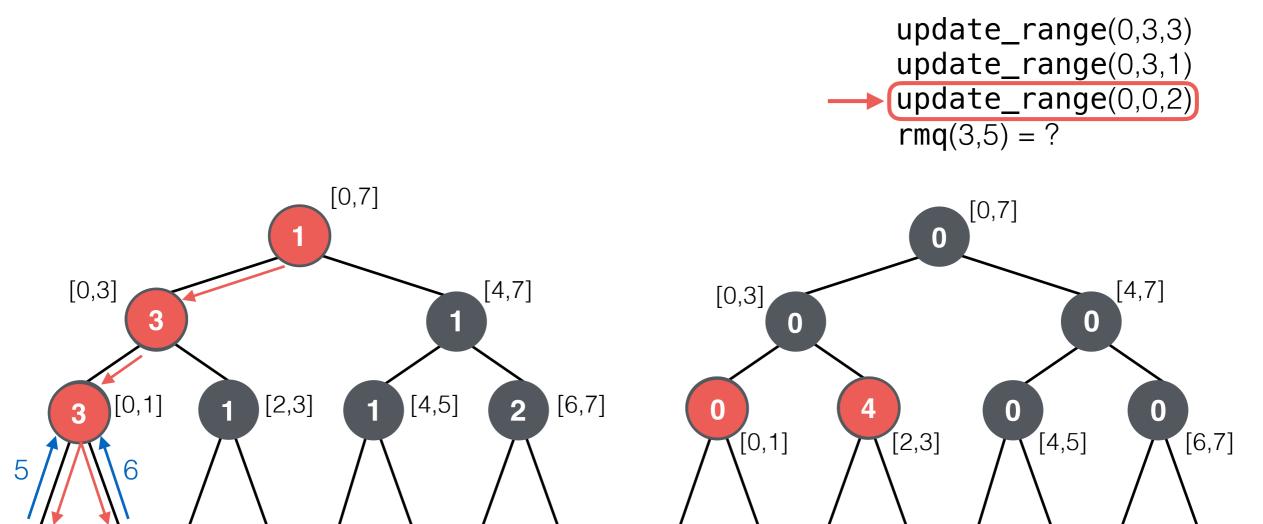
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



13

**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[3,3]

[4,4]

5

[0,0]

6

[1,1]

4

[2,2]

**Lazy Tree** 

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[3,3]

0

[2,2]

0

[1,1]

0

[0,0]

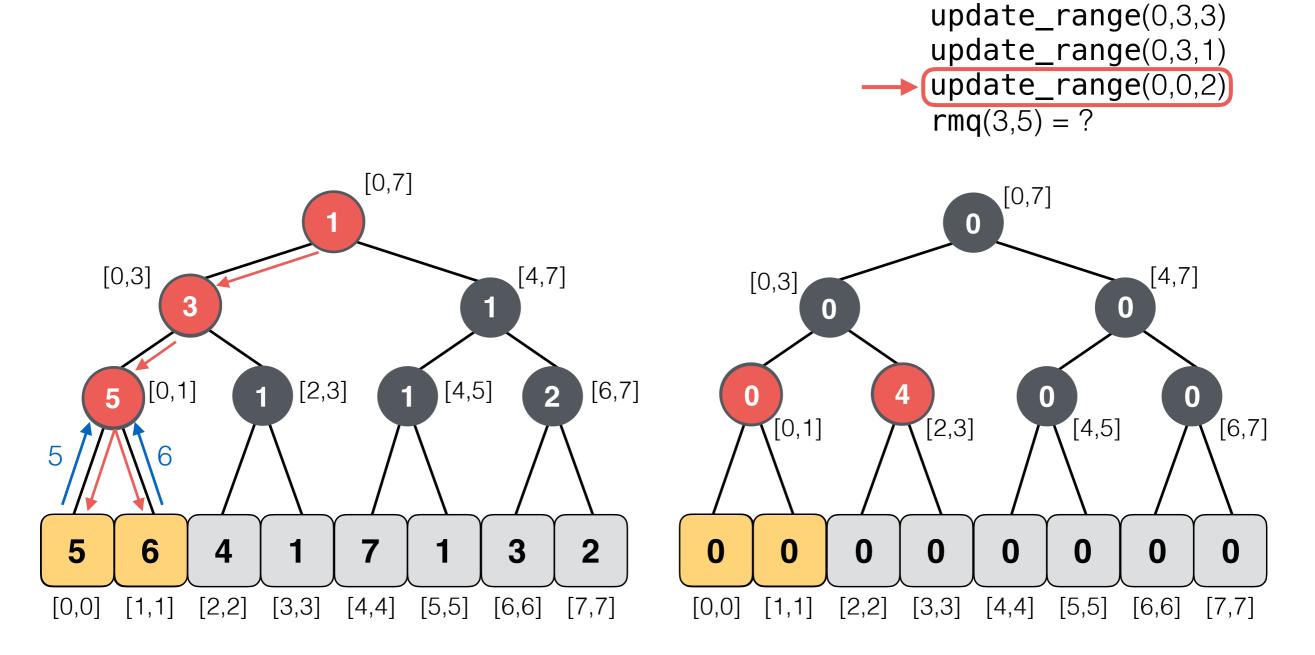
3

[6,6]

[7,7]

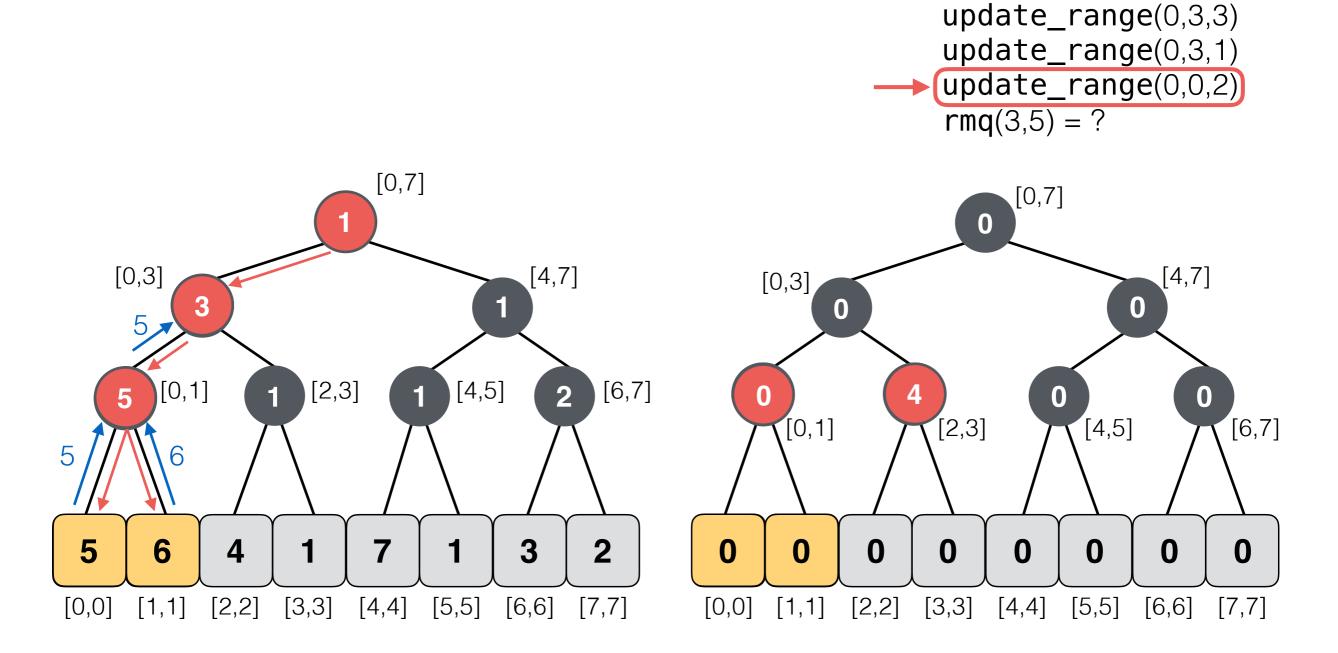
[5,5]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



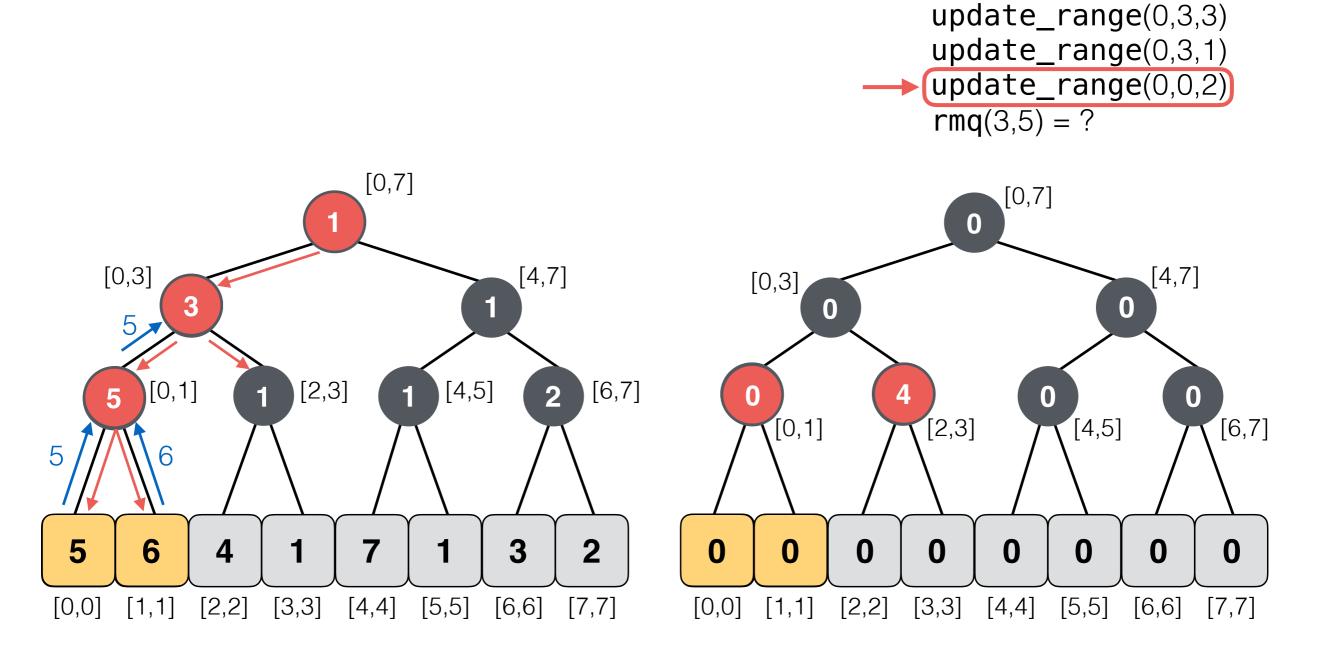
Segment Tree

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



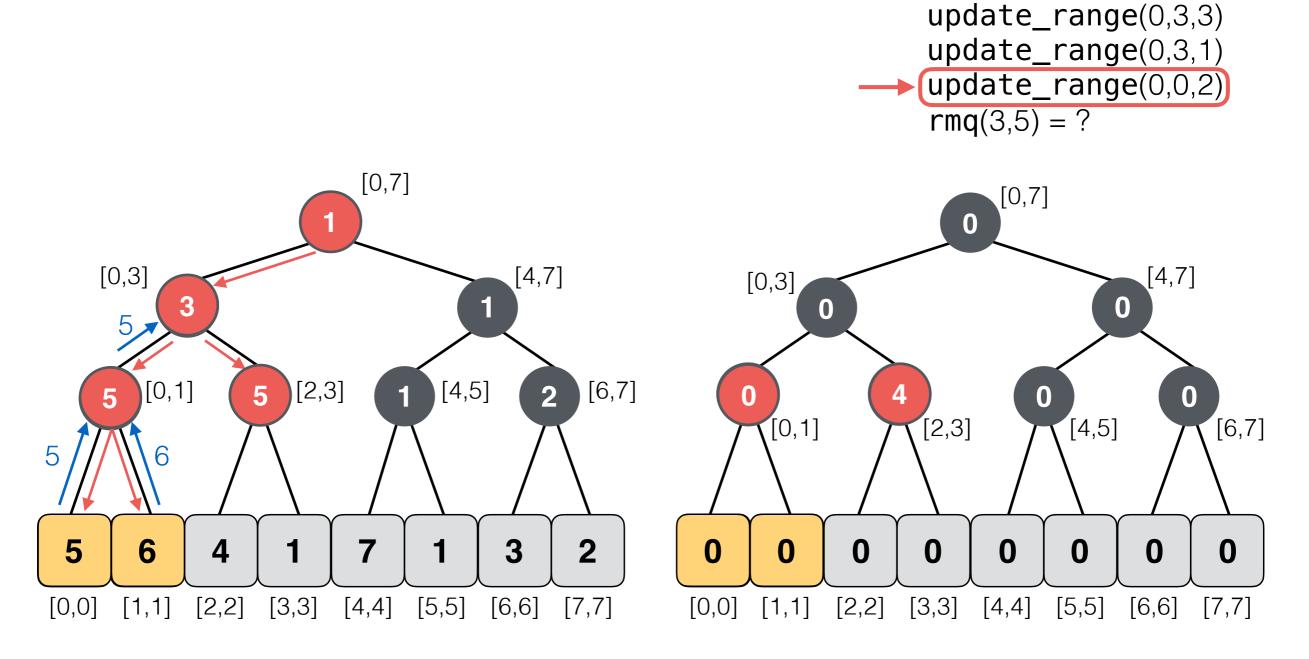
**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



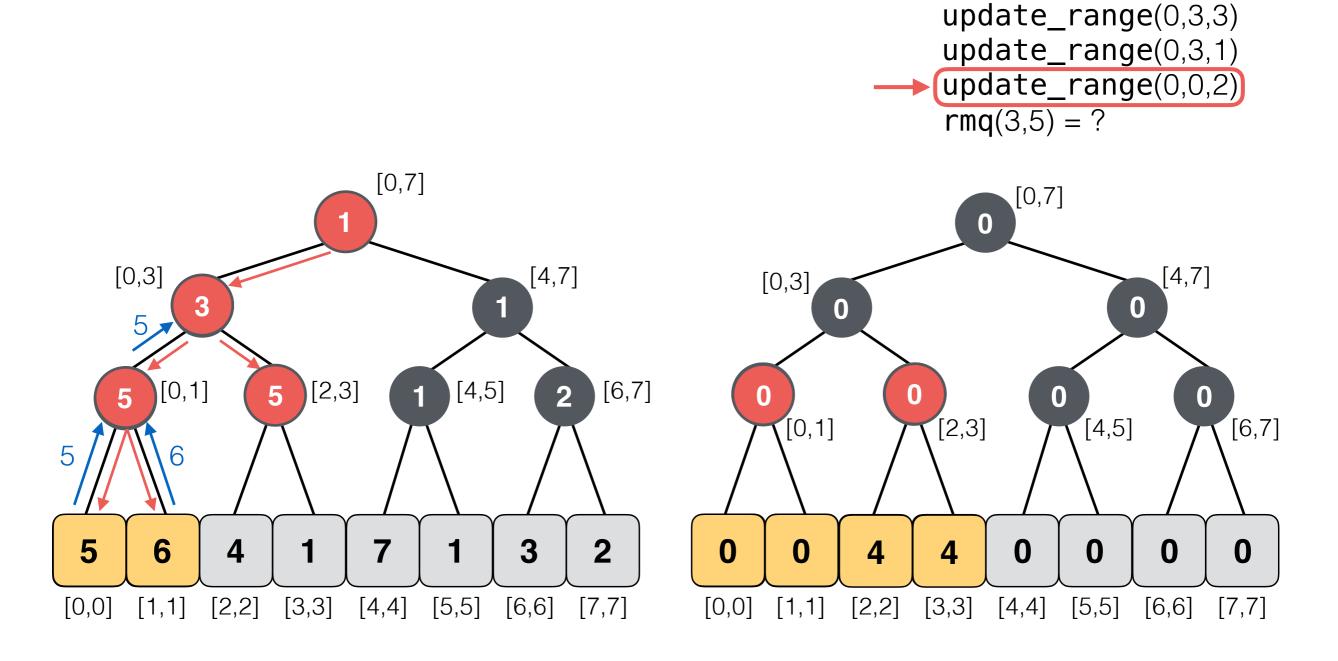
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



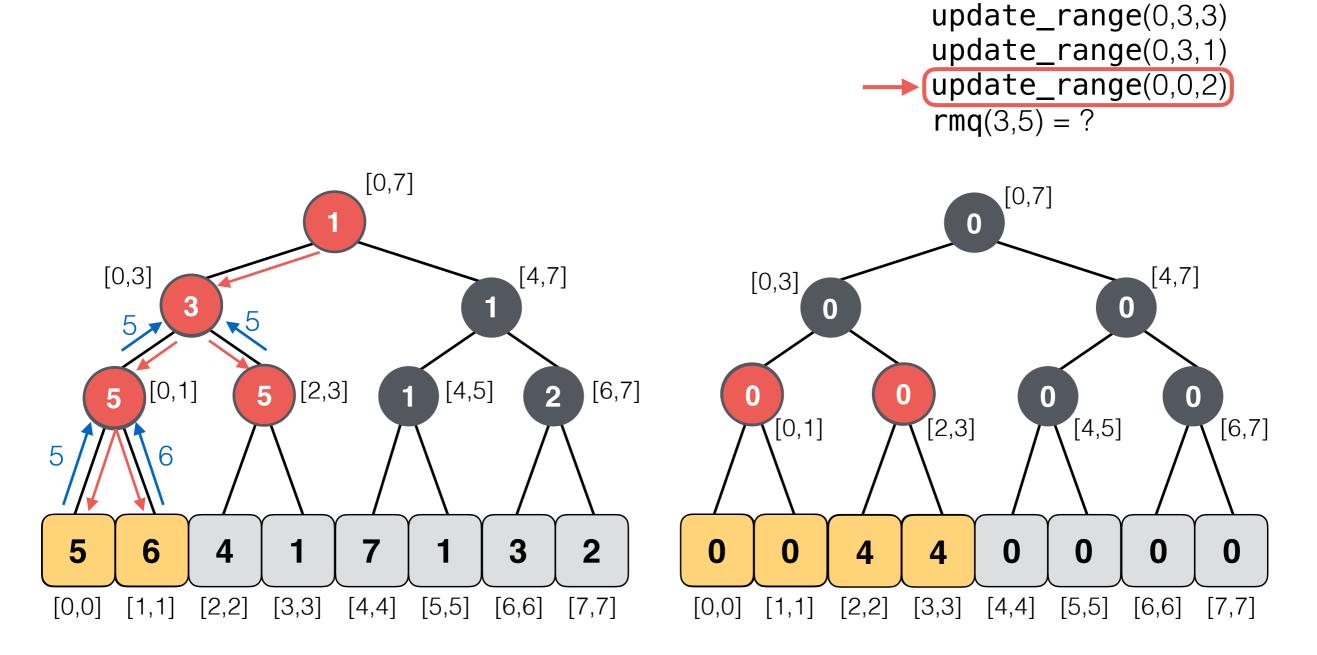
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



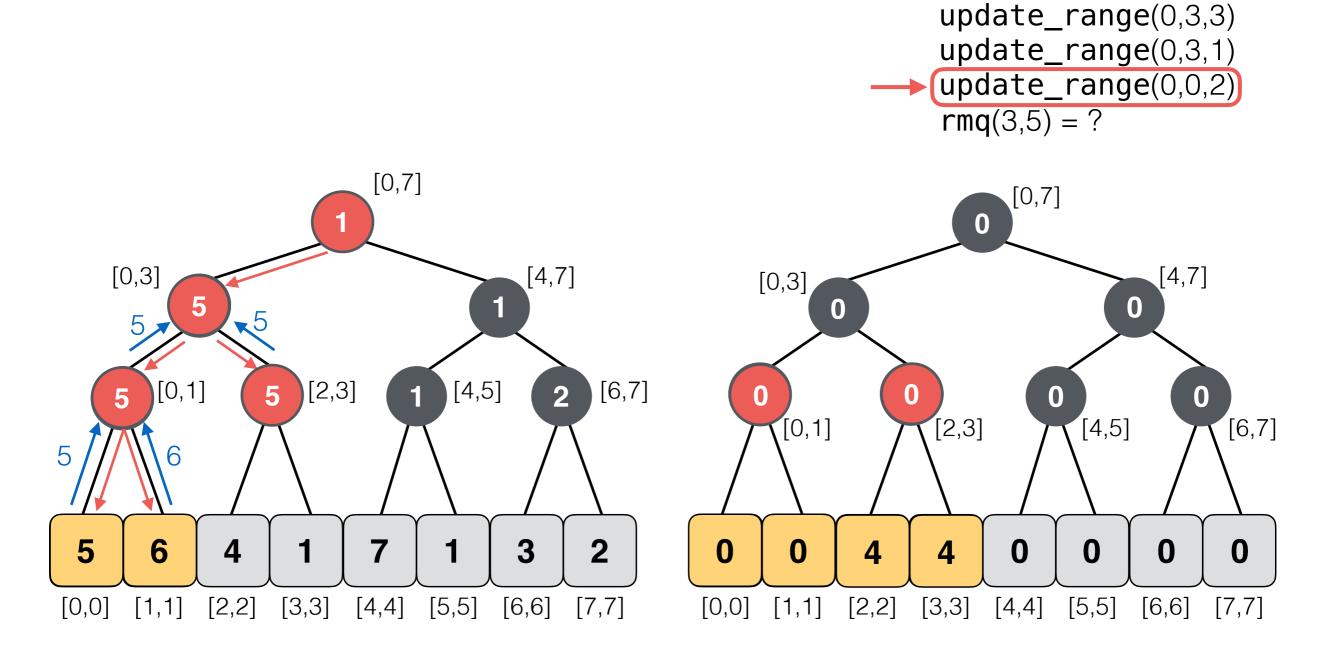
**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



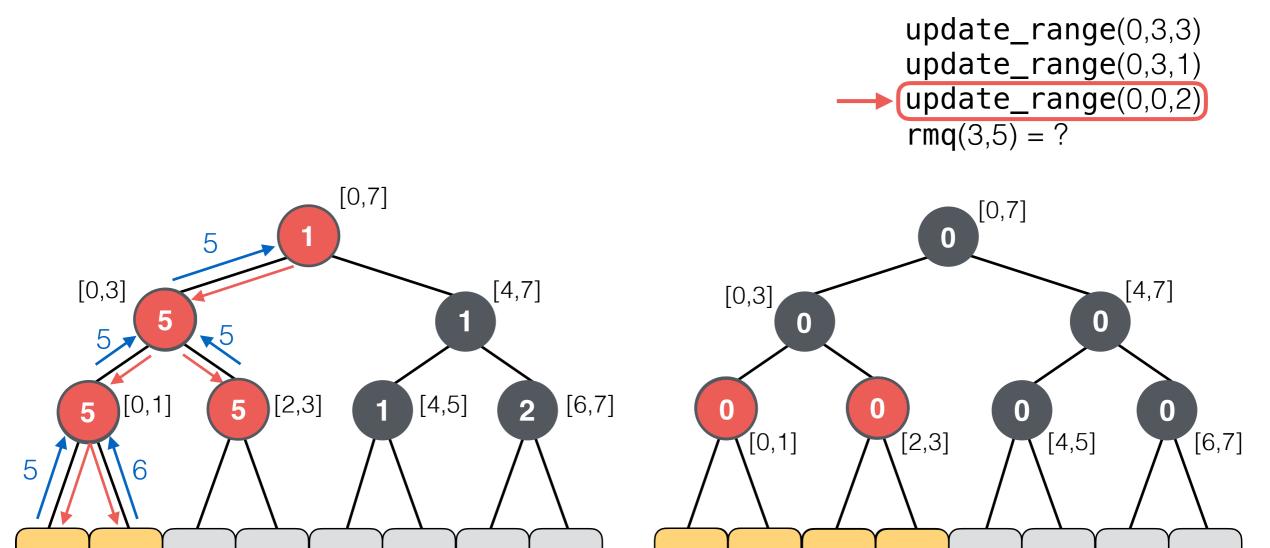
Segment Tree

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[3,3]

[4,4]

5

[0,0]

6

[1,1]

4

[2,2]

**Lazy Tree** 

4

[3,3]

0

[4,4]

0

[5,5]

0

[6,6]

0

0

[1,1]

4

[2,2]

0

[0,0]

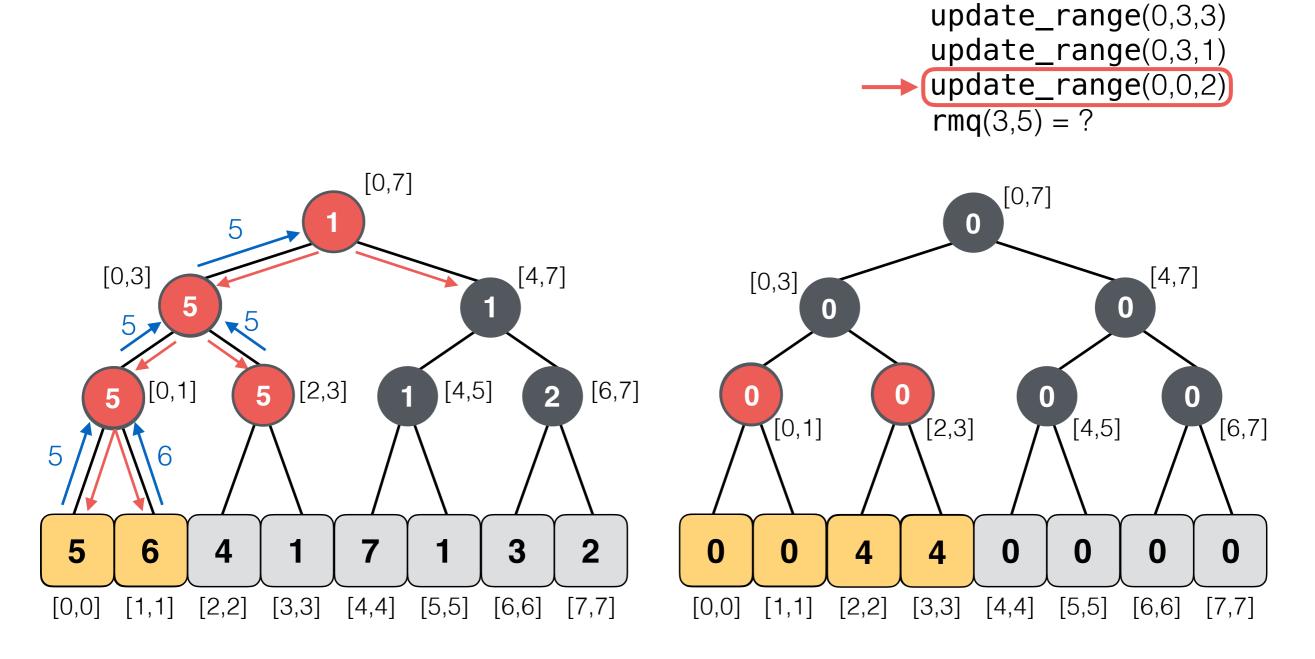
3

[6,6]

[7,7]

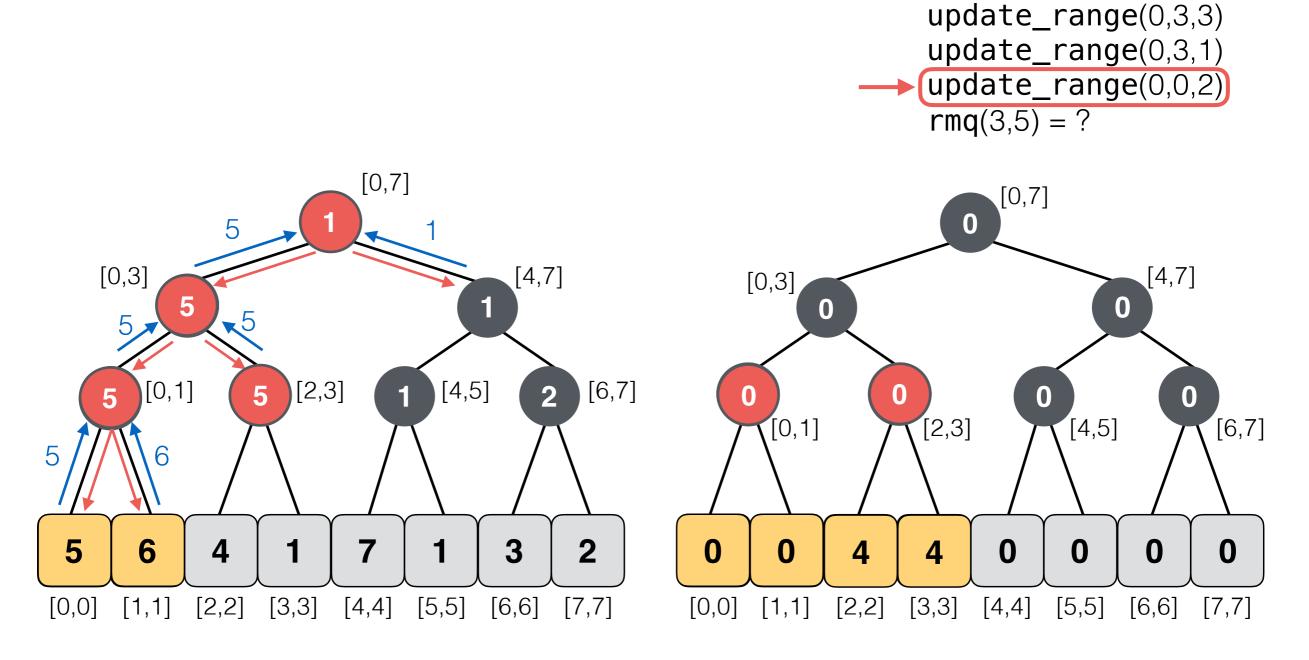
[5,5]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



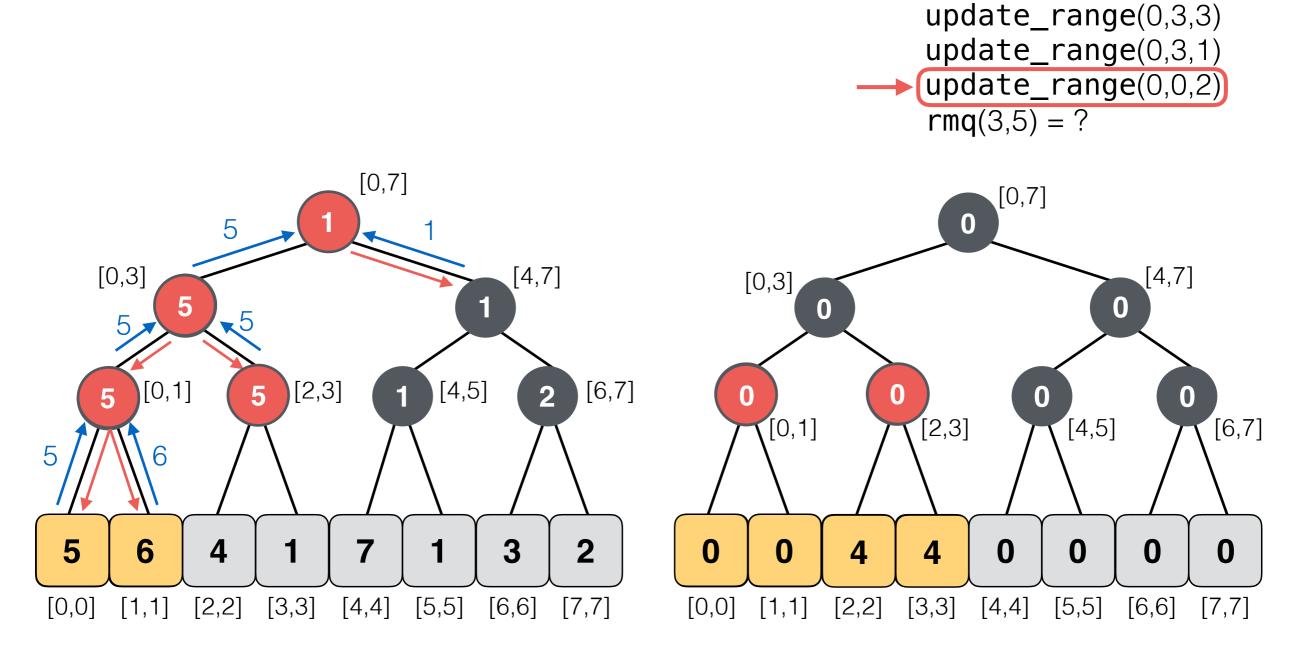
Segment Tree

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



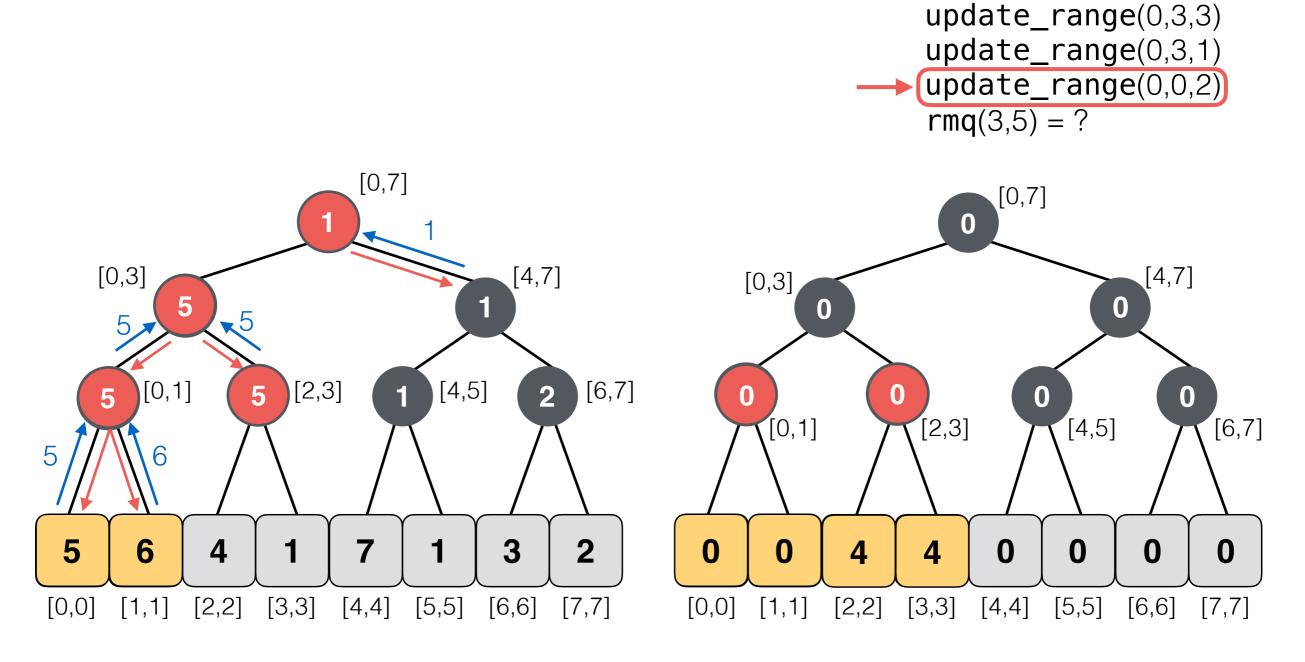
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



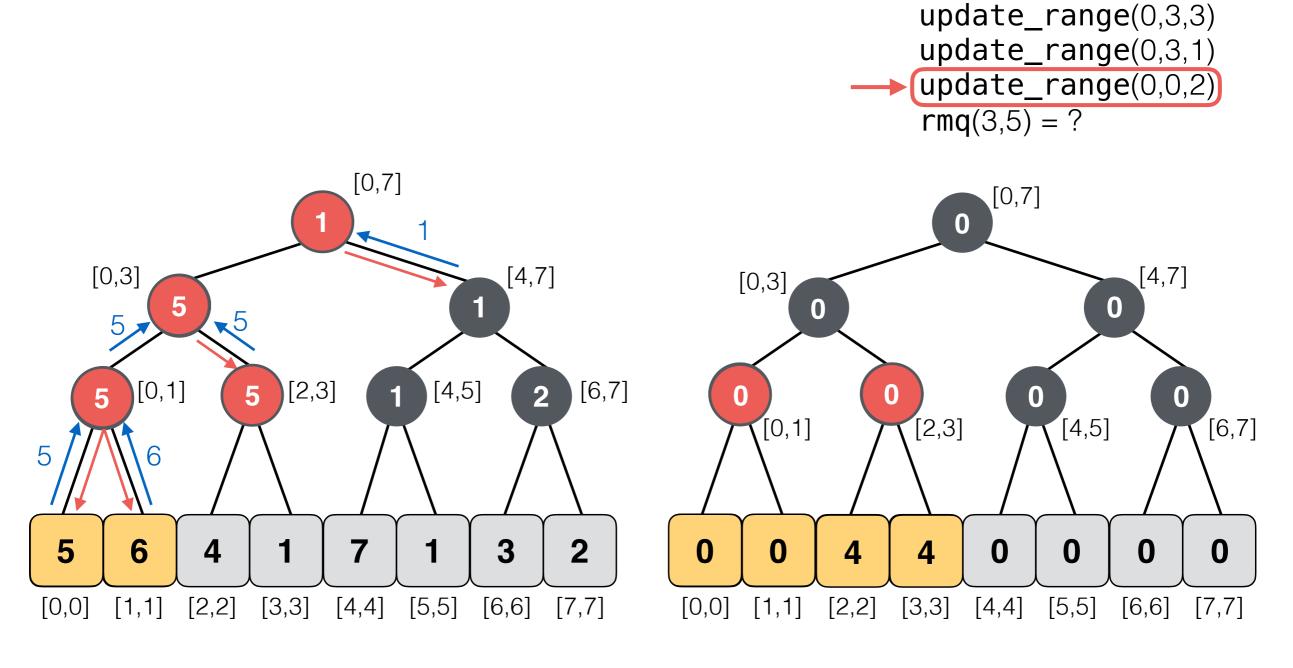
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



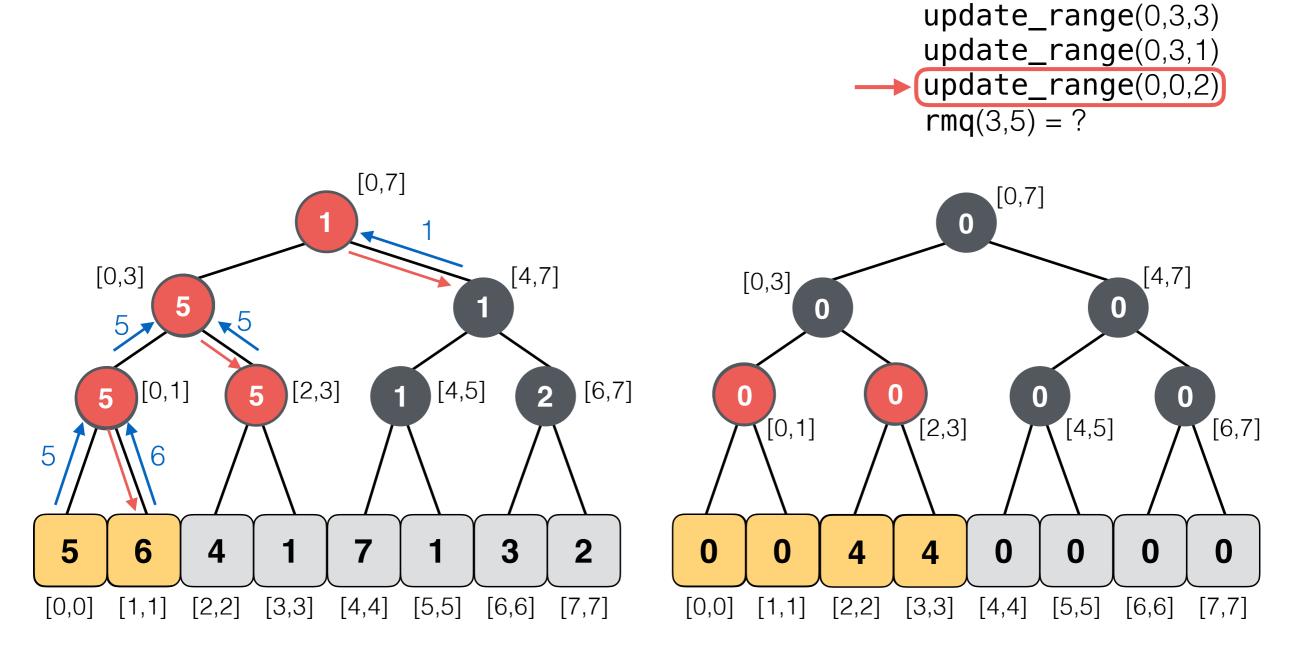
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



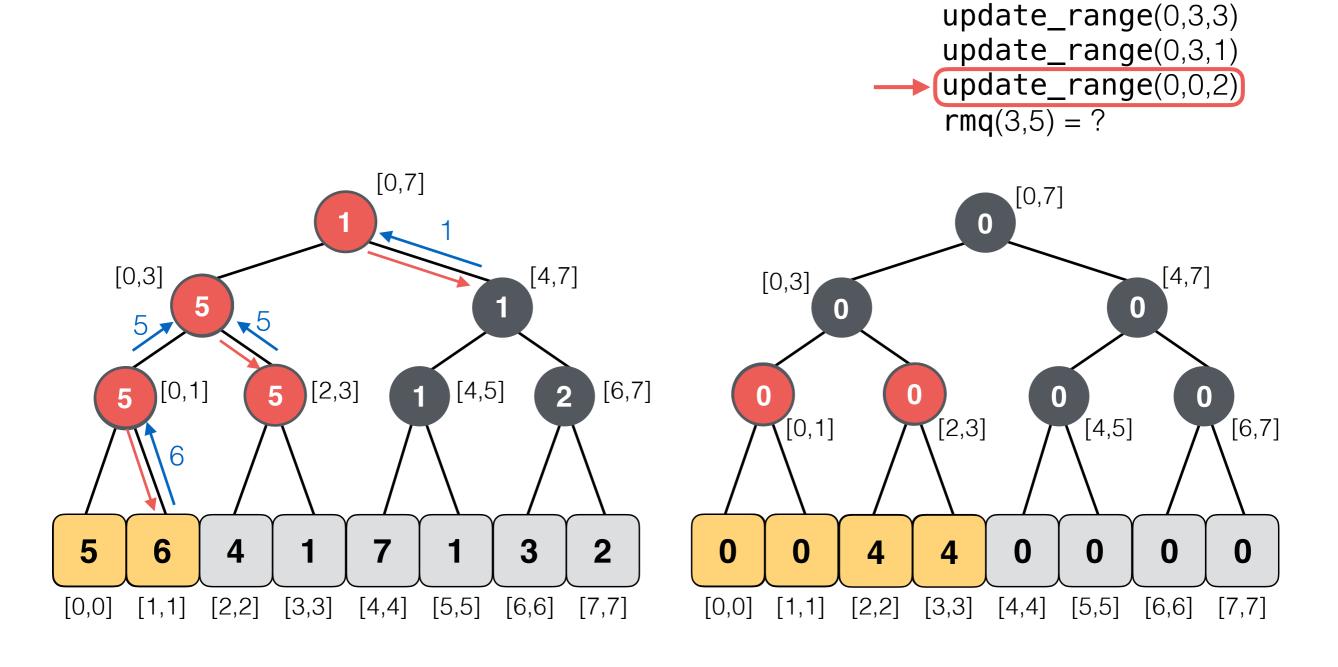
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



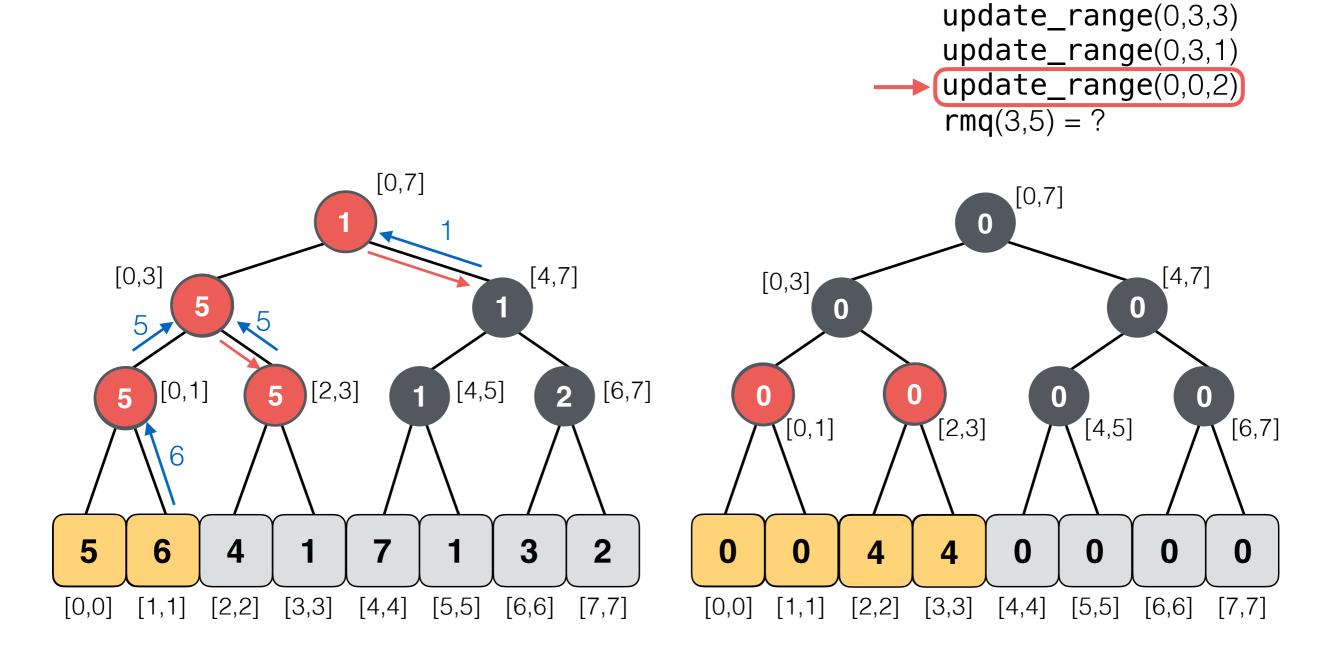
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



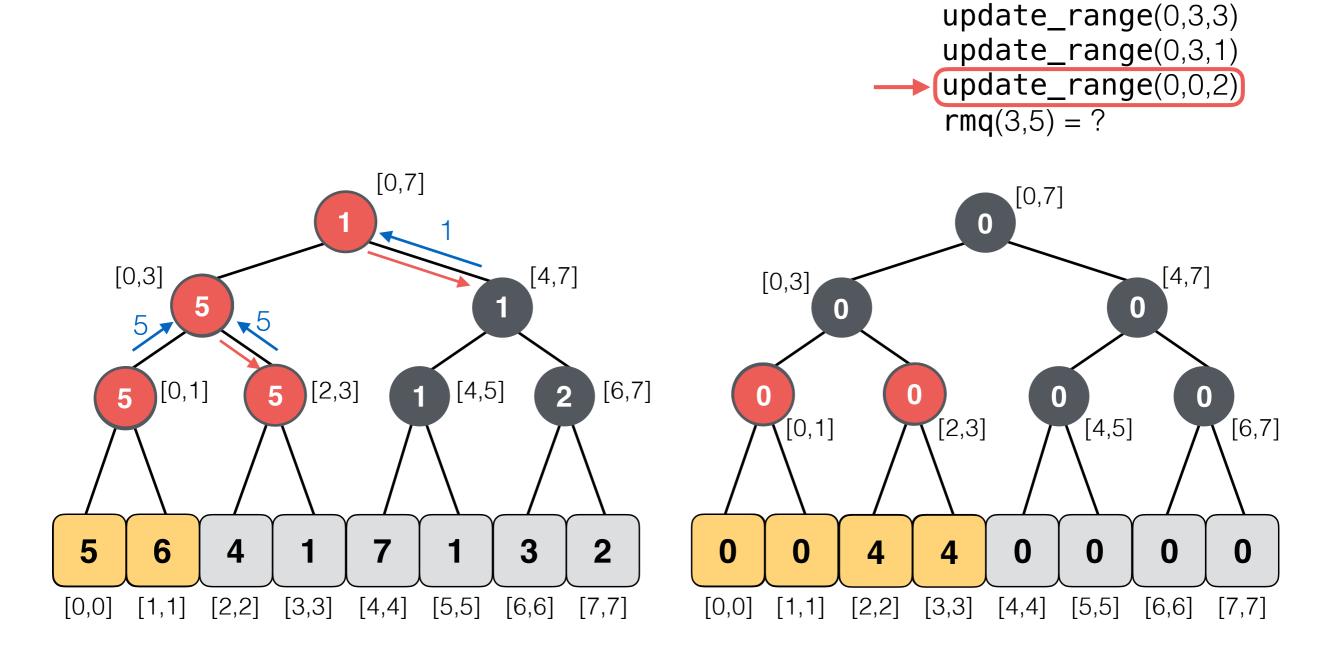
**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



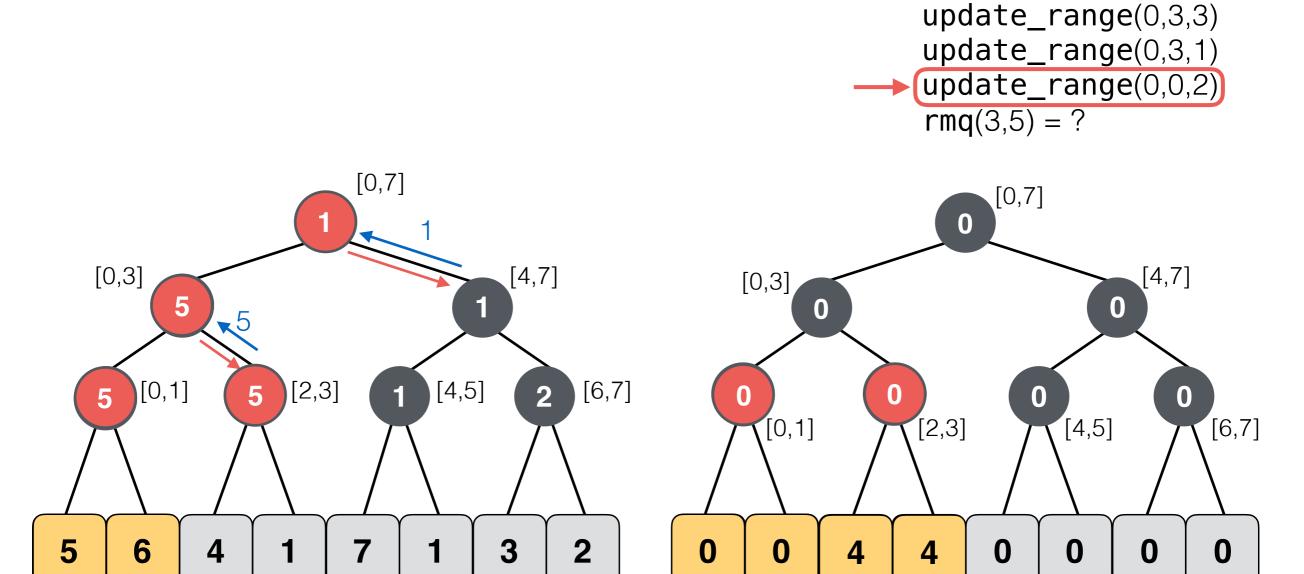
**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[5,5]

[4,4]

[3,3]

[0,0]

[1,1]

[2,2]

**Lazy Tree** 

[4,4]

[5,5]

[6,6]

[3,3]

[0,0]

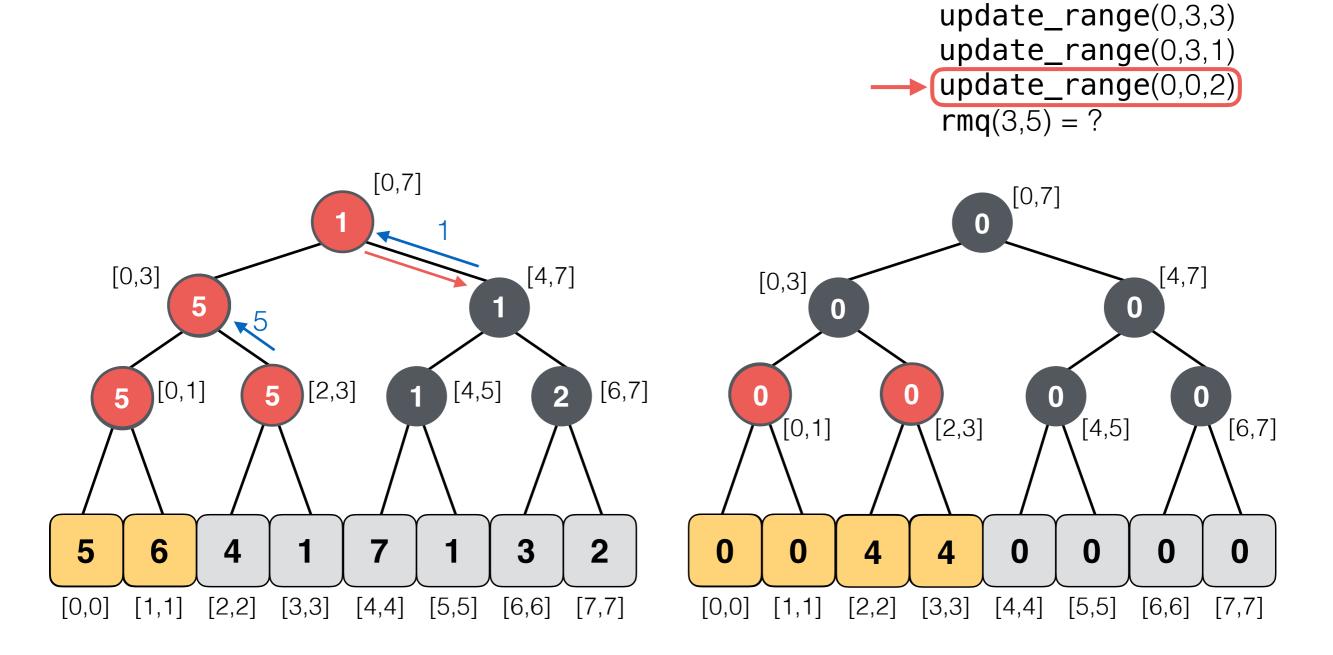
[1,1]

[2,2]

[7,7]

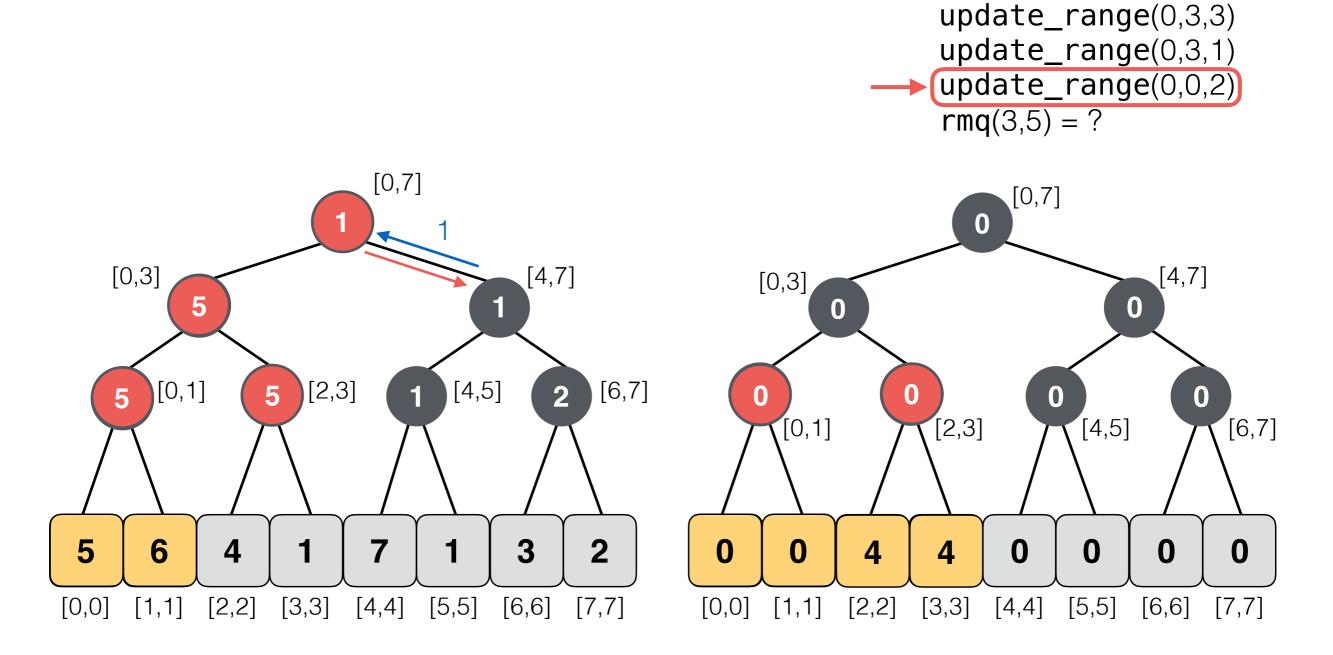
[6,6]

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



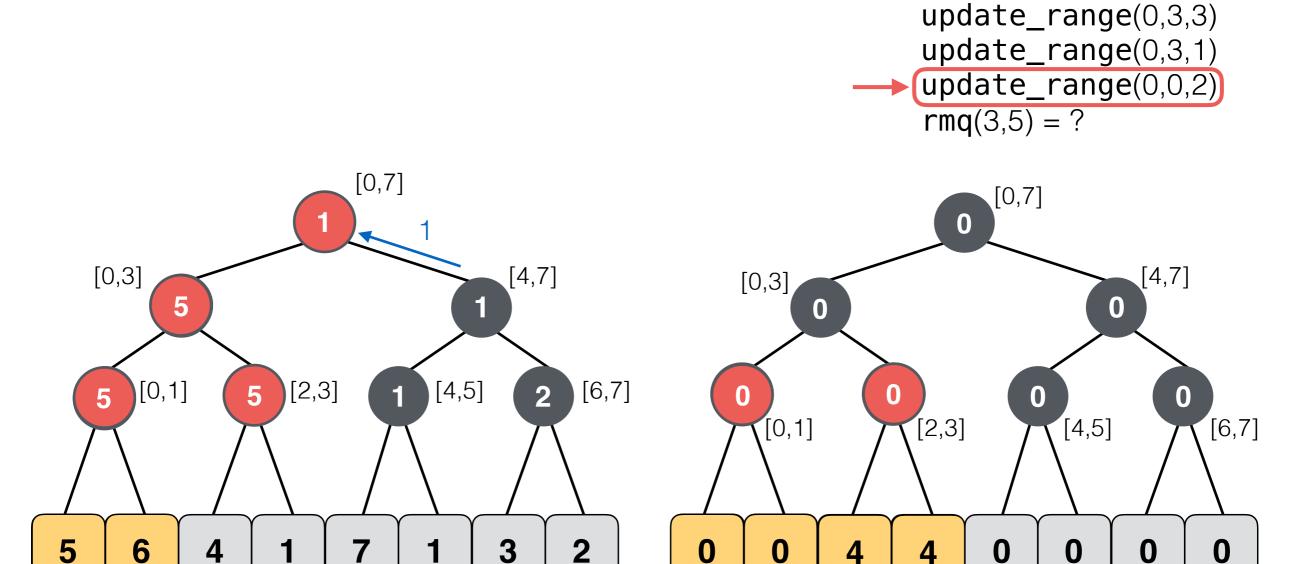
**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

[5,5]

[4,4]

[3,3]

[0,0]

[1,1]

[2,2]

**Lazy Tree** 

[4,4]

[5,5]

[6,6]

[3,3]

[0,0]

[1,1]

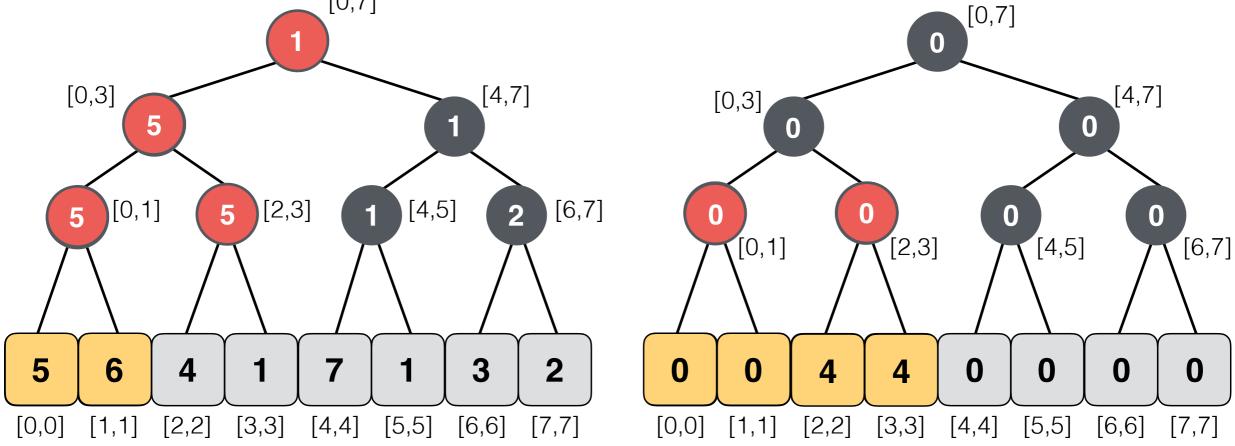
[2,2]

[7,7]

[6,6]

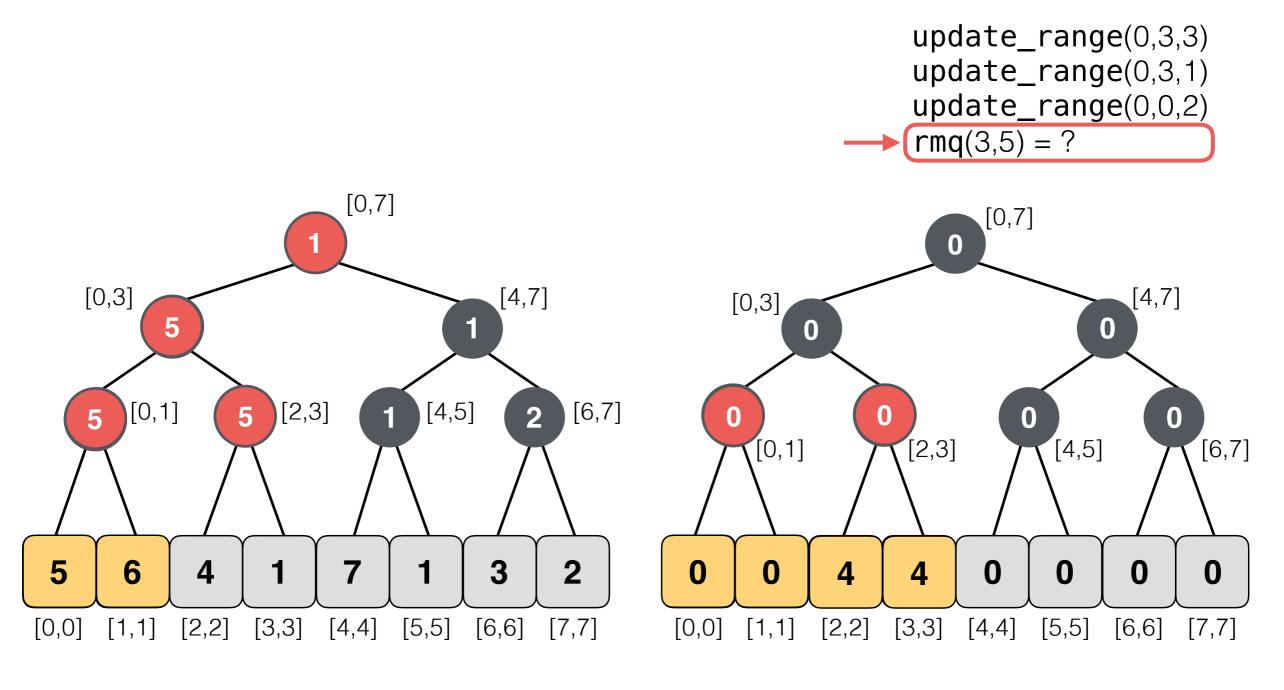
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.





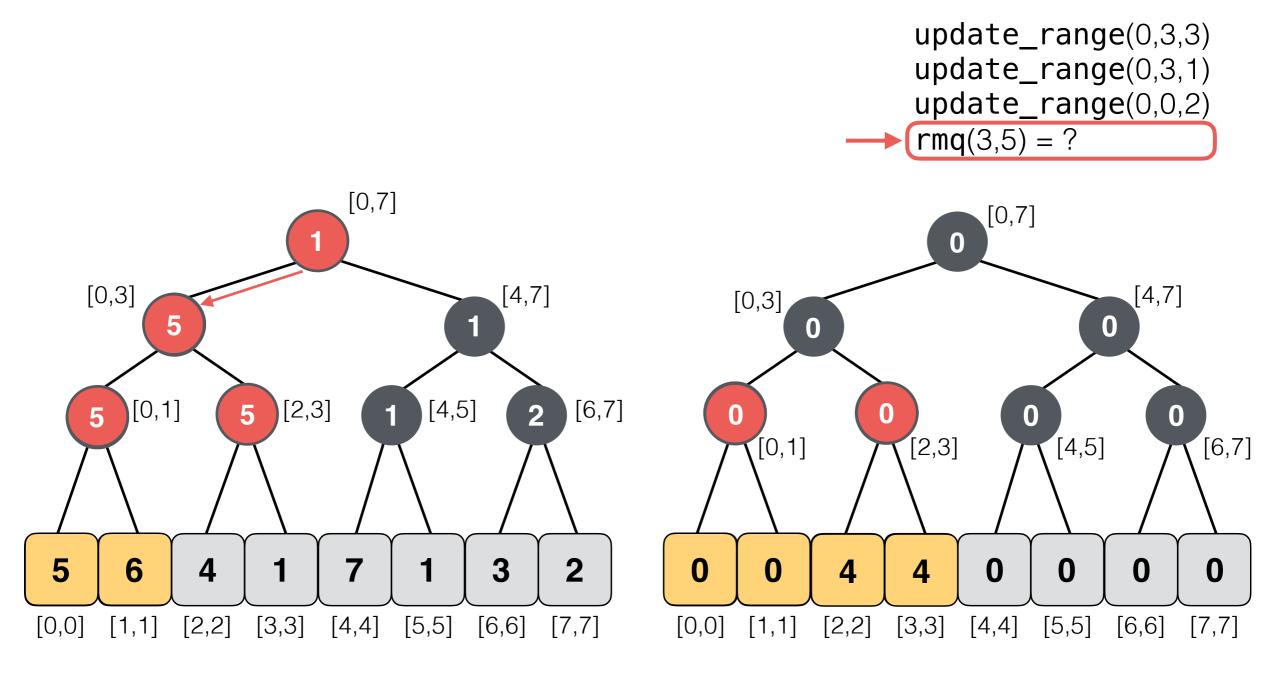
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



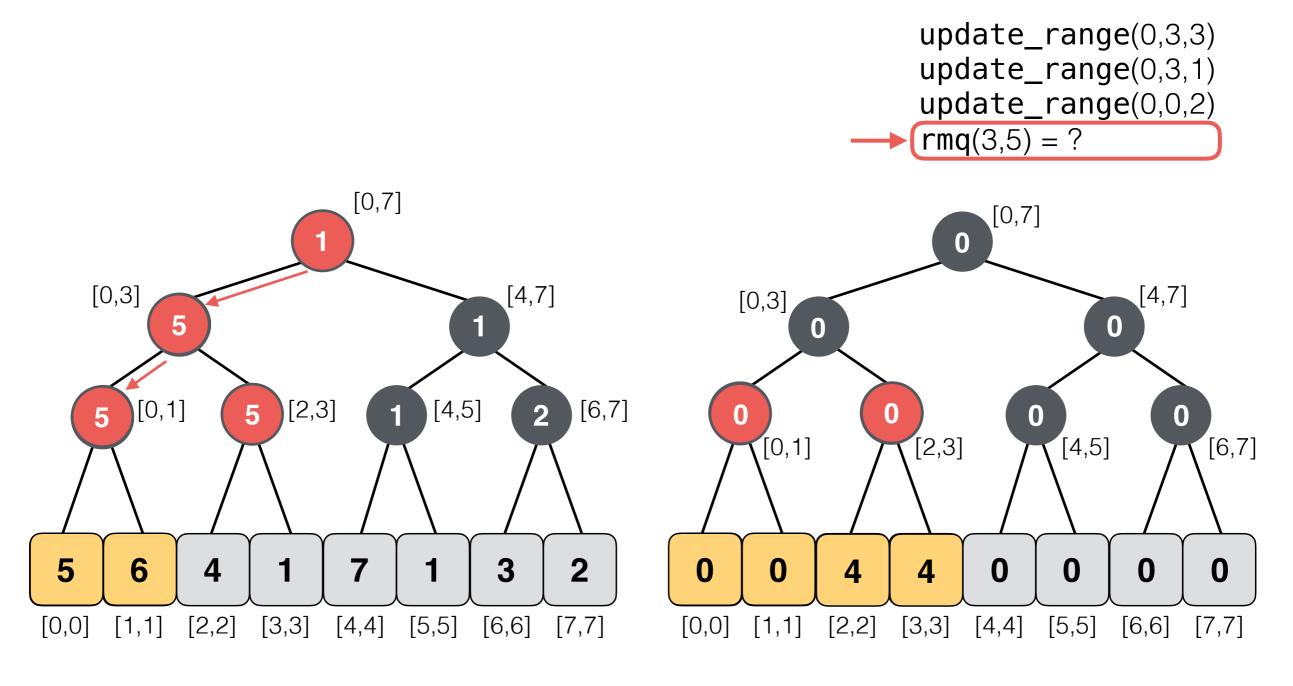
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



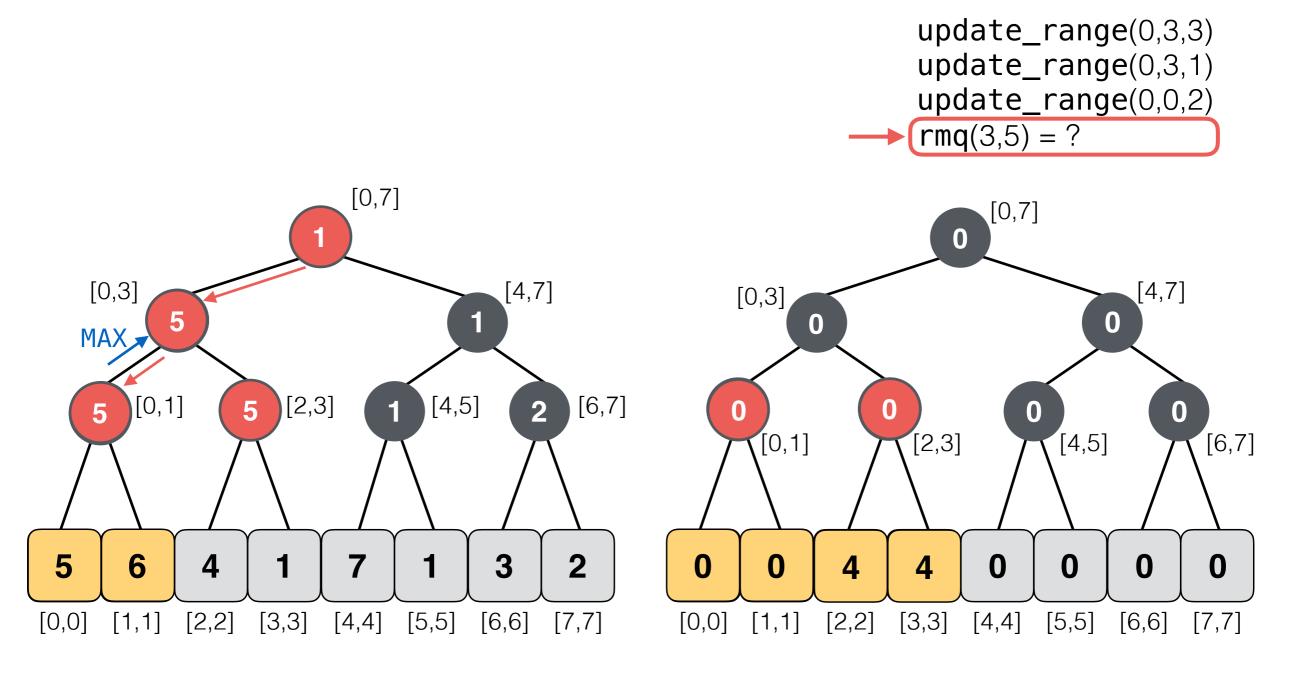
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



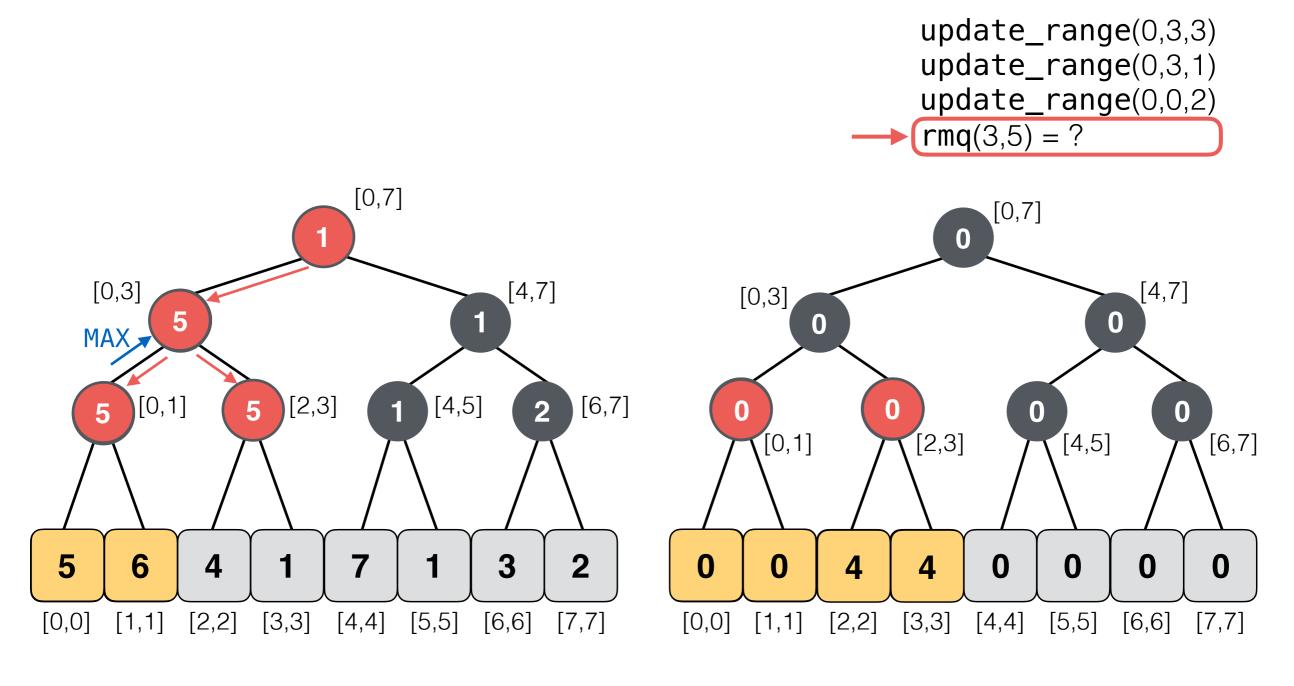
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



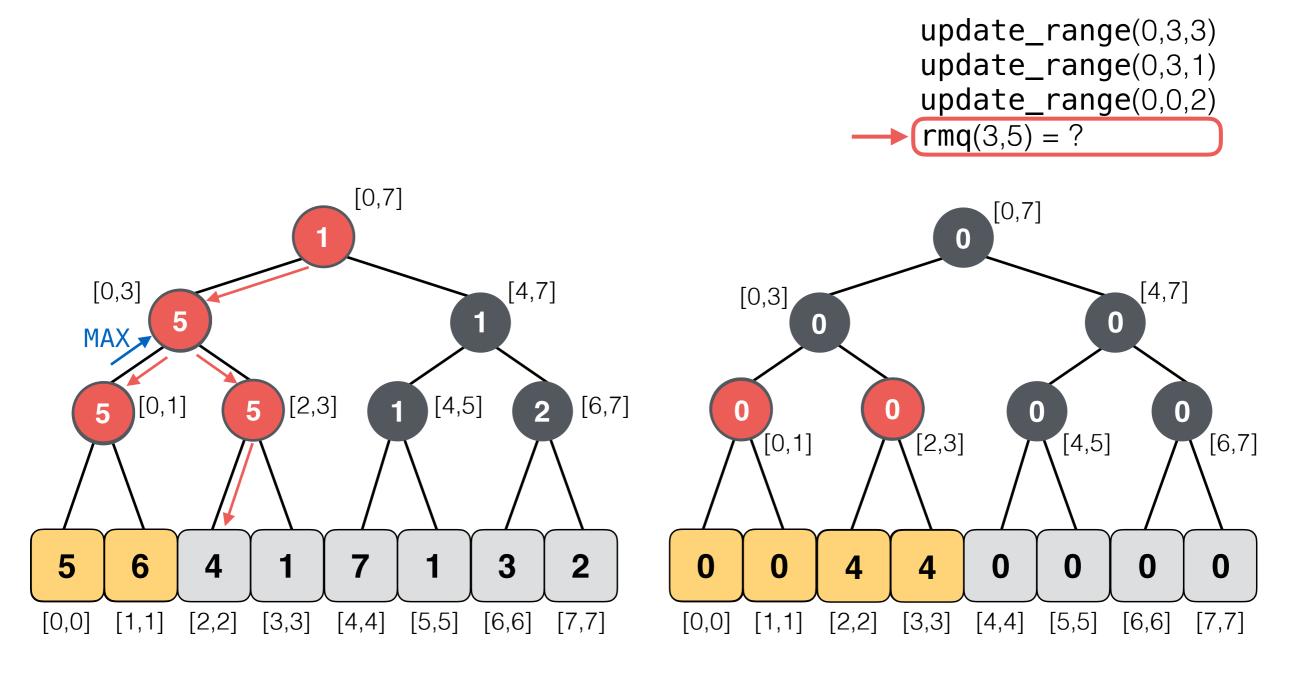
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



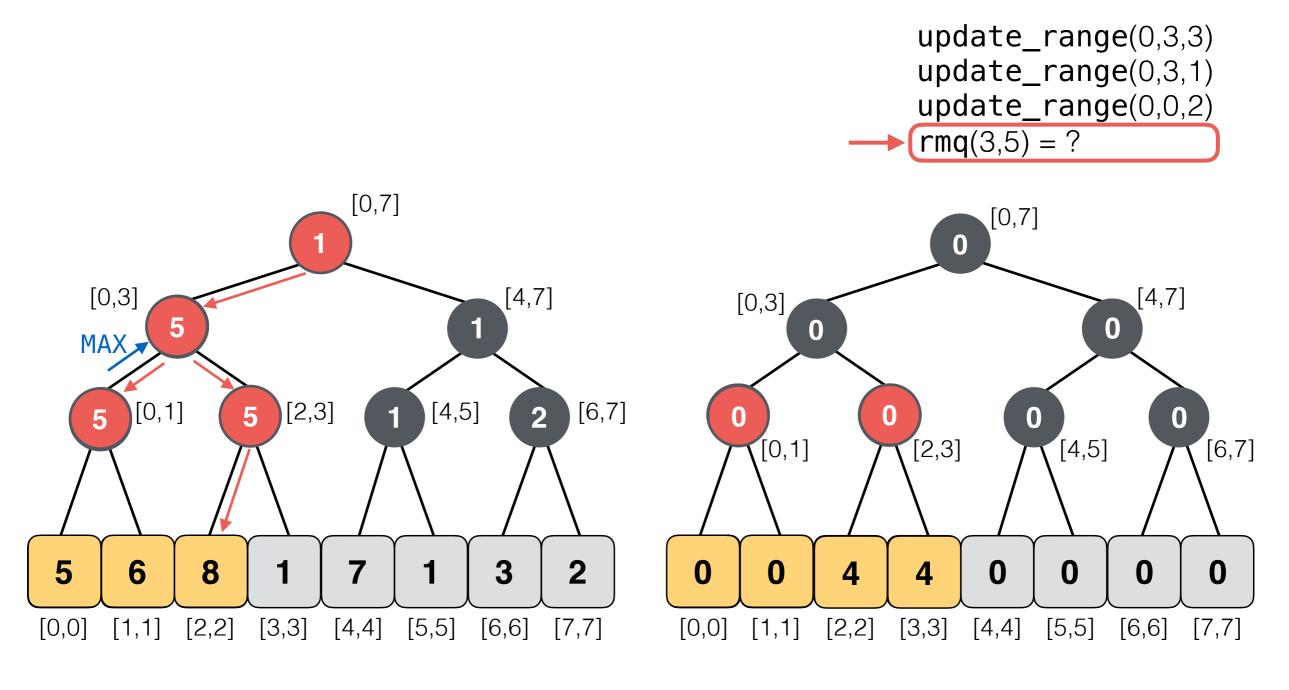
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



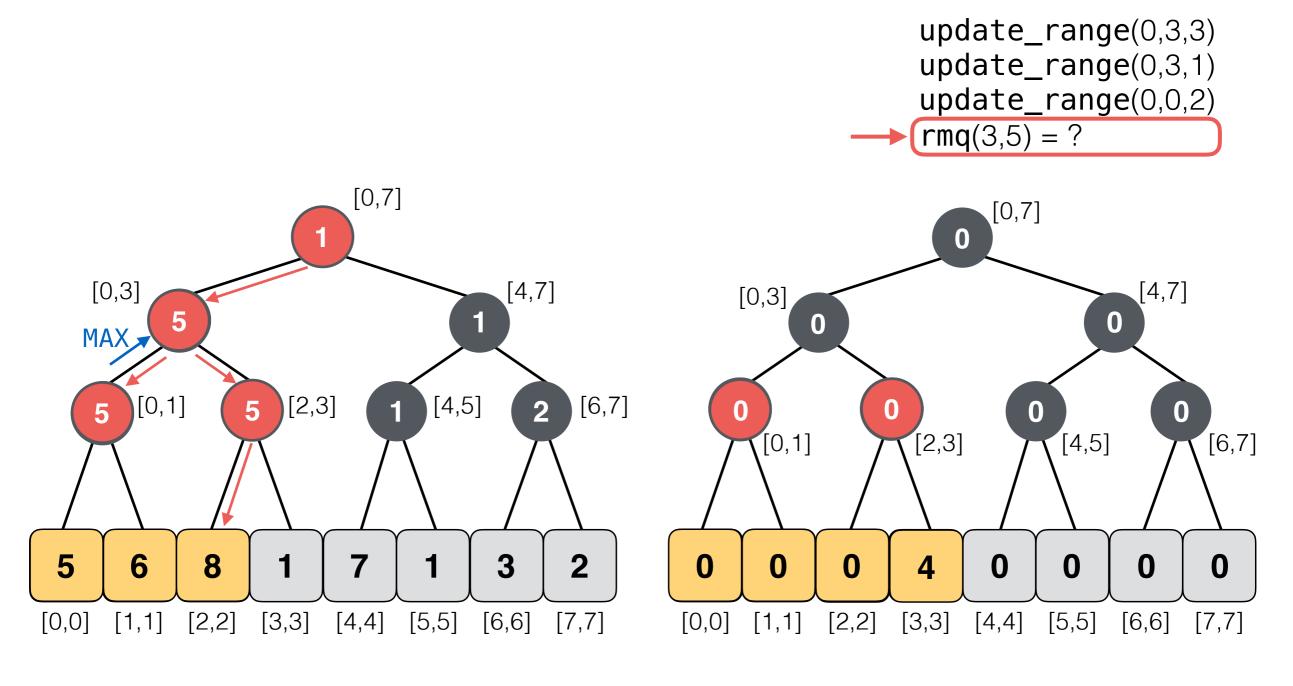
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



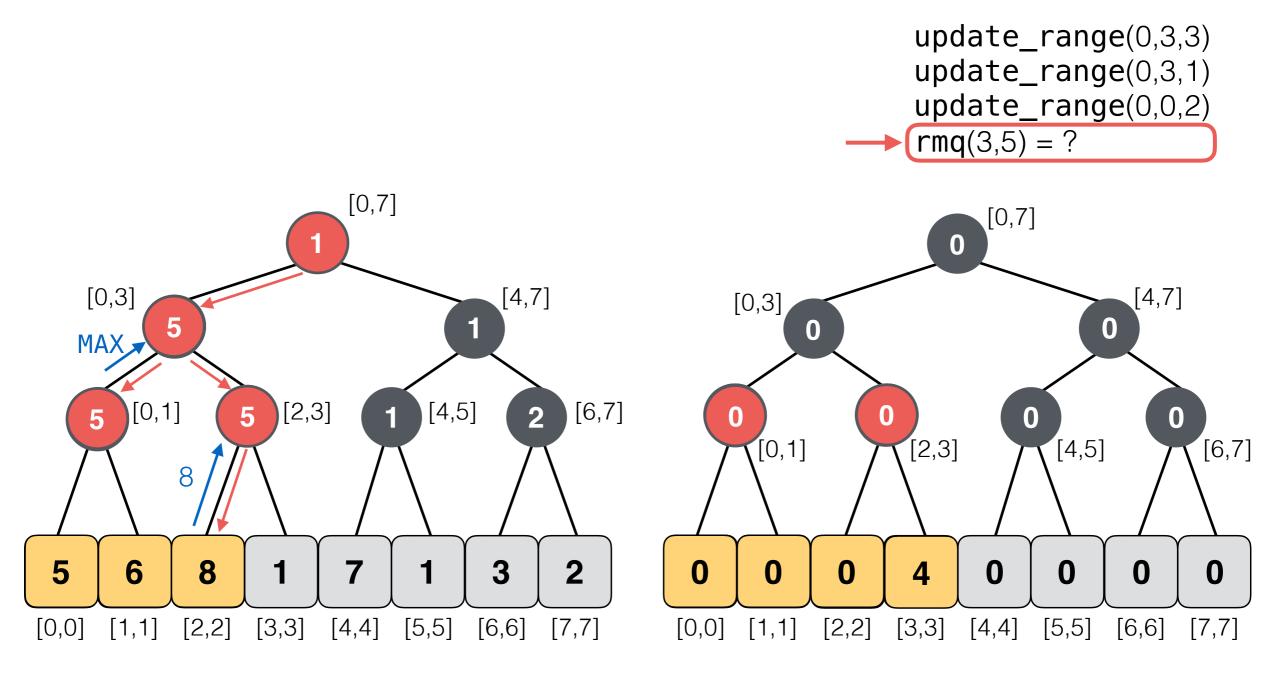
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

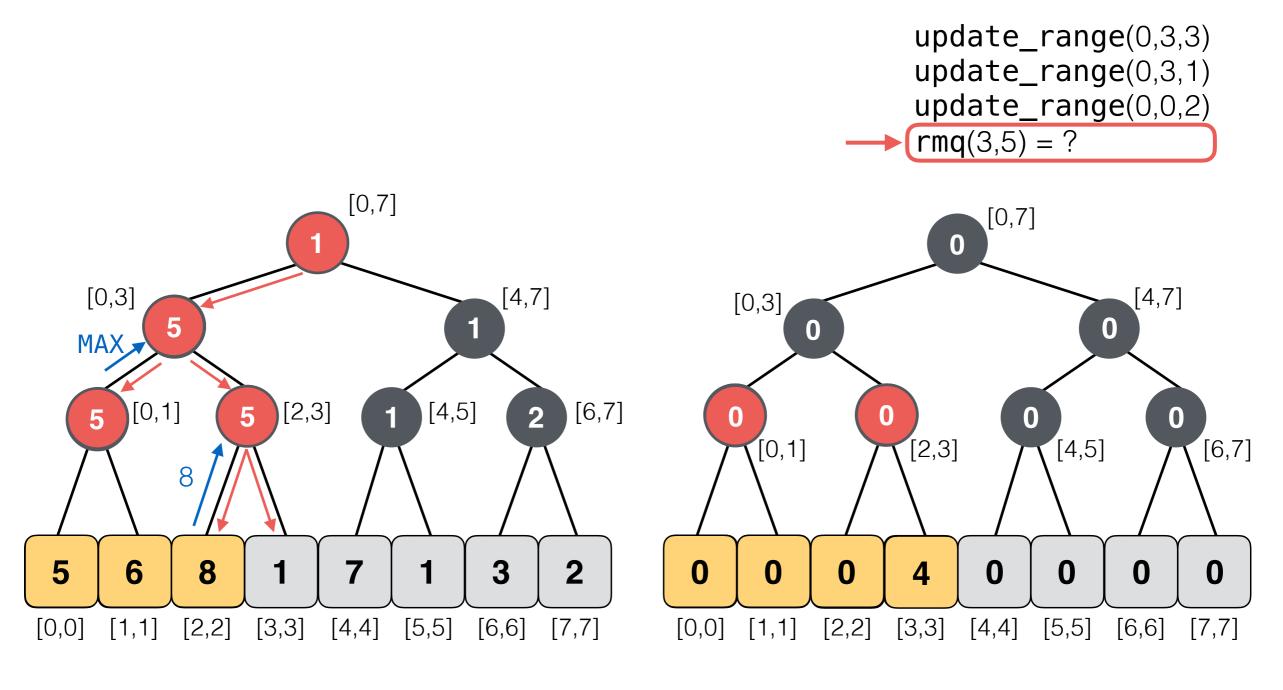
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



13

**Lazy Tree** 

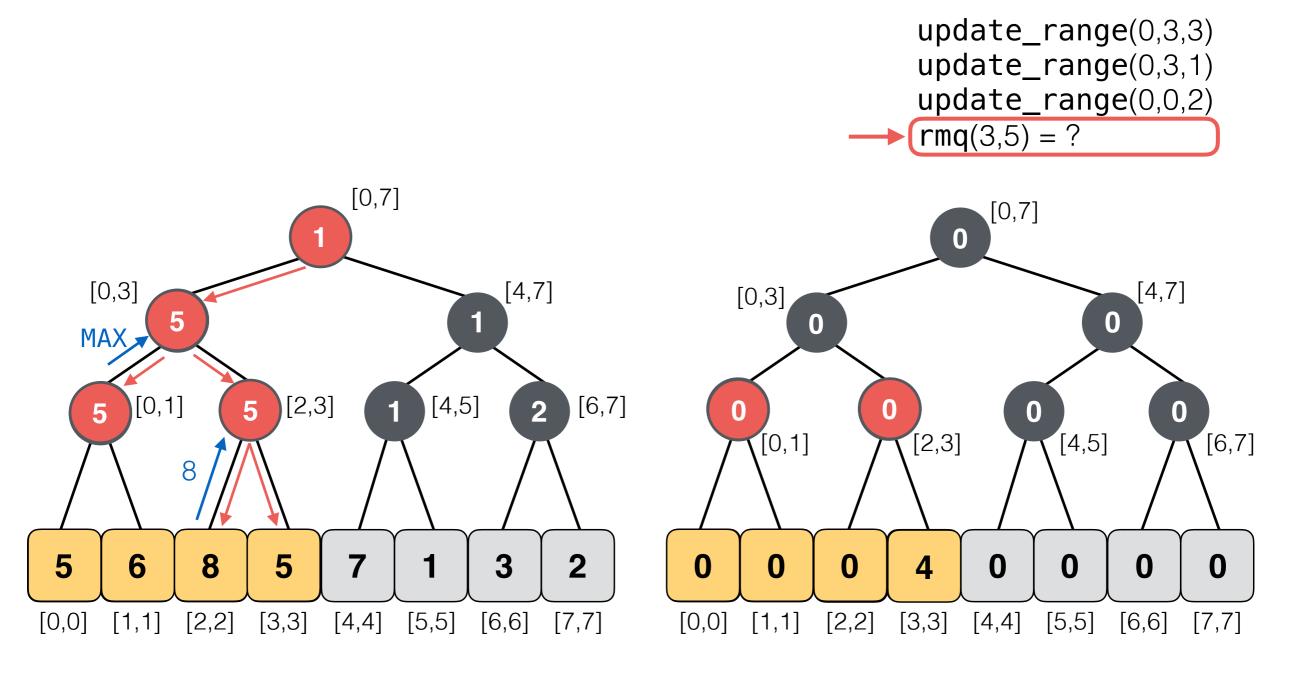
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



13

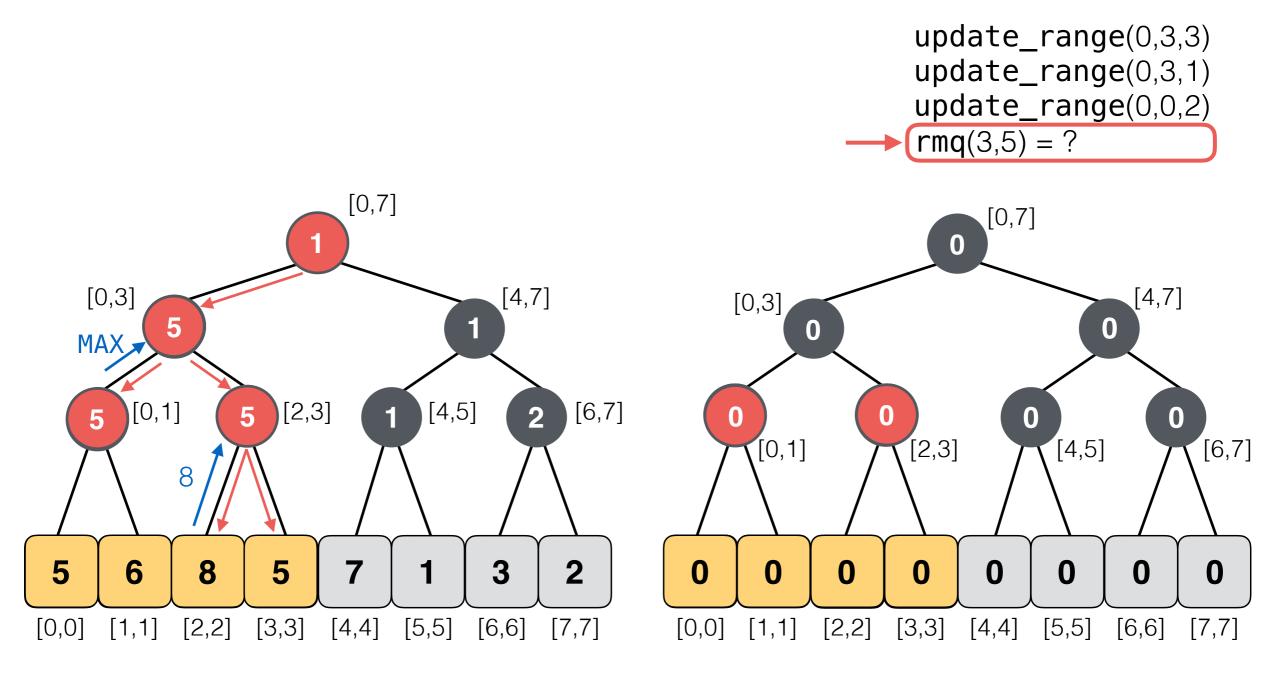
**Lazy Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



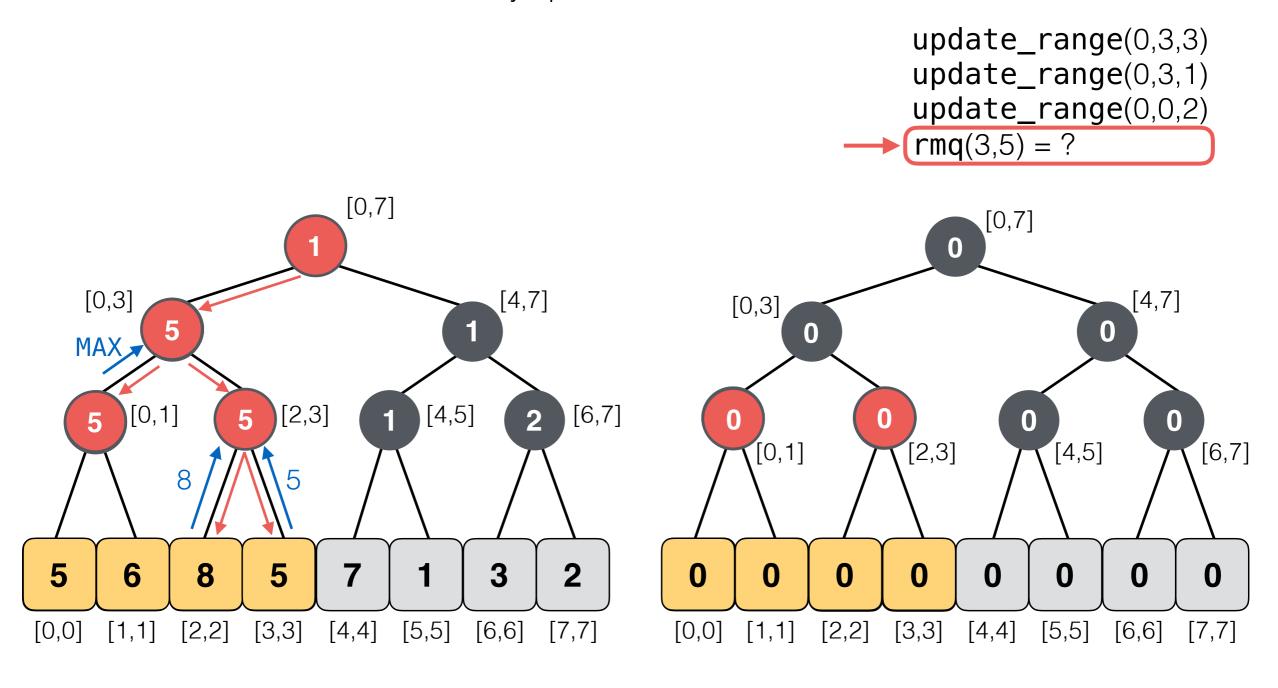
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



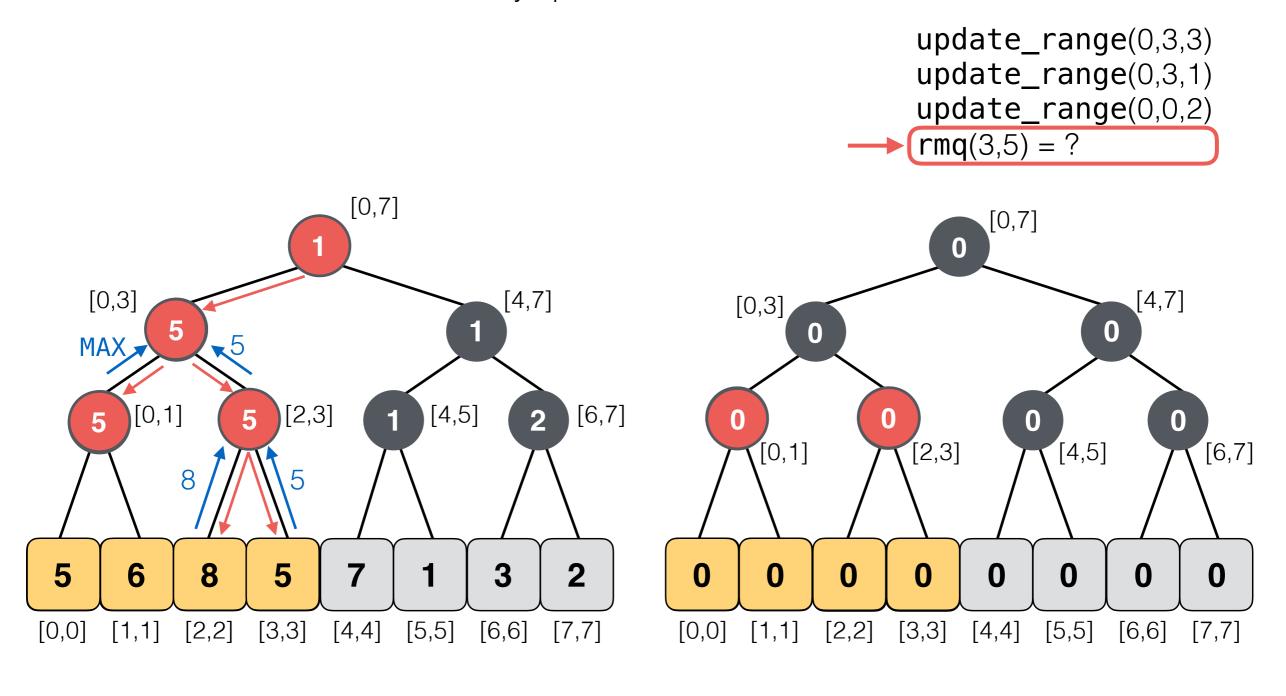
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



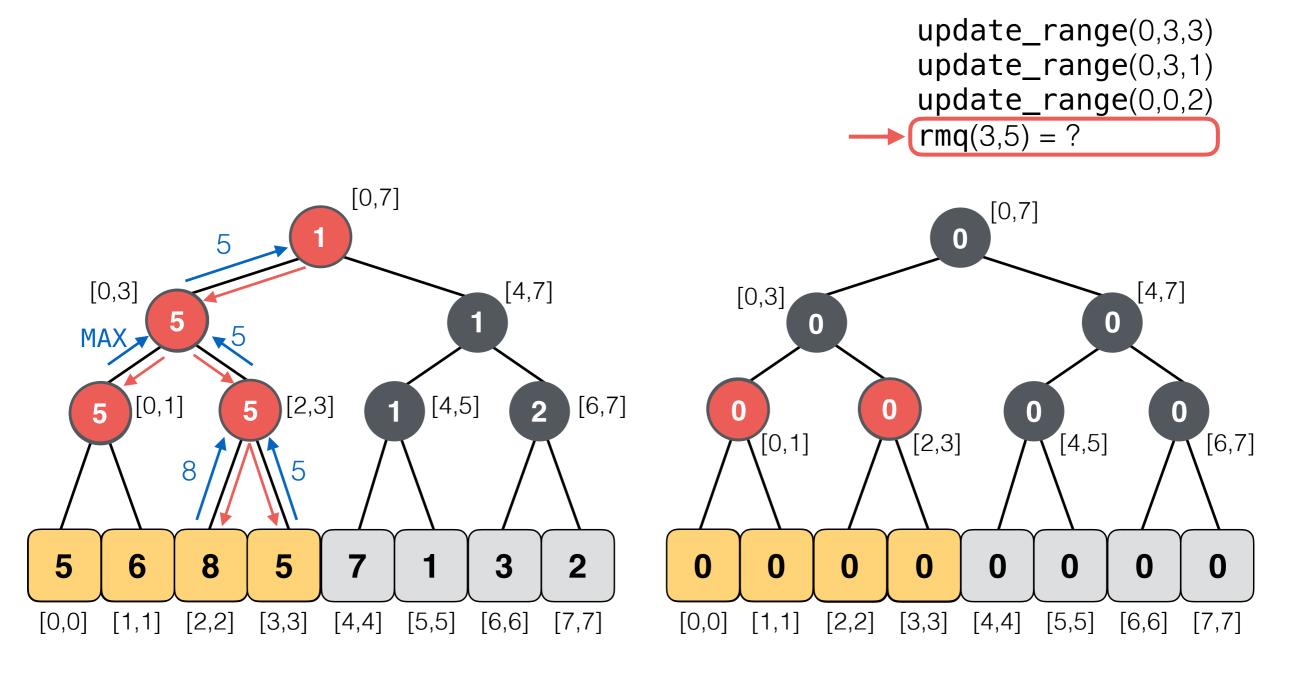
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



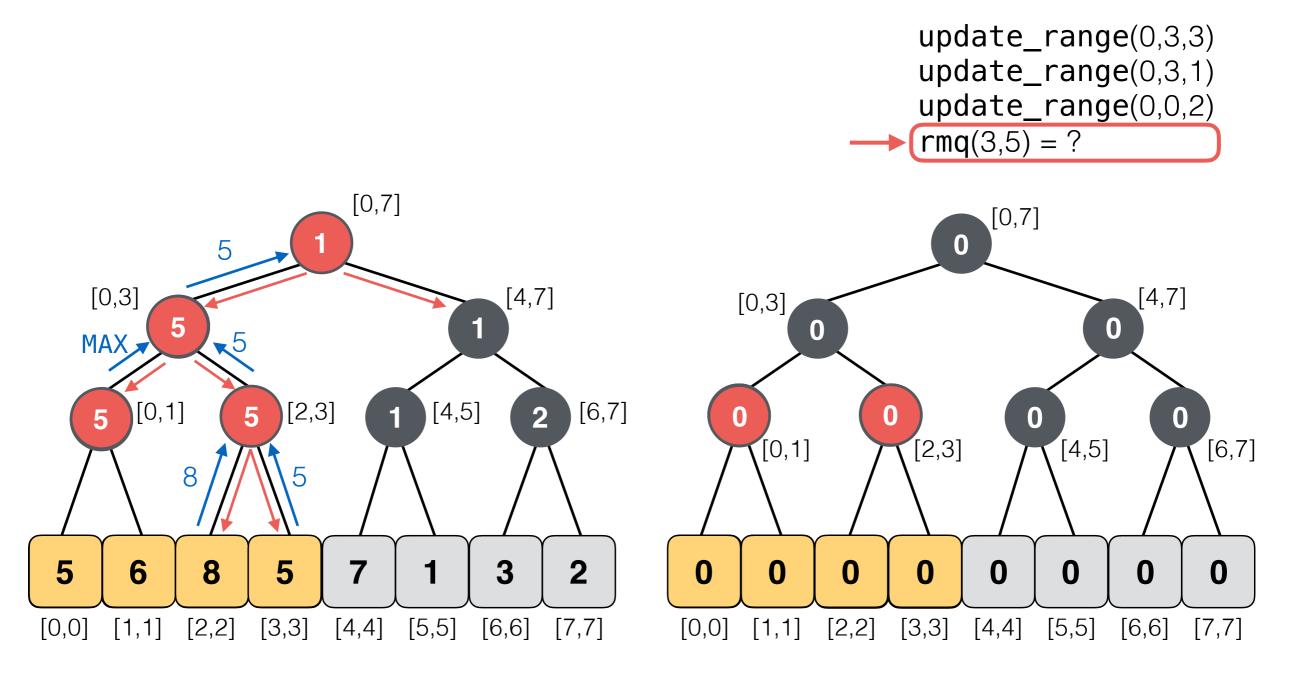
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



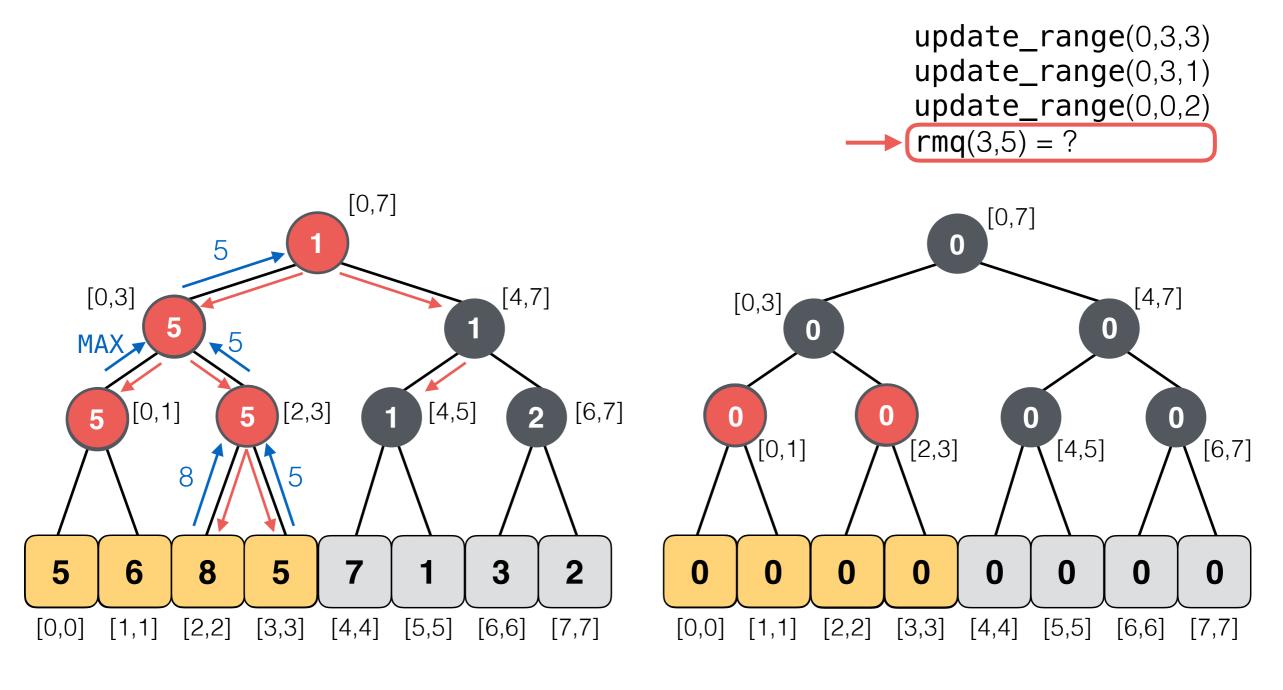
**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

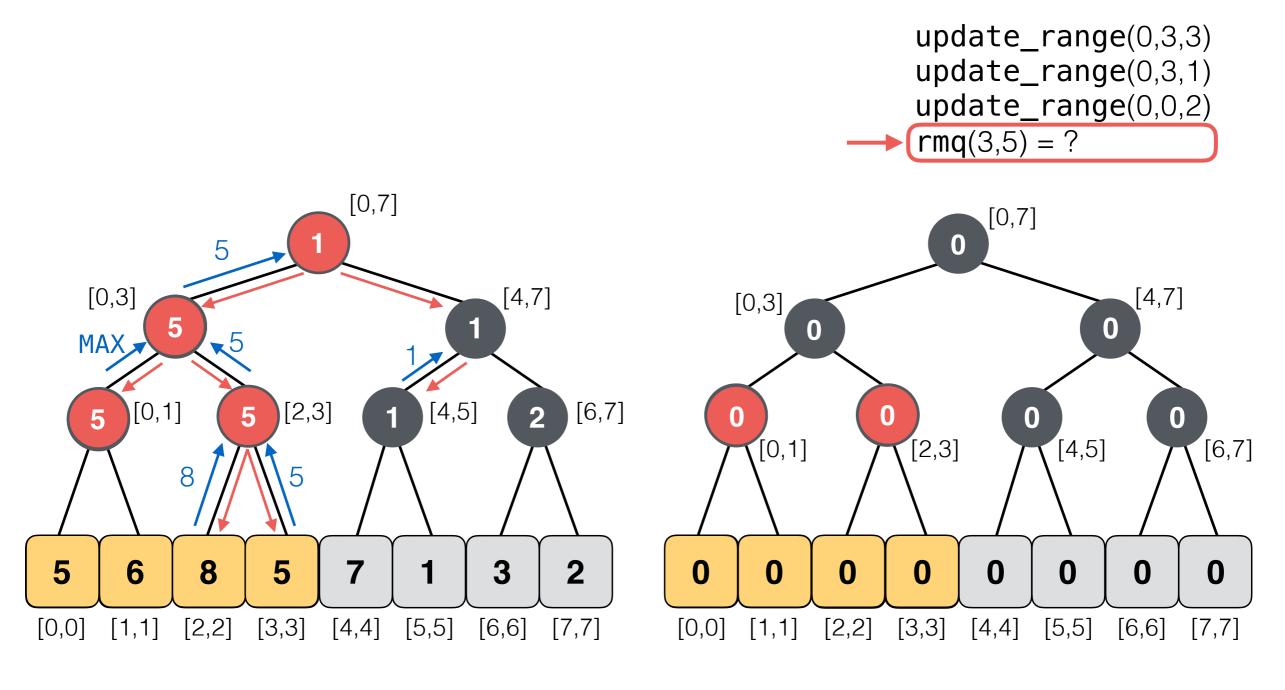
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



13

**Lazy Tree** 

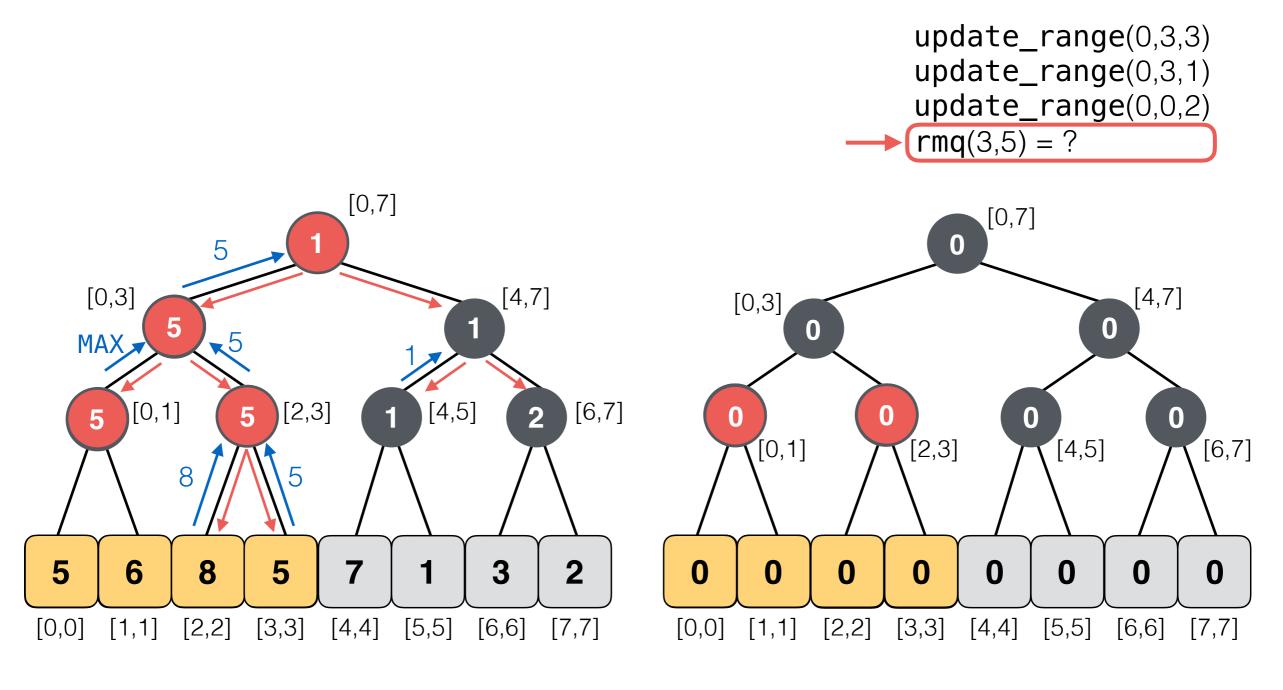
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Lazy Tree** 

13

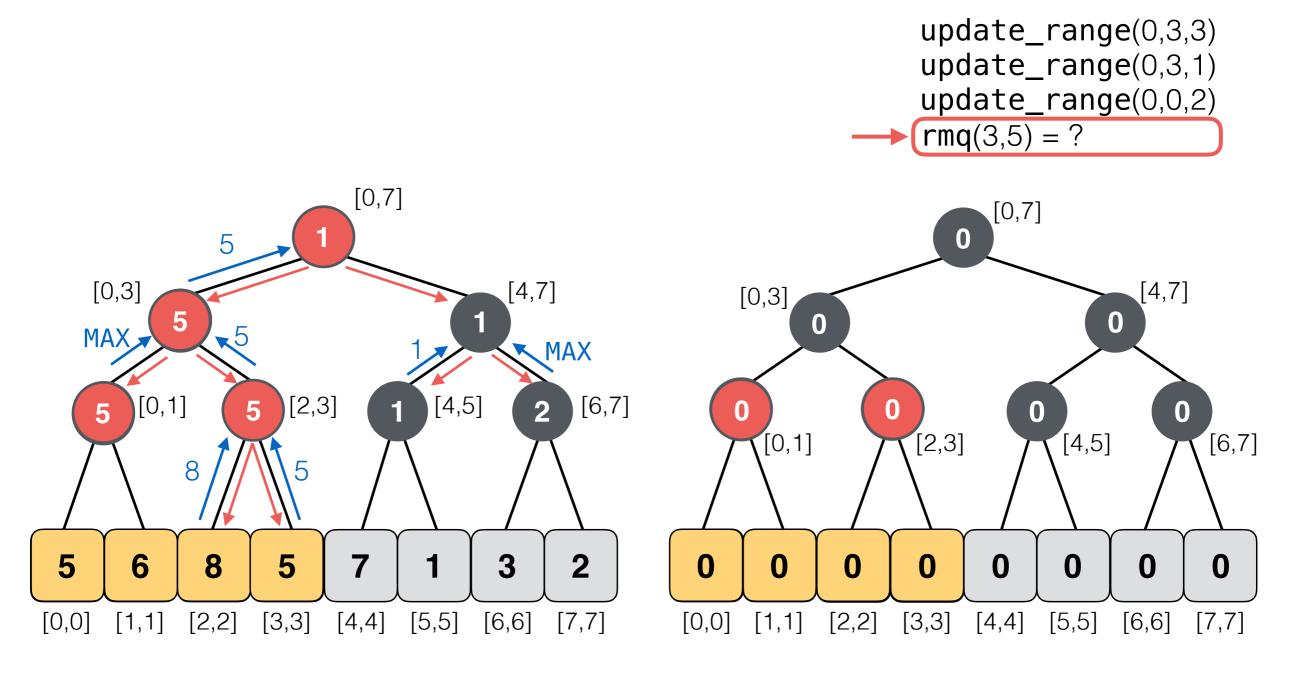
**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Lazy Tree** 

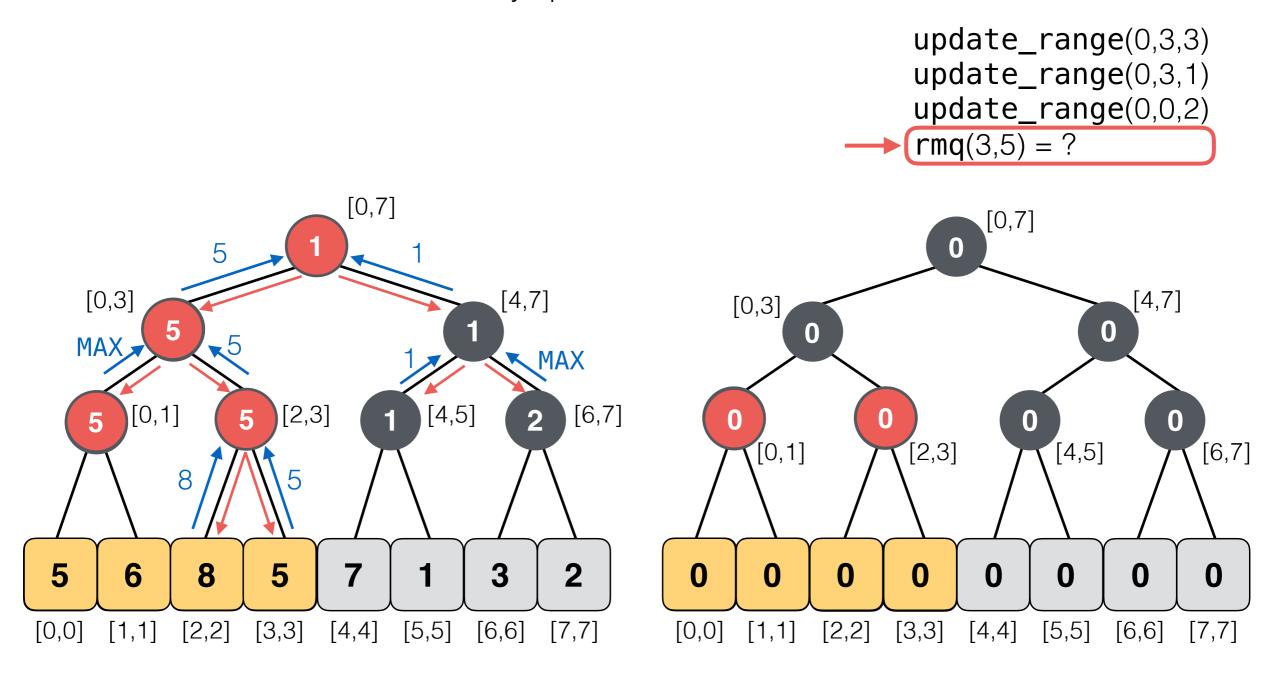
13

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

**Avoid going down to the leaves and then up** updating the internal nodes. Only update when needed.



**Segment Tree** 

#### **Exercises**

**Implement lazy propagation** and test the difference in running time for a mix of updates/queries.

http://www.geeksforgeeks.org/lazy-propagation-in-segment-tree/

http://www.cdn.geeksforgeeks.org/segment-tree-set-1-sum-of-given-range/

#### References

#### Full segment tree code and benchmark at:

https://github.com/rossanoventurini/CompetitiveProgramming/tree/master/code/segment\_trees

#### Video lectures:

https://www.youtube.com/watch?v=ZBHKZF5w4YU&list=PLrmLmBdmllpv\_jNDXtJGYTPNQ2L1gdHxu&index=22 https://www.youtube.com/watch?v=xuoQdt5pHj0&index=23&list=PLrmLmBdmllpv\_jNDXtJGYTPNQ2L1gdHxu

