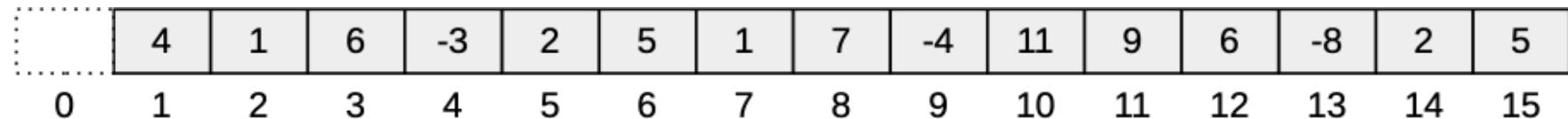


# Competitive Programming

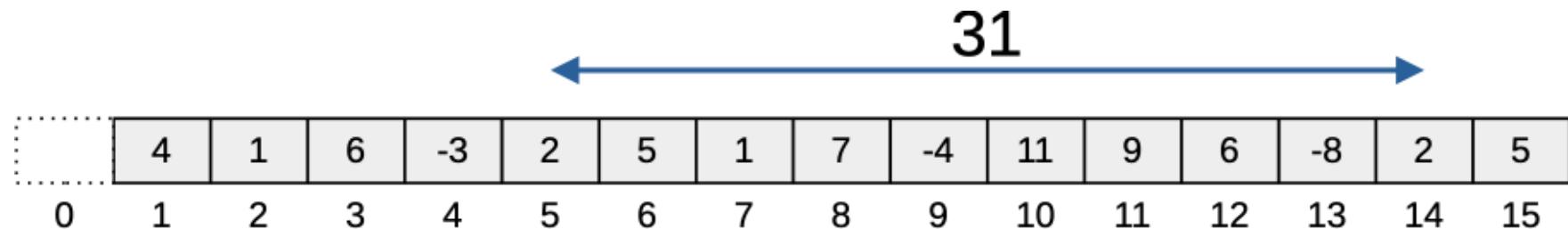
Fenwick Tree Data Structure

# Range Sums

- Assume we have a sequence of values.



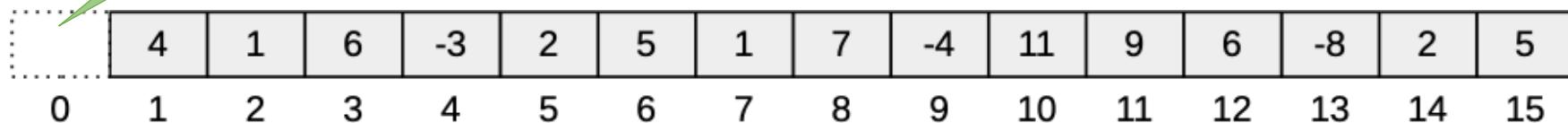
- We'd like a quick way to compute the sum of any contiguous range.



# Range Sums

- Assume we have values.

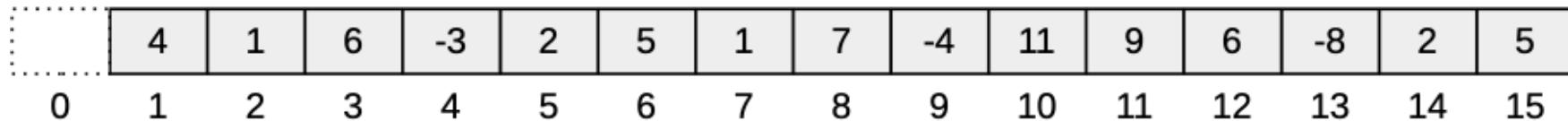
I'm skipping element 0.  
Not generally needed but it  
will simplify the Fenwick  
Tree later.



- We'd like a quick way to compute the sum of any contiguous range.

Obviously, we could do  
this in linear time.

31



# Range Sums via Prefix Sums

- We could compute a *prefix sum* for every element.
- For each  $i > 0$ , sum all elements up to index  $i$

| Original sequence. | 0 | 1 | 2 | 3  | 4 | 5 | 6 | 7 | 8  | 9  | 10 | 11 | 12 | 13 | 14 | 15 |
|--------------------|---|---|---|----|---|---|---|---|----|----|----|----|----|----|----|----|
|                    | 4 | 1 | 6 | -3 | 2 | 5 | 1 | 7 | -4 | 11 | 9  | 6  | -8 | 2  | 5  |    |

| Prefix sums | 0 | 1 | 2  | 3 | 4  | 5  | 6  | 7  | 8  | 9  | 10 | 11 | 12 | 13 | 14 | 15 |
|-------------|---|---|----|---|----|----|----|----|----|----|----|----|----|----|----|----|
|             | 4 | 5 | 11 | 8 | 10 | 15 | 16 | 23 | 19 | 30 | 39 | 45 | 37 | 39 | 44 |    |

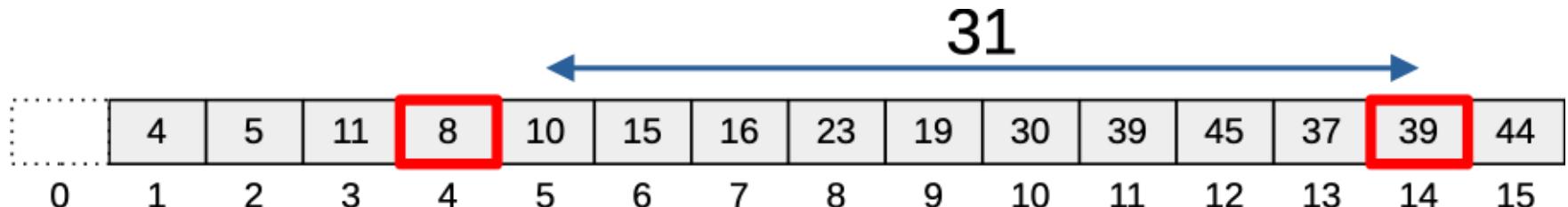
- We can compute this in linear time.

# Range Sums via Prefix Sums

|     |   |   |   |    |   |   |   |   |    |    |    |    |    |    |    |
|-----|---|---|---|----|---|---|---|---|----|----|----|----|----|----|----|
| [ ] | 4 | 1 | 6 | -3 | 2 | 5 | 1 | 7 | -4 | 11 | 9  | 6  | -8 | 2  | 5  |
| 0   | 1 | 2 | 3 | 4  | 5 | 6 | 7 | 8 | 9  | 10 | 11 | 12 | 13 | 14 | 15 |

|     |   |   |    |   |    |    |    |    |    |    |    |    |    |    |    |
|-----|---|---|----|---|----|----|----|----|----|----|----|----|----|----|----|
| [ ] | 4 | 5 | 11 | 8 | 10 | 15 | 16 | 23 | 19 | 30 | 39 | 45 | 37 | 39 | 44 |
| 0   | 1 | 2 | 3  | 4 | 5  | 6  | 7  | 8  | 9  | 10 | 11 | 12 | 13 | 14 | 15 |

- We can compute any range as the difference of two prefix sums.
  - In constant time!



# Range Sums via Prefix Sums

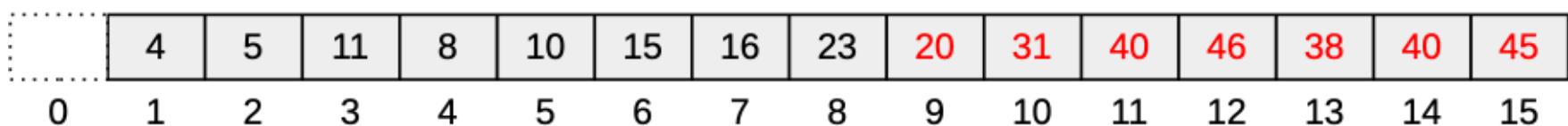
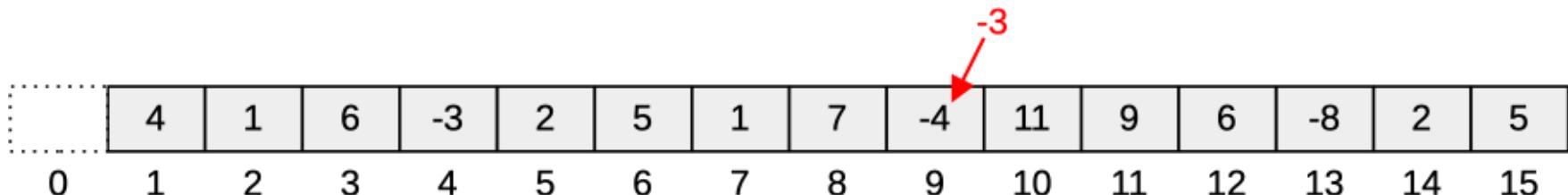
- This trick is worth a lot.
- Generalizes to 2 or more dimensions.

|   |    |    |    |
|---|----|----|----|
| 5 | -2 | 0  | 10 |
| 6 | 9  | 13 | 4  |
| 1 | 7  | -5 | 8  |
| 4 | 3  | -3 | 2  |

|    |    |    |    |
|----|----|----|----|
| 5  | 3  | 3  | 13 |
| 11 | 18 | 31 | 45 |
| 12 | 26 | 34 | 56 |
| 16 | 33 | 38 | 62 |

# Range Sums via Prefix Sums

- Doesn't efficiently handle changes to the sequence.



# Fenwick Tree

- Cover the sequence with sums of different ranges of values.
- Structure reflects the index of each cell in binary
- Also called a *Binary Indexed Tree*

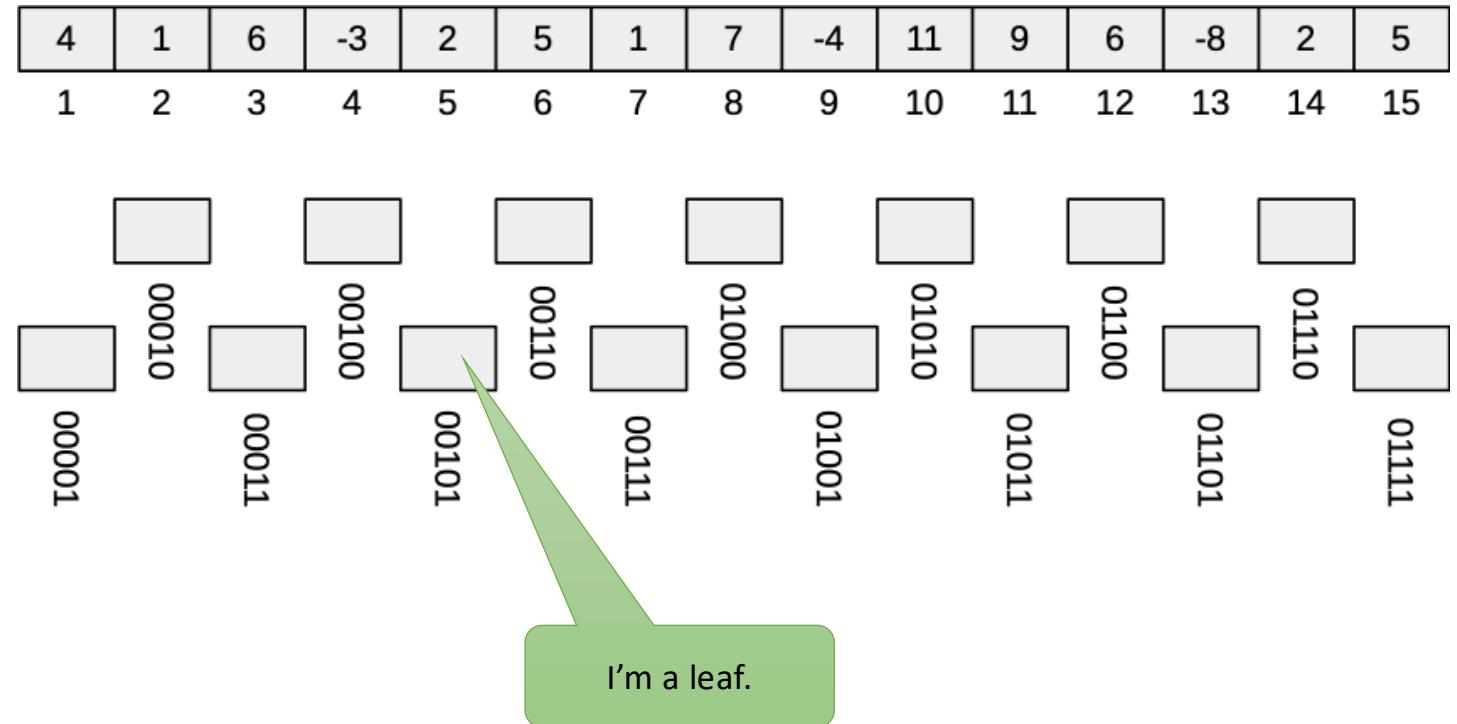
|   |   |   |    |   |   |   |   |    |    |    |    |    |    |    |
|---|---|---|----|---|---|---|---|----|----|----|----|----|----|----|
| 4 | 1 | 6 | -3 | 2 | 5 | 1 | 7 | -4 | 11 | 9  | 6  | -8 | 2  | 5  |
| 1 | 2 | 3 | 4  | 5 | 6 | 7 | 8 | 9  | 10 | 11 | 12 | 13 | 14 | 15 |

|      |       |       |       |      |       |       |       |       |       |       |       |       |       |       |
|------|-------|-------|-------|------|-------|-------|-------|-------|-------|-------|-------|-------|-------|-------|
|      |       |       |       |      |       |       |       |       |       |       |       |       |       |       |
| 0001 | 00010 | 00011 | 00100 | 0101 | 00110 | 00111 | 01000 | 01001 | 01010 | 01011 | 01100 | 01101 | 01110 | 01111 |

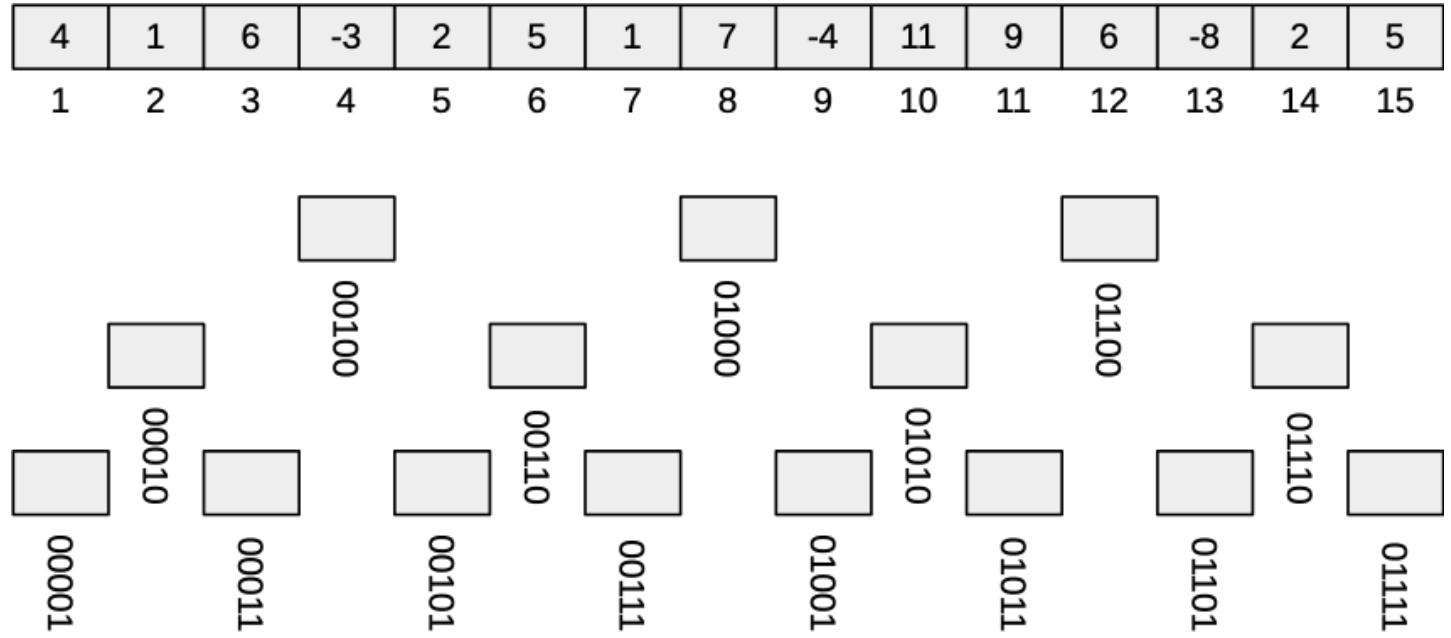
# Fenwick Tree

- Indices with a 1 in the least-significant bit are the leaves.



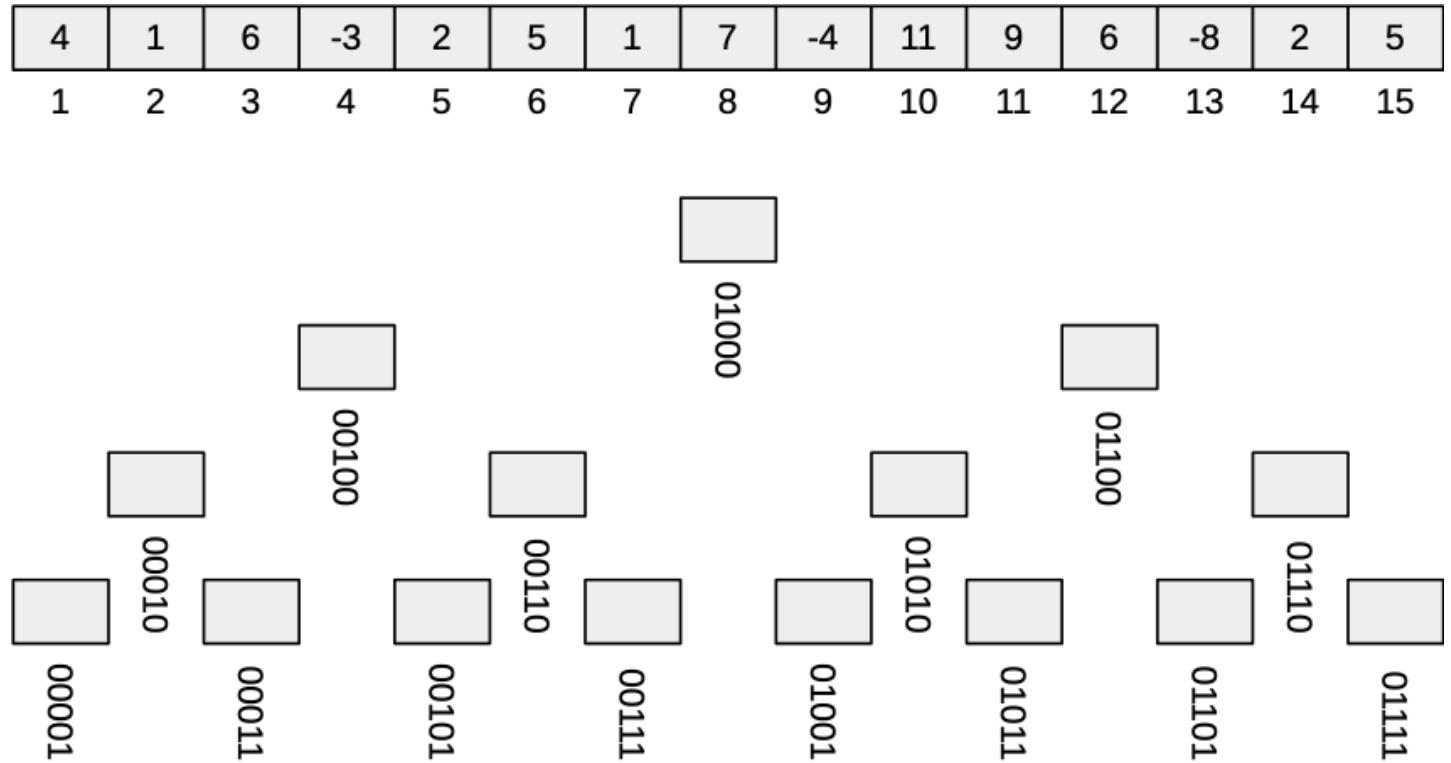
# Fenwick Tree

- Indices with a 1 in the next bit are their parents.



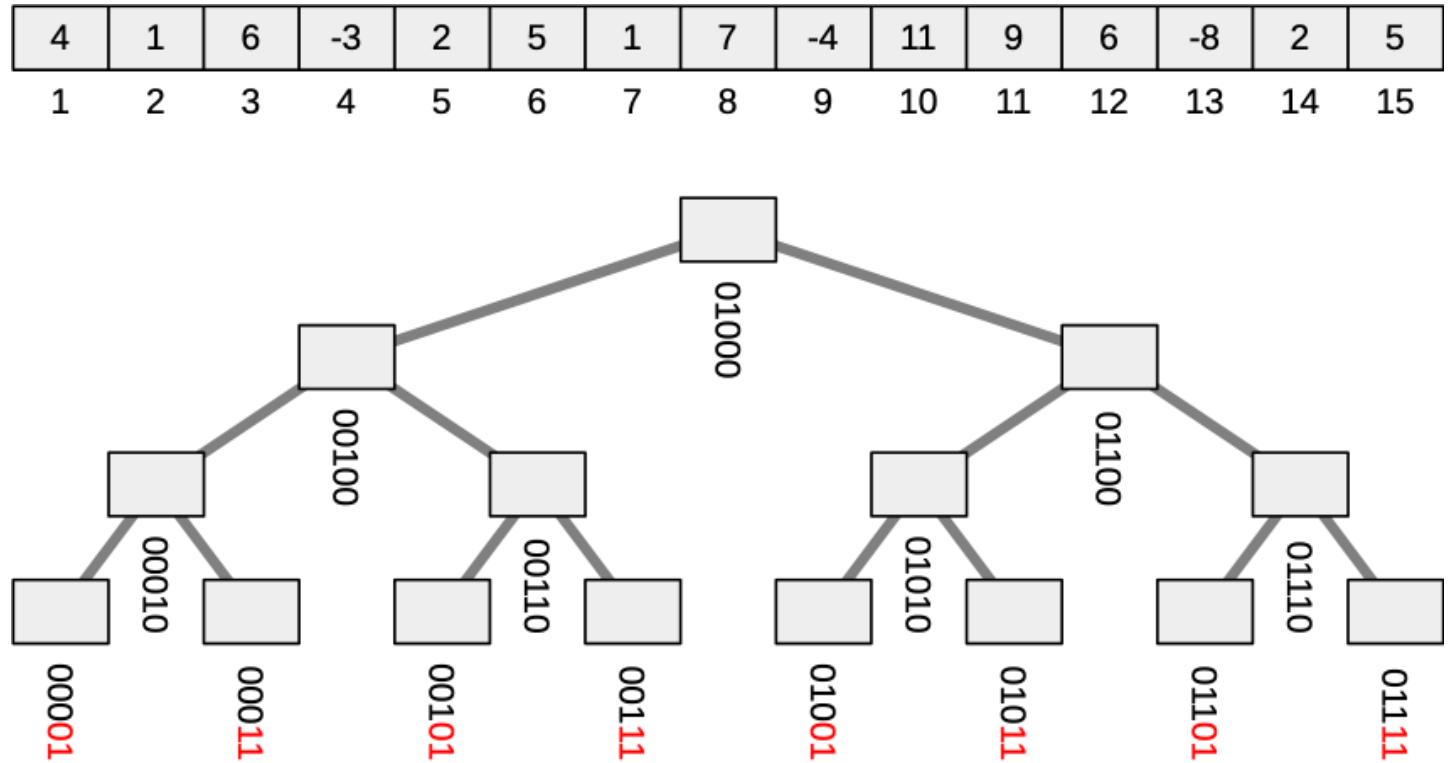
# Fenwick Tree

- Values with a 1 in the next bit are their parents.
- All the way up the tree.



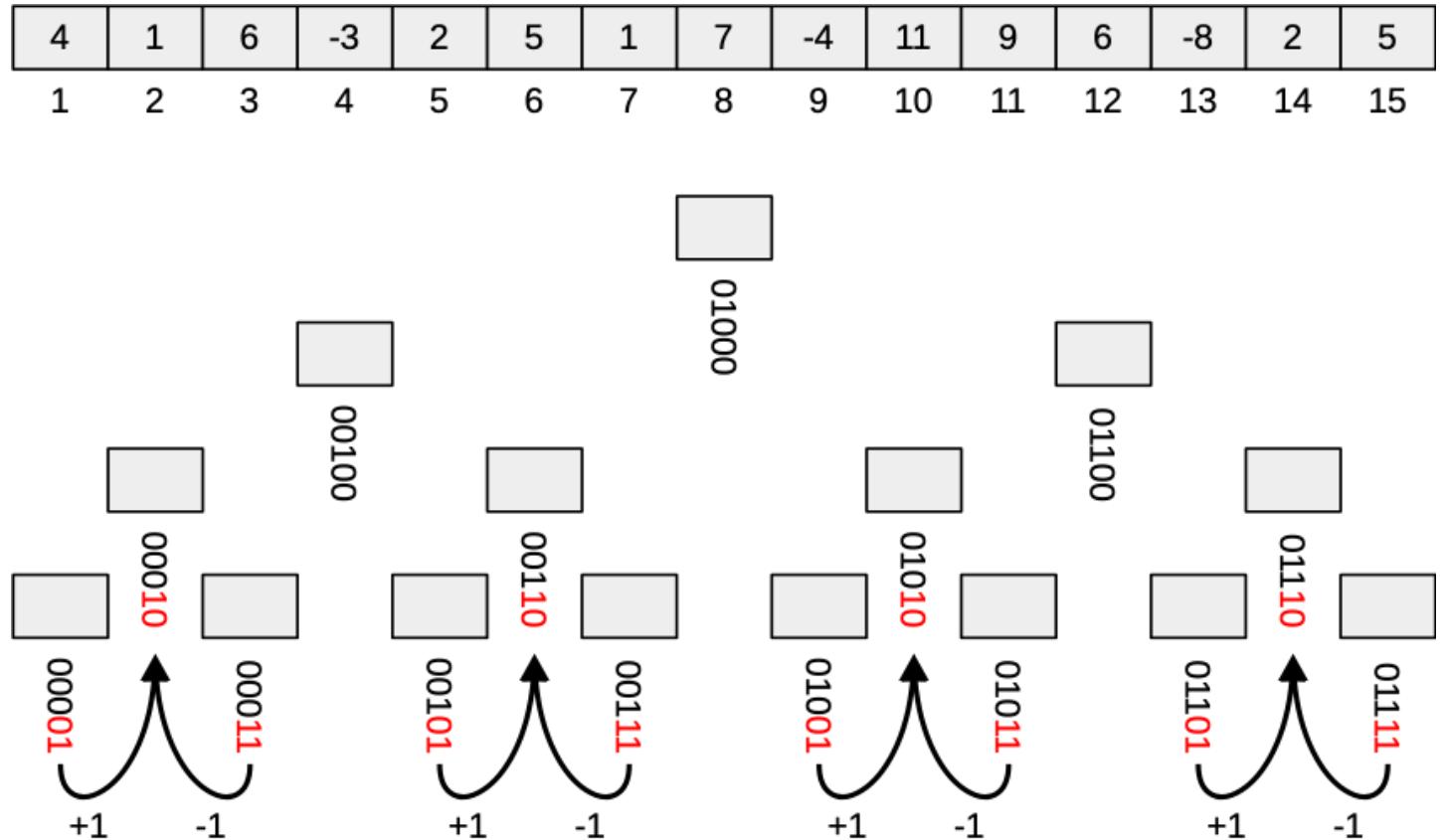
# Fenwick Tree

- This is an implicit tree, like a binary heap.
- The low-order bits of the leaves alternate.
  - ...01
  - ...11
  - ...01
  - ...11



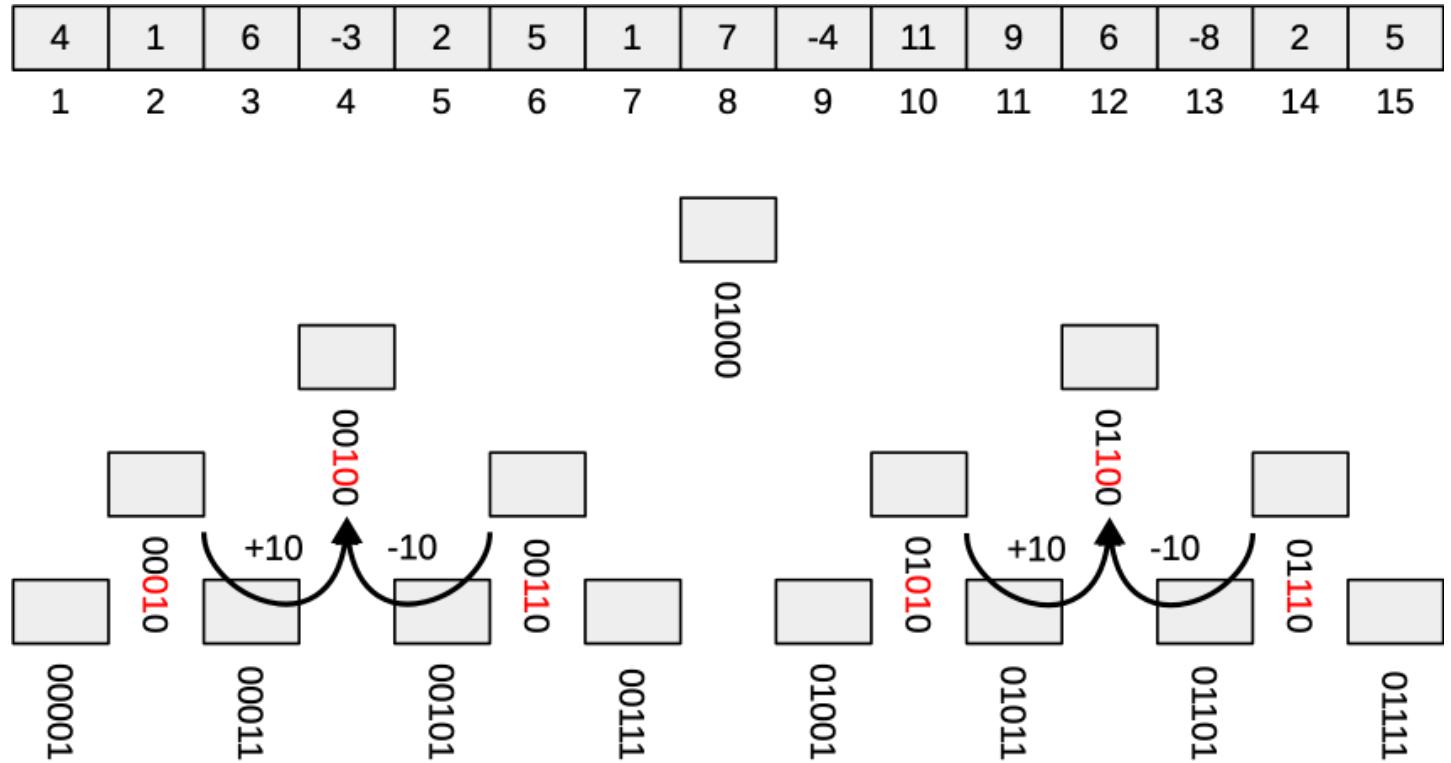
# Fenwick Tree

- For a ...01 node, add 1 to get to the parent.
- For a ...11 node, subtract 1 to get to the parent.



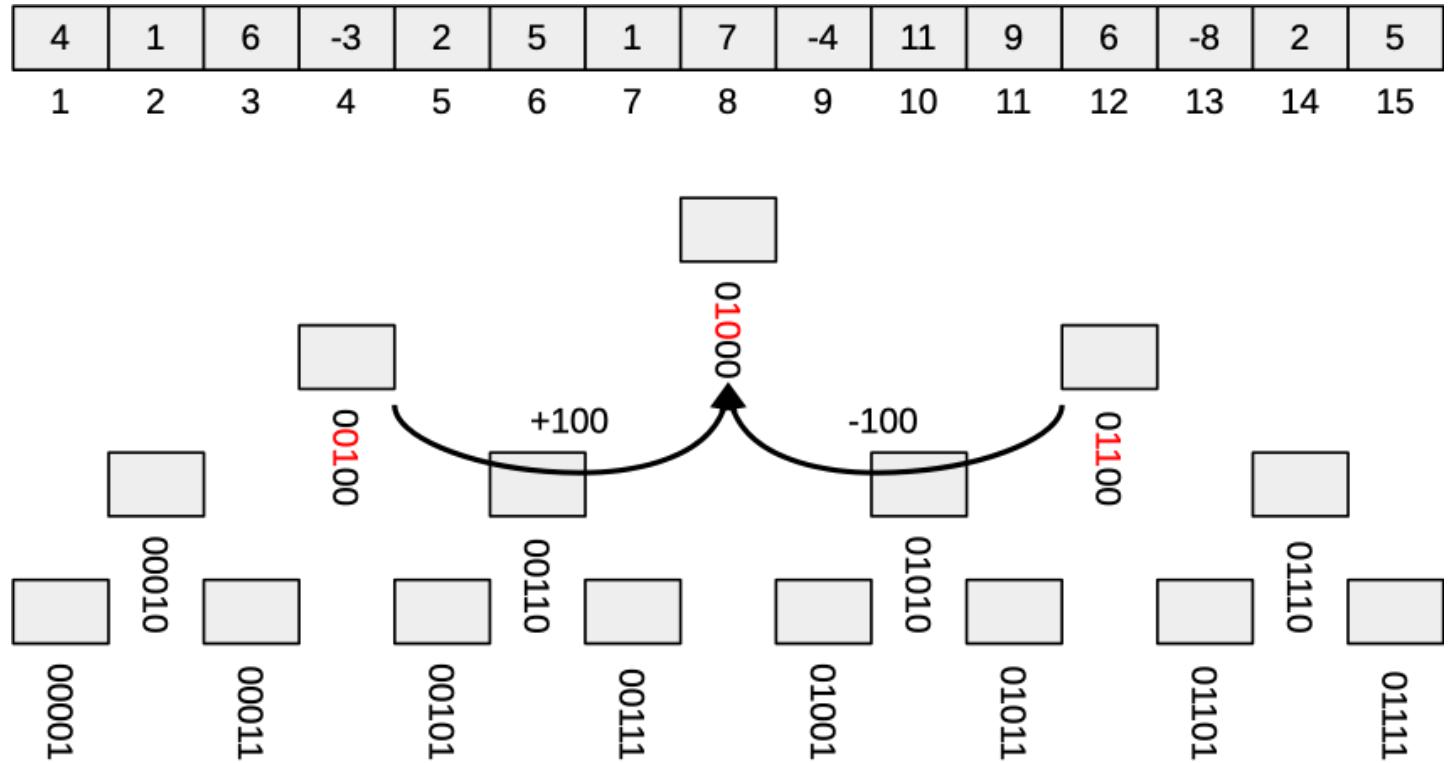
# Fenwick Tree

- We have the same structure at the next level of the tree.
- But, its shifted one bit up.



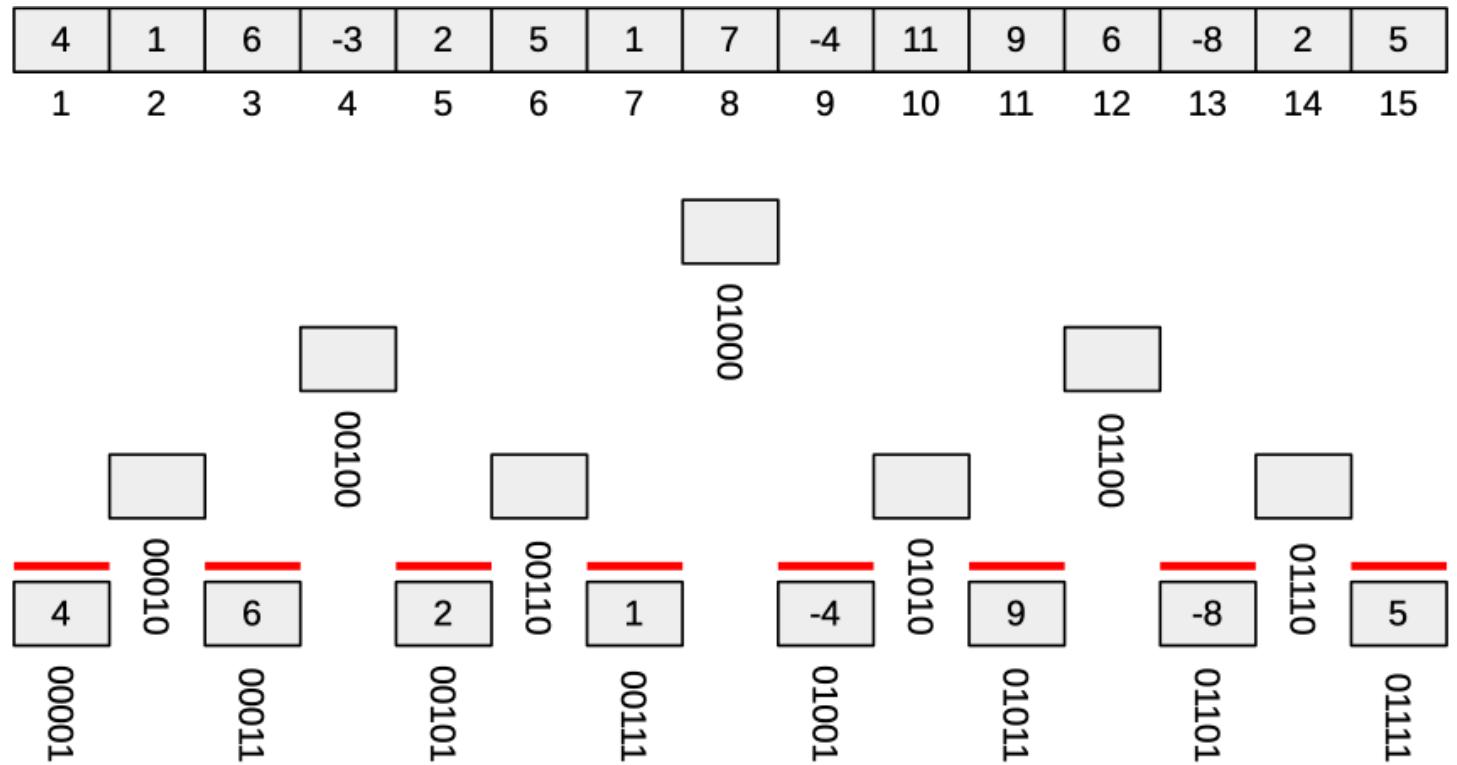
# Fenwick Tree

- Same thing at every level of the tree.



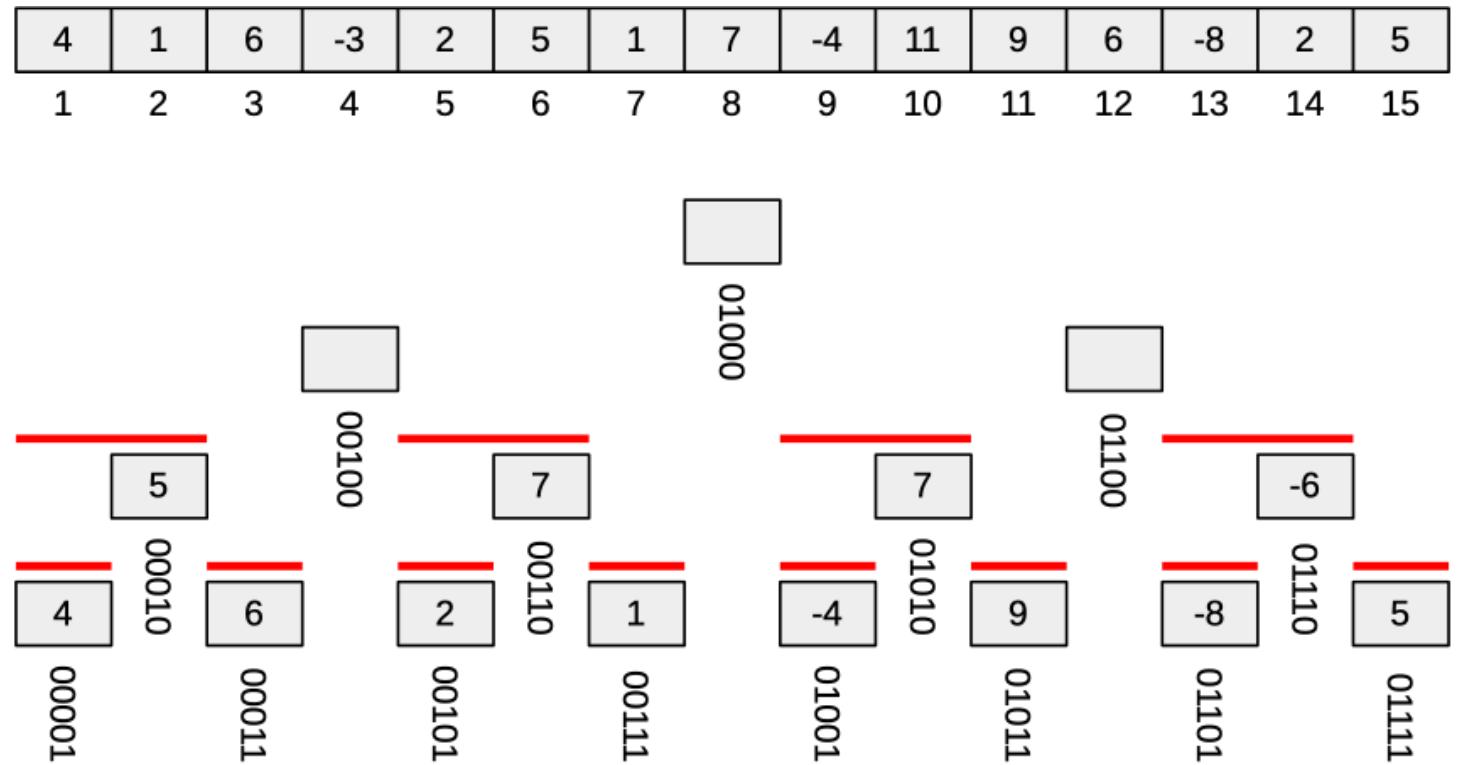
# Storing Range Sums

- The leaves just store the value at their index.



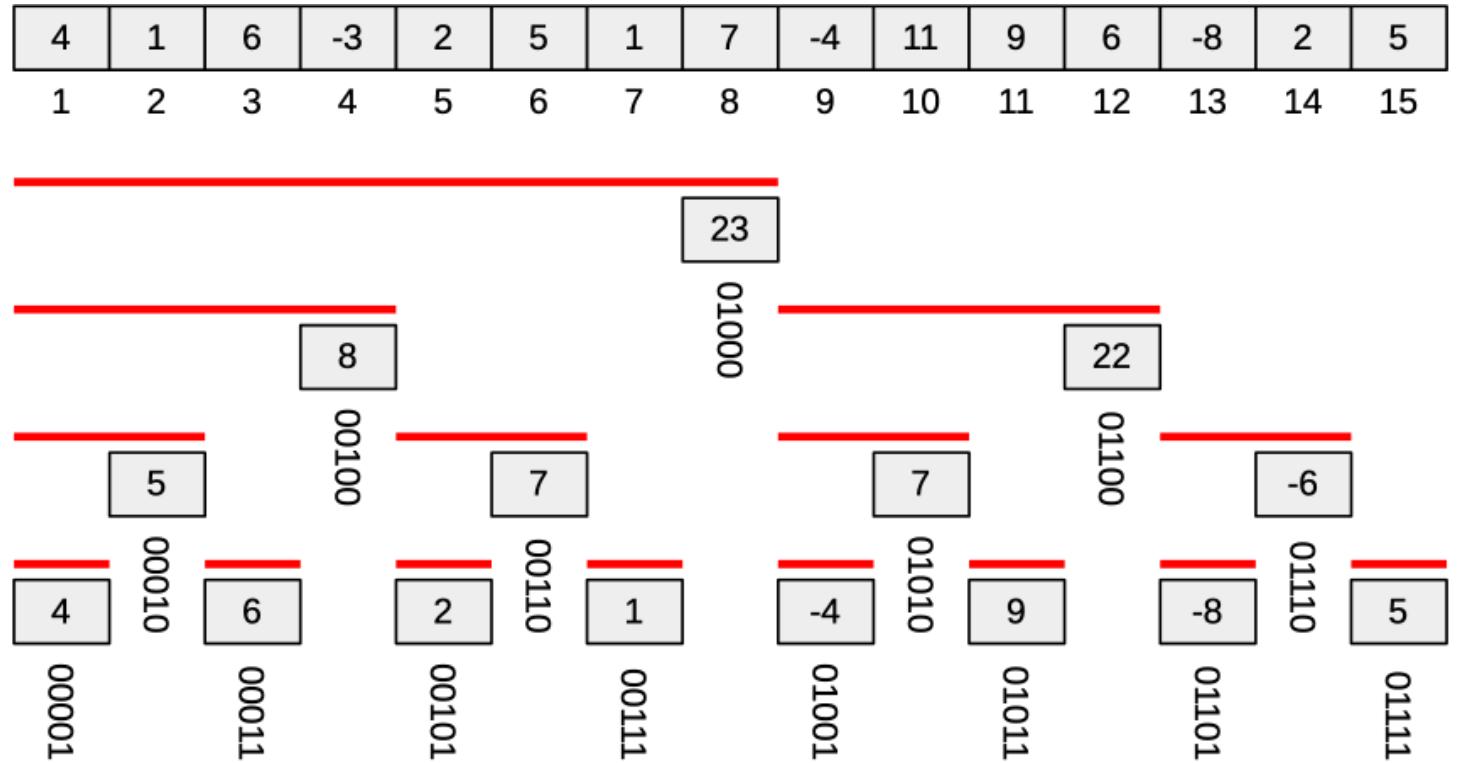
# Storing Range Sums

- The next tree level stores two-element sums.



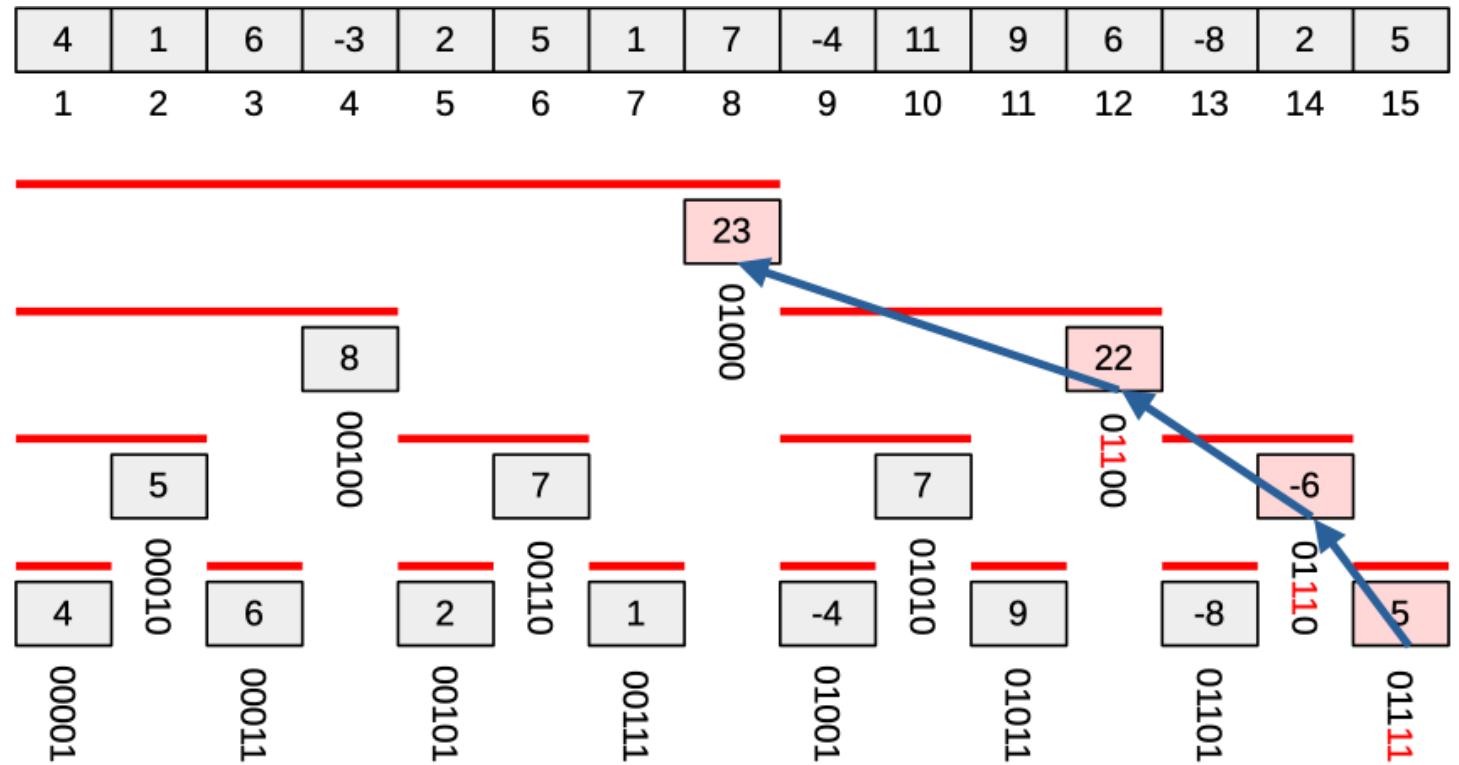
# Storing Range Sums

- Four-element sums at the next level.
- Eight-element sums at the next.
- All the way up the tree.



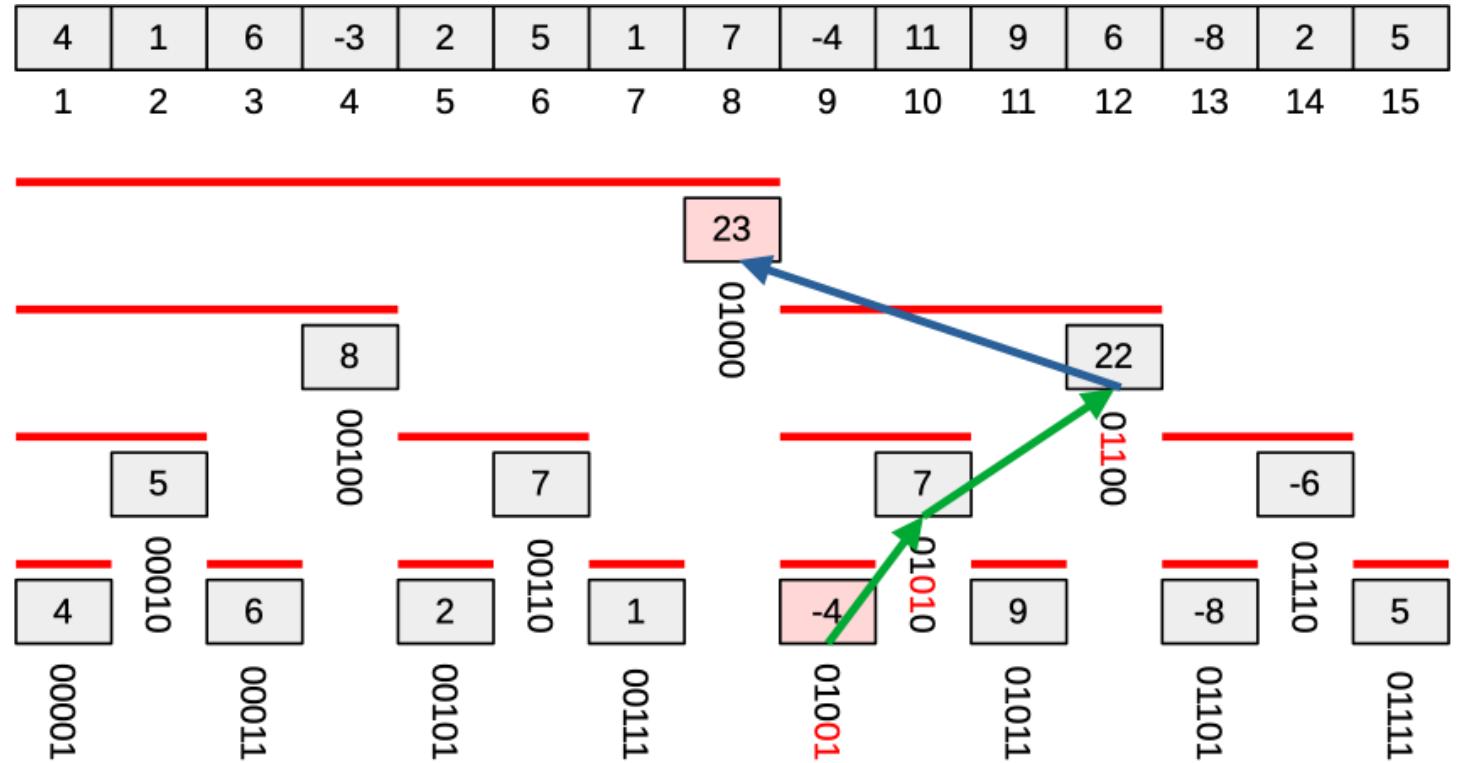
# Computing a Prefix Sum

- We can compute a prefix sum by combining a few of these range sums
  - $O(\log_2 n)$



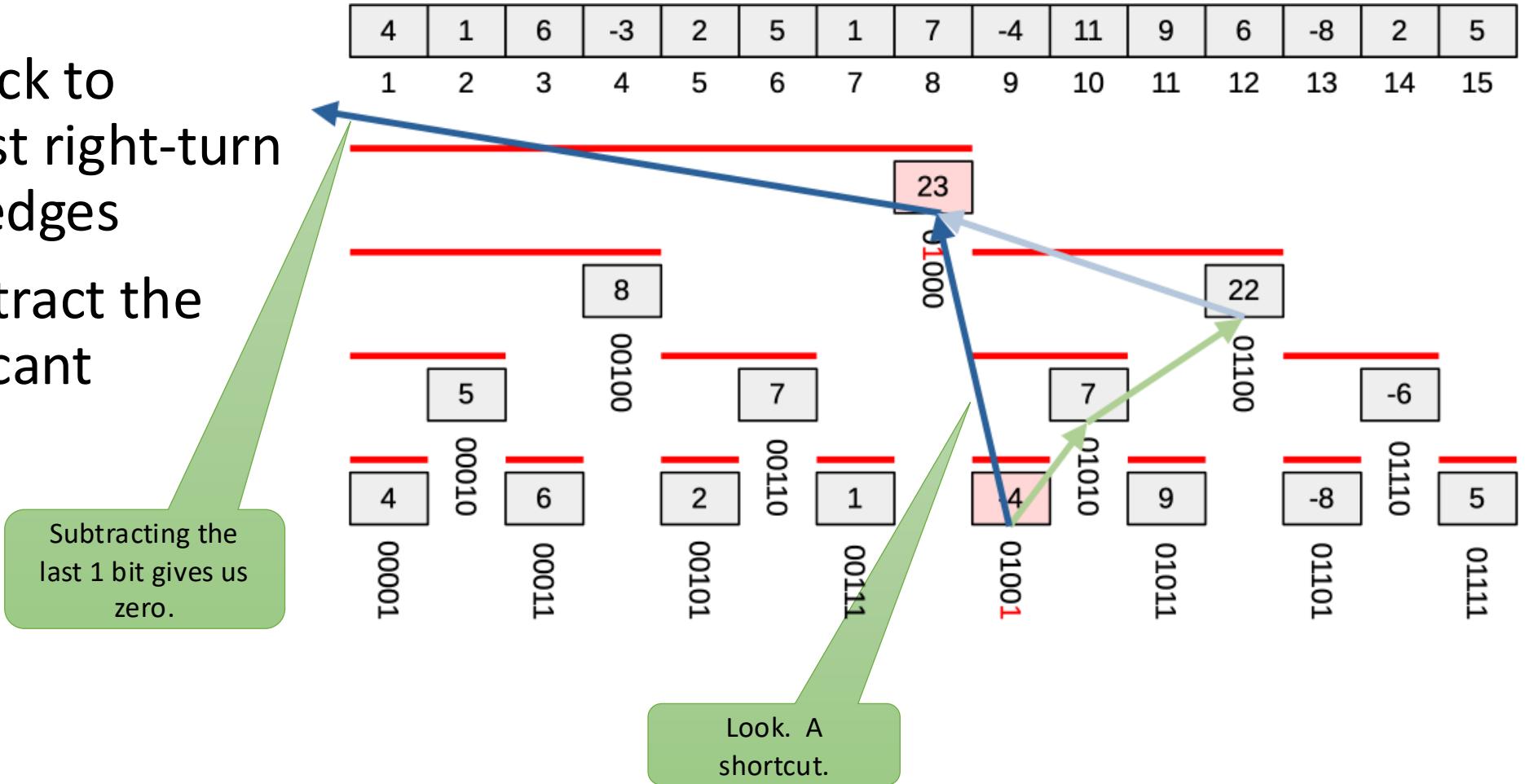
# Computing a Prefix Sum

- We only want to add in sums that don't overlap.
- These are the ones we reach via a right child.



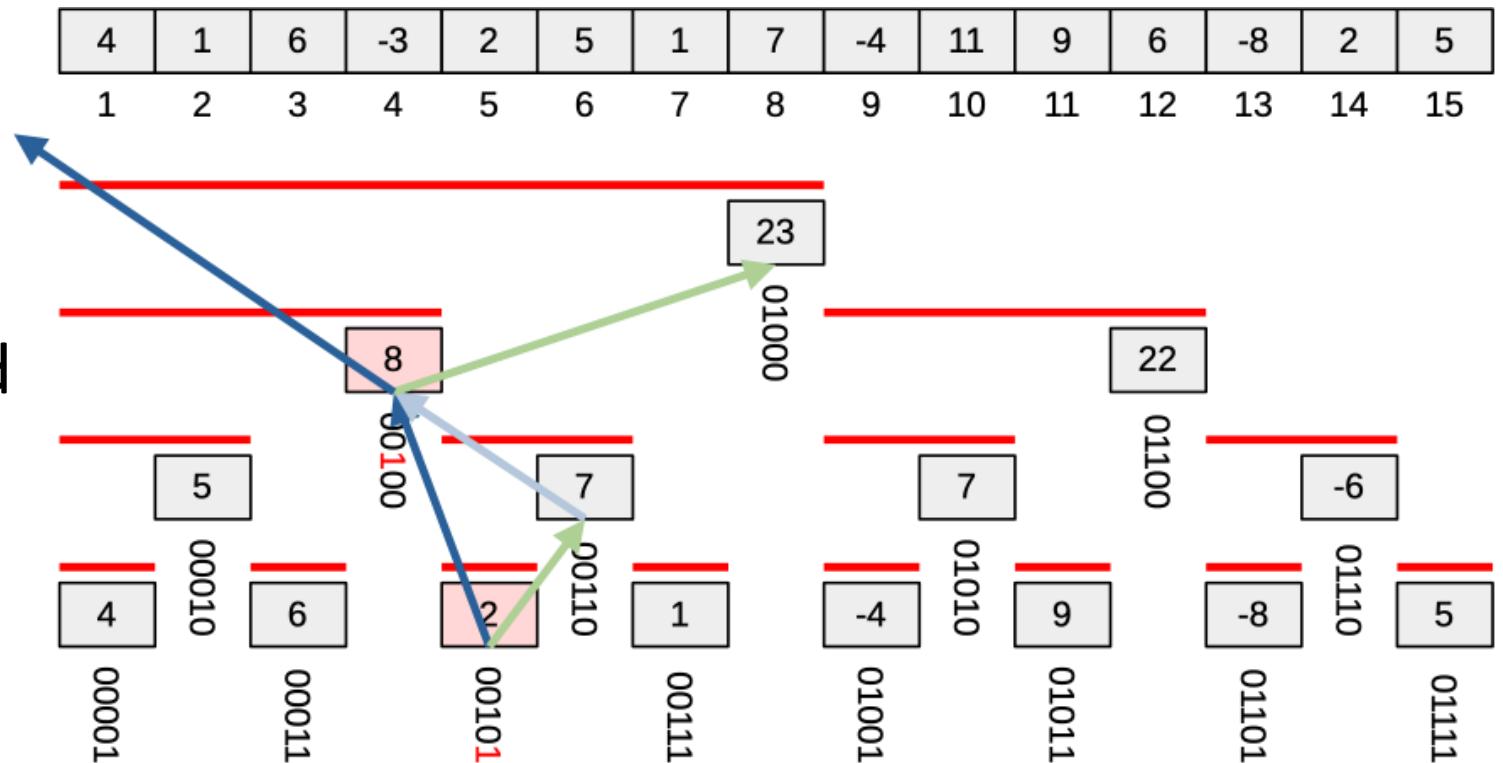
# Computing a Prefix Sum ... a little faster

- There's a trick to skipping past right-turn (left-child) edges
- We can subtract the least-significant 1 bit.



# Computing a Prefix Sum ... a little faster

- You can climb the tree, just visiting the nodes you need to add.
- When you've subtracted off all the 1 bits, you're done.
- That's why we skipped index zero.



# Computing a Prefix Sum

Start at a given index in the tree.

```
int fenwickSum( int idx ) {
    int sum = 0;
    while ( idx > 0 ) {
        sum += tree[ idx ];
        idx -= LSB( idx );
    }
    return sum;
}
```

# Computing a Prefix Sum

```
int fenwickSum( int idx ) {  
    int sum = 0;  
    while ( idx > 0 ) {  
        sum += tree[ idx ];  
        idx -= LSB( idx );  
    }  
    return sum;  
}
```

Start at a given index in the tree.

Move up until you fall off the top.

# Computing a Prefix Sum

```
int fenwickSum( int idx ) {  
    int sum = 0;  
    while ( idx > 0 ) {  
        sum += tree[ idx ];  
        idx -= LSB( idx );  
    }  
    return sum;  
}
```

Start at a given index in the tree.

Move up until you fall off the top.

Add in the value at the current node.

# Computing a Prefix Sum

```
int fenwickSum( int idx ) {  
    int sum = 0;  
    while ( idx > 0 ) {  
        sum += tree[ idx ];  
        idx -= LSB( idx );  
    }  
    return sum;  
}
```

Start at a given index in the tree.

Move up until you fall off the top.

Add in the value at the current node.

Subtract off the least-significant 1 bit.

# Computing a Prefix Sum

```
int fenwickSum( int idx ) {  
    int sum = 0;  
    while ( idx > 0 ) {  
        sum += tree[ idx ];  
        idx -= LSB( idx );  
    }  
    return sum;  
}
```

Start at a given index in the tree.

Move up until you fall off the top.

Add in the value at the current node.

Subtract off the least-significant 1 bit.

How do we do this?

# Finding the Least-significant 1 Bit

- We can get help from the processor's ALU

```
int LSB( int idx ) {  
    return idx & -idx;  
}
```

# Finding the Least-significant 1 Bit

- We can get help from the processor's ALU

```
int LSB( int idx ) {  
    return idx & -idx;  
}
```

**idx** = 01001100100000

# Finding the Least-significant 1 Bit

- We can get help from the processor's ALU

```
int LSB( int idx ) {  
    return idx & -idx;  
}
```

`idx = 01001100100000  
~idx = 10110011011111`

# Finding the Least-significant 1 Bit

- We can get help from the processor's ALU

```
int LSB( int idx ) {  
    return idx & -idx;  
}
```

idx = 01001100100000  
-idx = 10110011100000

# Finding the Least-significant 1 Bit

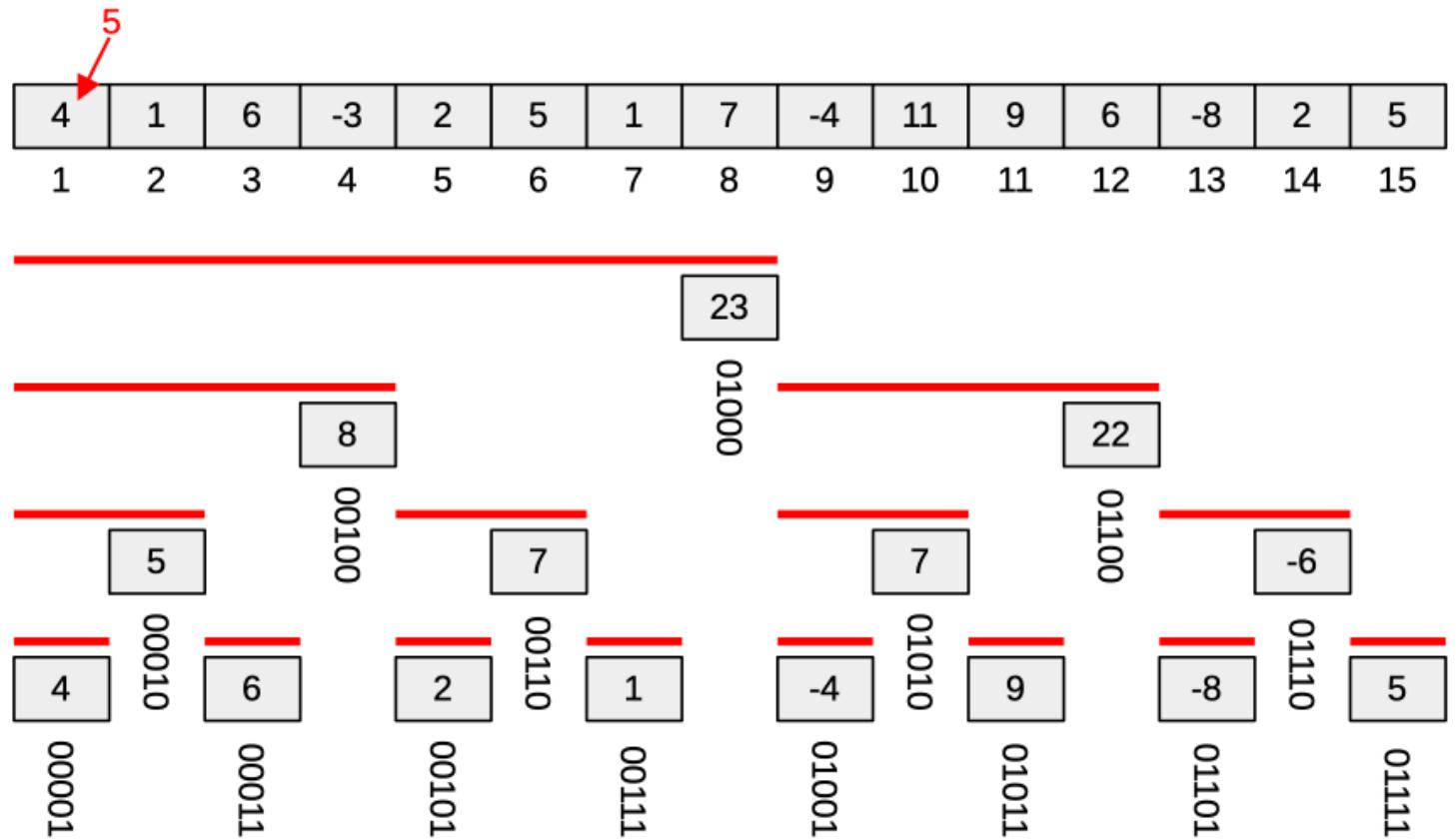
- We can get help from the processor's ALU

```
int LSB( int idx ) {  
    return idx & -idx;  
}
```

01001100100000  
& 10110011100000  
00000000100000

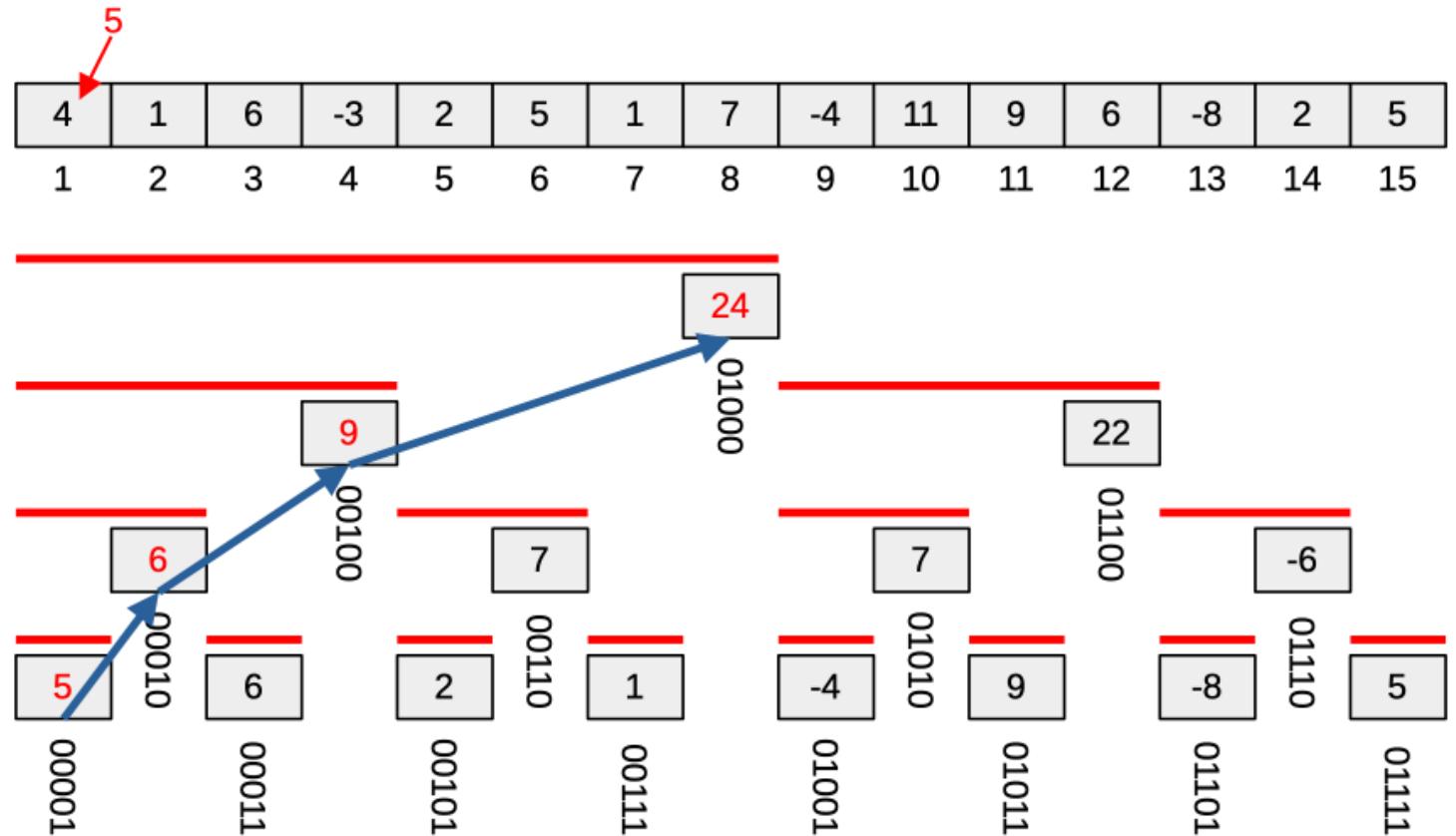
# Changing the Sequence

- If we change the sequence, we will have to update multiple range sums



# Changing the Sequence

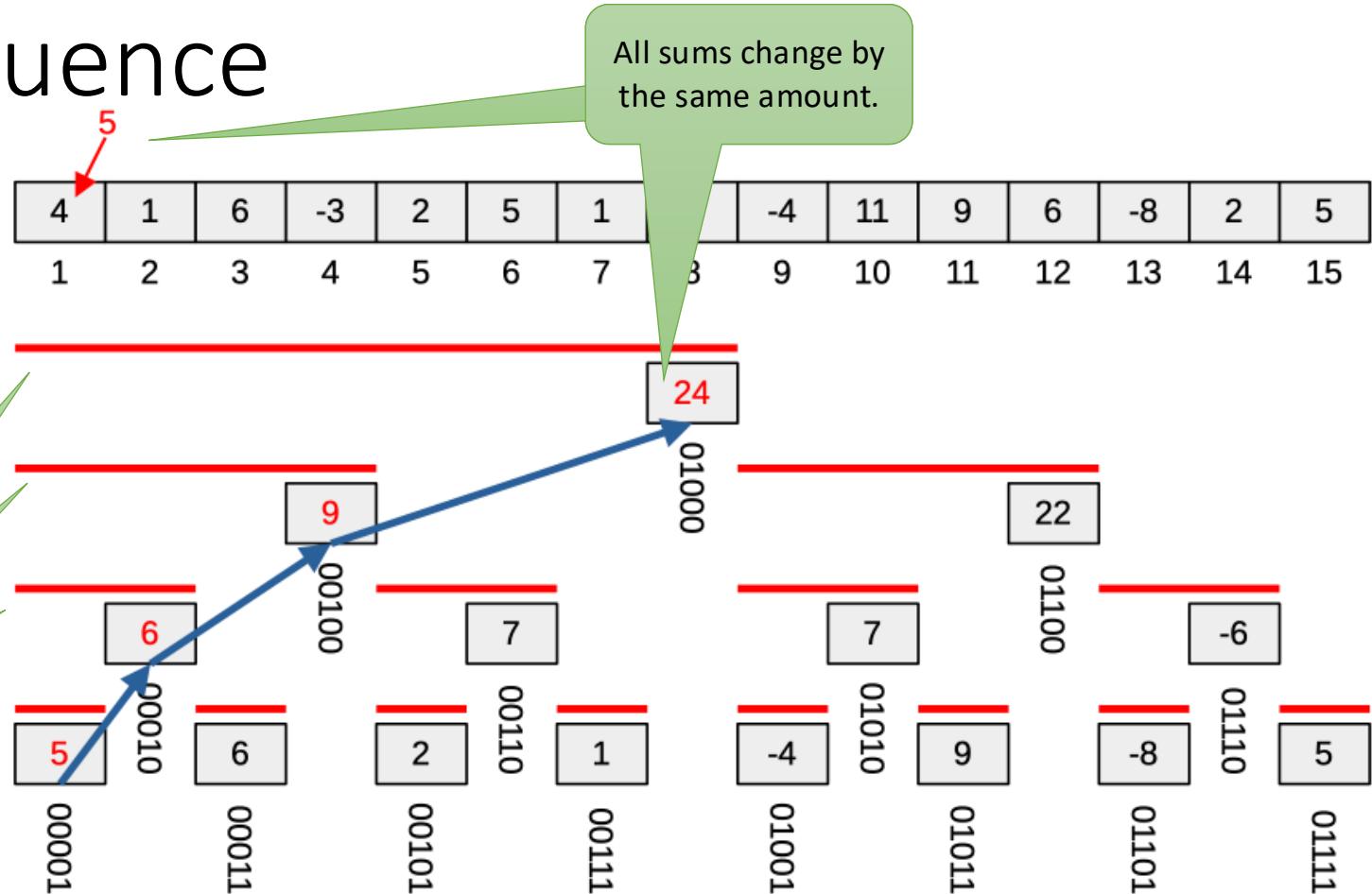
- If we change the sequence, we will have to update multiple range sums
- ... but not too many.



# Changing the Sequence

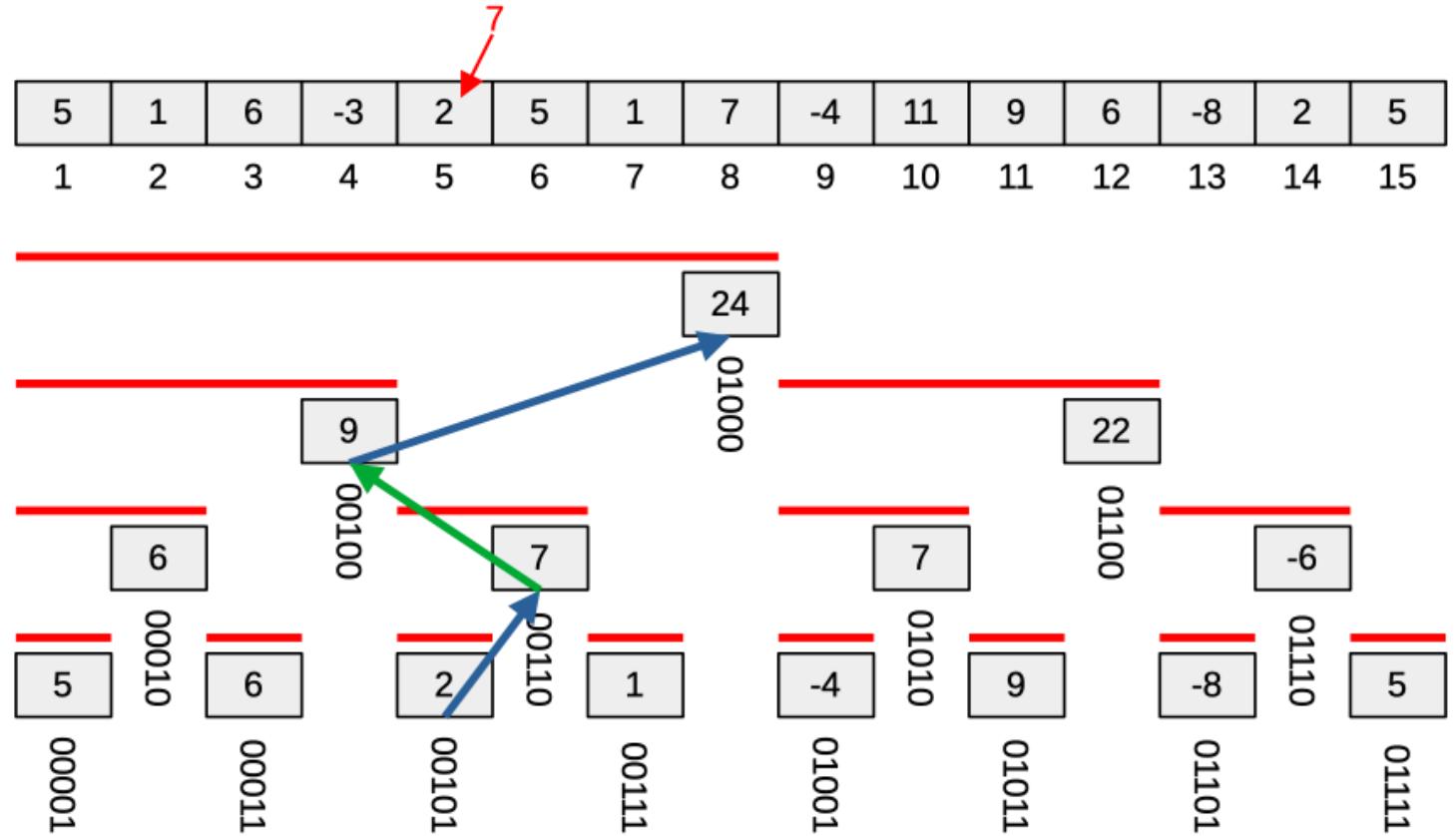
- If we change the sequence, we will have to update multiple range sums
- ... but not too many

We want all range sums that overlap with the change.



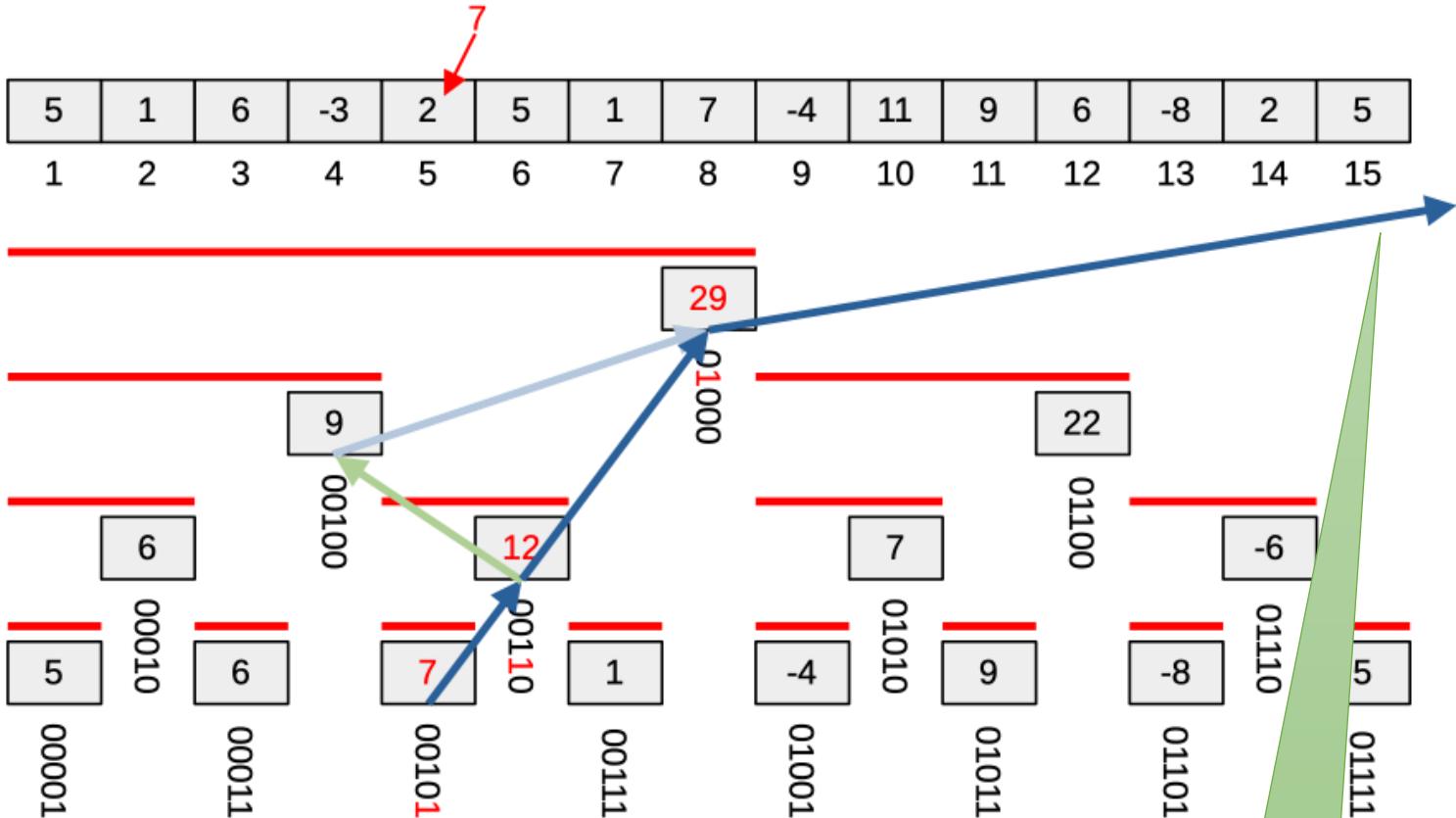
# Changing the Sequence

- Here, we need to update any sum we reach via a left child.
- Parent of a right child won't overlap the updated value



# Changing the Sequence ... a little bit faster

- Here also, there's a shortcut.
- If we add the least-significant 1 bit, we skip all the left turns.



The last hop takes us past the end of the sequence.

# Updating Range Sums

Starting index and  
change in value.

```
void fenwickAdd( int idx, int d ) {
    while ( idx < tree.length ) {
        tree[ idx ] += d;
        idx += LSB( idx );
    }
}
```

# Updating Range Sums

```
void fenwickAdd( int idx, int d ) {  
    while ( idx < tree.length ) {  
        tree[ idx ] += d;  
        idx += LSB( idx );  
    }  
}
```

Starting index and  
change in value.

Move up until you  
fall off the top (to  
the right this time)

# Updating Range Sums

```
void fenwickAdd( int idx, int d ) {  
    while ( idx < tree.length ) {  
        tree[ idx ] += d;  
        idx += LSB( idx );  
    }  
}
```

Starting index and change in value.

Move up until you fall off the top (to the right this time)

Modify the sum at this node.

# Updating Range Sums

```
void fenwickAdd( int idx, int d ) {  
    while ( idx < tree.length ) {  
        tree[ idx ] += d;  
        idx += LSB( idx );  
    }  
}
```

Starting index and change in value.

Move up until you fall off the top (to the right this time)

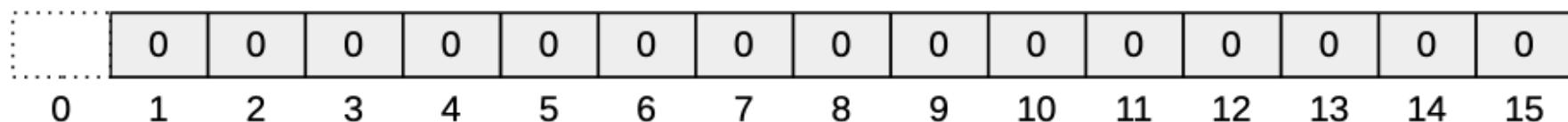
Modify the sum at this node.

Move to the next ancestor to the right.

# Initializing the Tree

- You can initialize the tree with any sequence
  - In linear time
- Or, you can start with a sequence of zeros.

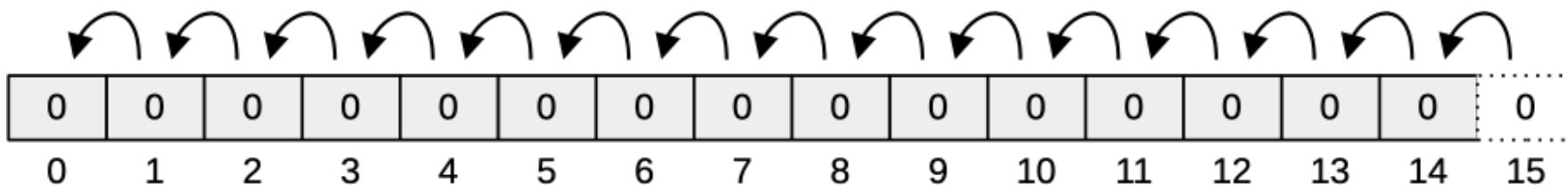
One larger than the number of elements you need.



- Then use `fenwickAdd()` to set all the values to what you want.
  - $O(n \log n)$  time.

# Variant Tree Representations

- You could make use of elements 0 .. n -1
  - By using an offset of one when you do the tree traversal.



- You could omit element i from fenwickSum( i )

