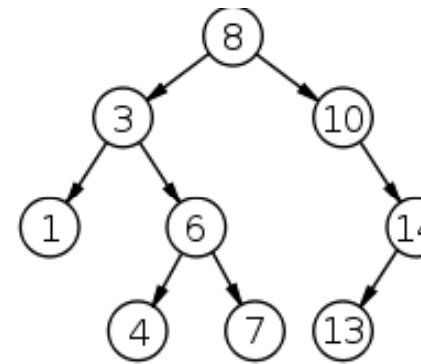


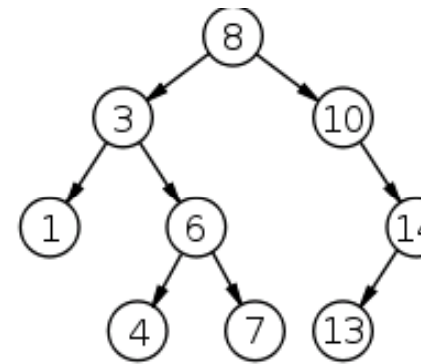
# Binary Search Tree (1)



A binary search tree of size 9 and depth 3, with root 8 and leaves 1, 4, 7 and 13

- ADT Table (key  $\rightarrow$  data)
- Binary Search Tree (BST)
  - Advertised  $O(\log n)$  for insert, search, and delete
  - Requirement: the BST must be **balanced!**
    - AVL tree, Red-Black Tree, etc... \*argh\*
- Fret not, just use: C++ STL **map** (Java **TreeMap**)
  - UVa [10226](#) (Hardwood Species)\*

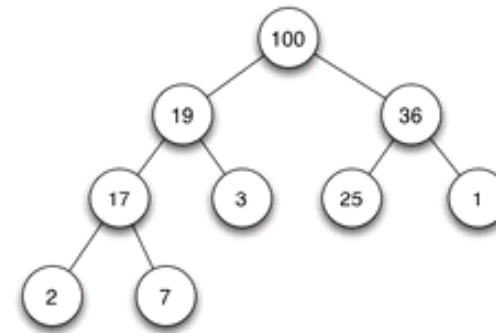
# Binary Search Tree (2)



A binary search tree of size 9 and depth 3, with root 8 and leaves 1, 4, 7 and 13

- ADT Table (key exists or not)
- Set (Single Set)
  - C++ STL **set**, similar to C++ STL **map**
    - map stores a **(key, data)** pair
    - set stores just the **key**
  - In Java: **TreeSet**
- Example:
  - UVa [11849](#) – CD

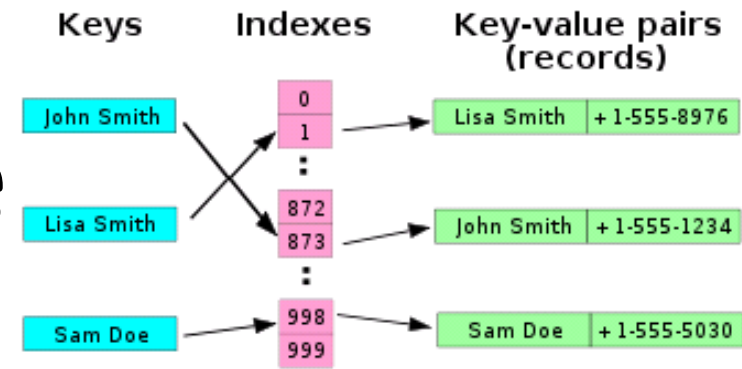
# Heap



Example of a full binary max heap

- Heap
  - C++ STL **algorithm** has some heap algorithms
    - `partial_sort` uses heapsort
  - C++ STL **priority\_queue** (Java **PriorityQueue**) is heap
    - Prim's and Dijkstra's algorithms use priority queue
- But, we rarely see pure heap problems in ICPC

# Hash Table



A small phone book as a hash table.

- Hash Table
  - Advertised  $O(1)$  for insert, search, and delete, but:
    - The hash function must be good!
    - There is no Hash Table in C++ STL ( $\exists$  in Java API)
  - Nevertheless,  $O(\log n)$  using **map** is usually ok
- Direct Addressing Table (DAT)
  - Rather than hashing, we more frequently use DAT
  - UVa [11340](#) (Newspaper)

# Quick Check

1. I can cope with this pace...
2. I am lost with so many new information in the past few slides



# 5 Minutes Break

- One data structures *without* built-in libraries will be discussed in the last part...
  - Binary Indexed (Fenwick) Tree
  - Graph, Union-Find Disjoint Sets, and Segment Tree are not discussed in this year's CS3233 Week02
    - Graph DS is covered in details in CS2010/CS2020
    - UFDS is covered briefly in CS2010/CS2020
    - Please study Segment Tree on your own
      - We *try* not to set any contest problem involving Segment Tree

[Graph](#) (not discussed today, revisited in Week06/07/08)

[Union-Find Disjoint Sets](#) (not discussed today, read Ch2 on your own)

[Segment Tree](#) (not discussed today, read Ch2 on your own)

[Fenwick Tree](#) (discussed today)

# DATA STRUCTURES WITHOUT BUILT-IN LIBRARIES

# Fenwick Tree – Basics (1)

- Cumulative Frequency Table
  - Example,  $s = \{2,4,5,5,6,6,6,7,7,8,9\}$  (already sorted)

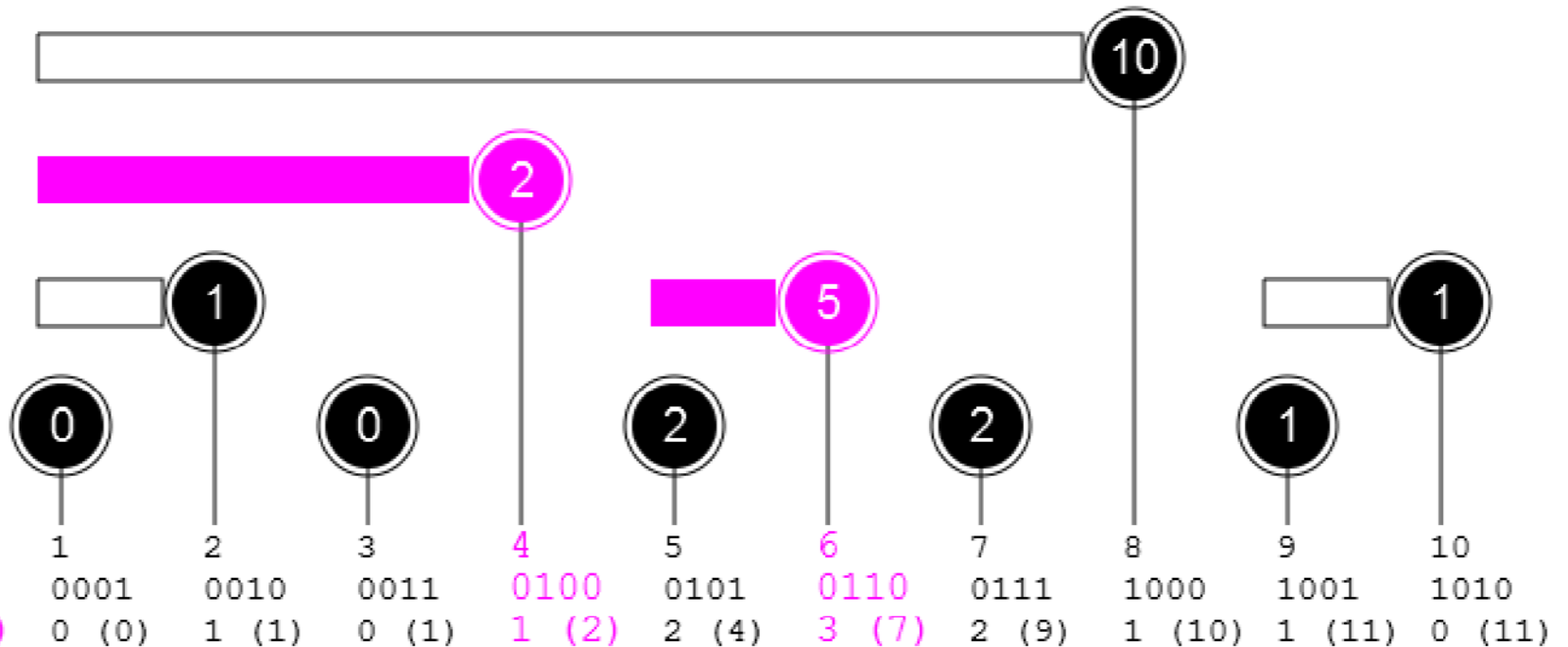
Index/Score/Symbol	Frequency	Cumulative Frequency
0	-	- (index 0 is ignored)
1	0	0
2	1	1
3	0	1
4	1	2
5	2	
6	3	
7	2	
8	1	
9	1	
10	0	



# Fenwick Tree – Basics (2)

- Fenwick Tree (inventor = Peter M. Fenwick)
  - Also known as “**Binary Indexed Tree**”, very *aptly* named
  - Implemented as an **array**, let call the array name as **ft**
  - We will frequently use this bit manipulation, remember!
    - LSOne(i)** = Least Significant One of i computed via  $i \& (-i)$

RSQ(1, 6) = 7

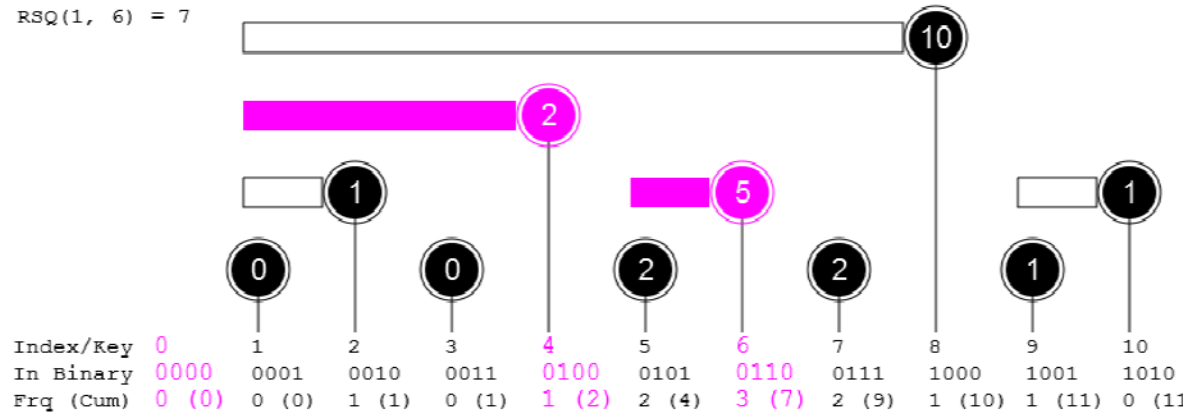


# Fenwick Tree – Basics (3)

- Each index  $i$  of **ft** is responsible for certain **range**:  $[i - \text{LSOne}(i) + 1 .. i]$
- ft[i]** stores the cumulative frequency of elements:  $\{i - \text{LSOne}(i) + 1, i - \text{LSOne}(i) + 2, i - \text{LSOne}(i) + 3, \dots, i\}$

Key/Idx	Binary	Range	F	CF	FT
0	0000	N/A	N/A	N/A	N/A
1	0001	[1..1]	0	0	0
2	0010	[1..2]	1	1	1
3	0011	[3..3]	0	1	0
4	0100	[1..4]	1	2	2
5	0101	[5..5]	2	4	2
6	0110	[5..6]	3	7	5
7	0111	[7..7]	2	9	2
8	1000	[1..8]	1	10	10
9	1001	[9..9]	1	11	1
10	1010	[9..10]	0	11	1

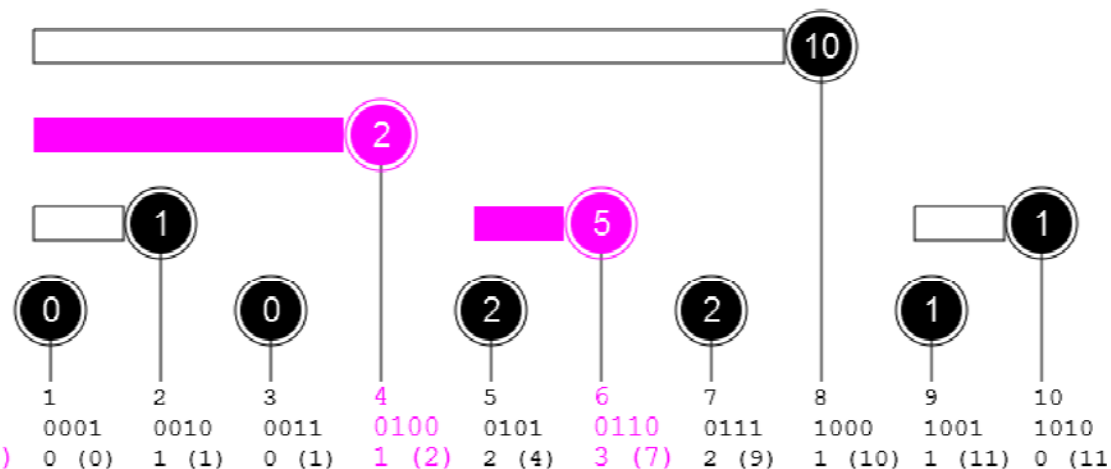
RSQ(1, 6) = 7



# Fenwick Tree – RSQ (1)

- To get the cumulative frequency from index 1 to  $b$ , use  $rsq(b)$ 
  - The answer is the sum of sub-frequencies stored in array  $ft$  with indices related to  $b$  via this formula  $b' = b - LSONe(b)$
  - Apply this formula iteratively until  $b$  is 0
  - Example:  $rsq(6)$ 
    - $b = 6 = 0110$ ,  $b' = b - LSONe(b) = 0110 - 0010$ ,  $b' = 4 = 0100$
    - $b' = 4 = 0100$ ,  $b'' = b' - LSONe(b') = 0100 - 0100$ ,  $b'' = 0 \rightarrow \text{stop}$
    - Sum  $ft[6] + ft[4] = 5 + 2 = 7$  (the pink area covers range  $[1..4] + [5..6] = [1..6]$ )

$RSQ(1, 6) = 7$

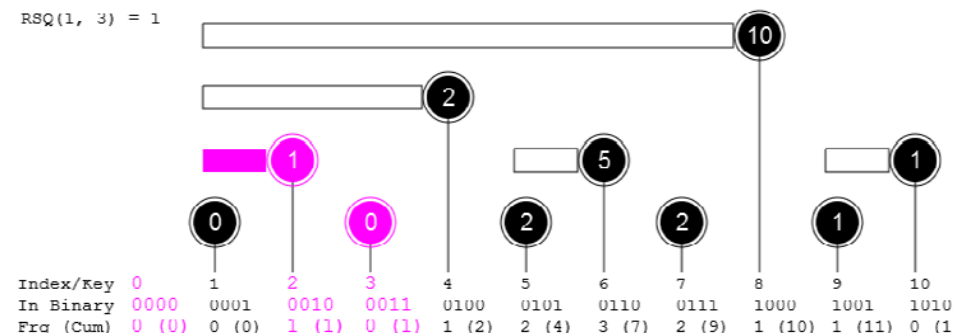
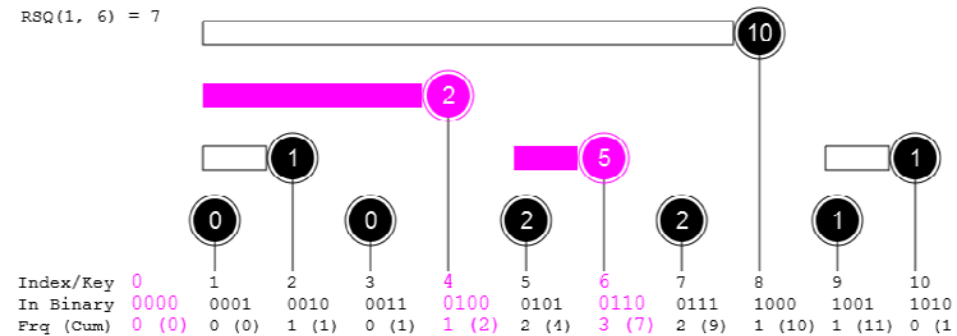


Analysis:  
This is  
 $O(\log n)$

Why?

# Fenwick Tree – RSQ (2)

- To get the cumulative frequency from index a to b, use  $rsq(a, b)$ 
  - If a is **greater than one**, we use:  $rsq(b) - rsq(a-1)$
  - Example:  $rsq(4, 6)$ 
    - $rsq(4, 6) = rsq(6) - rsq(4-1) = rsq(6) - rsq(3) = (5+2) - (0+1) = 7 - 1 = 6$



Analysis:

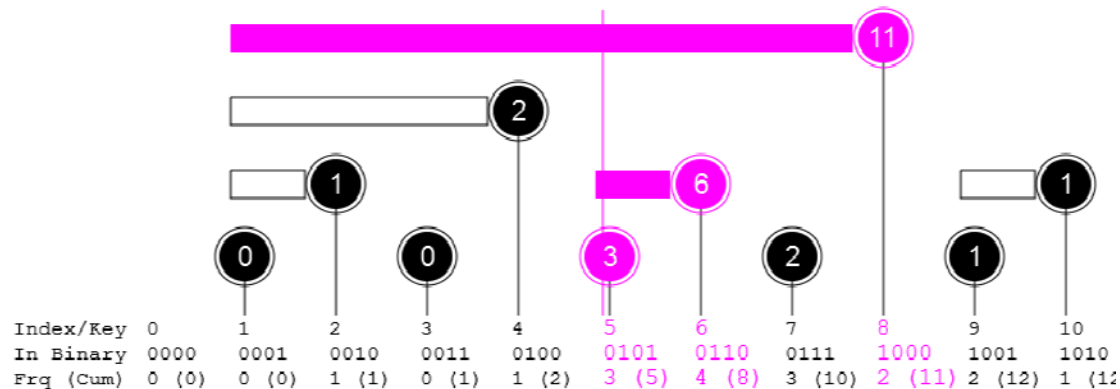
This is  
 $O(2 \log n) =$   
 $O(\log n)$

Why?

# Fenwick Tree – Update

- To update the frequency of an key/index  $k$  by  $v$  ( $v$  is either positive or negative), use  $\text{adjust}(k, v)$ 
  - Indices that are related to  $k$  via  $k' = k + \text{LSOne}(k)$  will be updated by  $v$  when  $k < \text{ft.size}()$
  - Example:  $\text{adjust}(5, 1)$ 
    - $k = 5 = 010\mathbf{1}$ ,  $k' = k + \text{LSOne}(k) = 010\mathbf{1} + 000\mathbf{1}$ ,  $k' = 6 = 01\mathbf{1}0$
    - $k' = 6 = 01\mathbf{1}0$ ,  $k'' = k' + \text{LSOne}(k') = 01\mathbf{1}0 + 00\mathbf{1}0$ ,  $k'' = 8 = \mathbf{1}000$
    - $k'' = 8 = \mathbf{1}000$ ,  $k''' = k'' + \text{LSOne}(k'') = \mathbf{1}000 + \mathbf{1}000$ ,  $k''' = 16 = \mathbf{1}0000 \rightarrow \text{stop}$
  - Observe that the **pink line** in the figure below **stabs through** the ranges that are under the responsibility of indices 5, 6, and 8

- $\text{ft}[5]$ , 2 updated to 3
- $\text{ft}[6]$ , 5 updated to 6
- $\text{ft}[8]$ , 10 updated to 11



Analysis:  
This is also  
 $O(\log n)$

Why?

# Fenwick Tree – Library

```
class FenwickTree {
private: vi ft; // recall that vi is: typedef vector<int> vi;
public: FenwickTree(int n) { ft.assign(n + 1, 0); } // init n + 1 zeroes
    int rsq(int b) { // returns RSQ(1, b)
        int sum = 0; for (; b; b -= LSOne(b)) sum += ft[b];
        return sum; } // note: LSOne(S) (S & (-S))
    int rsq(int a, int b) { // returns RSQ(a, b)
        return rsq(b) - (a == 1 ? 0 : rsq(a - 1)); }
    // adjusts value of the k-th element by v (v can be +ve/inc or -ve/dec)
    void adjust(int k, int v) { // note: n = ft.size() - 1
        for (; k < (int)ft.size(); k += LSOne(k)) ft[k] += v; }
};
```

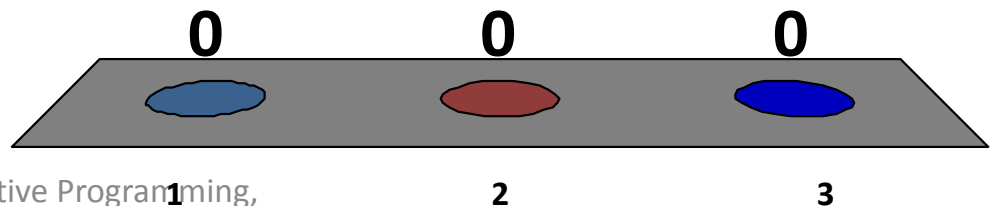
# Fenwick Tree – Sample Application

- Fenwick Tree is very suitable for *dynamic* RSQs (cumulative frequency table) where update occurs on a certain index only
- Now, think of potential real-life applications!
  - <http://uhunt.felix-halim.net/id/32900>
  - Consider code runtime of [0.000 - 9.999]s for a particular UVa problem
    - There are up to 10+ million submissions/codes
      - About thousands submissions per problem
    - If your code runs in 0.342 secs, what is your rank?
- How to use Fenwick Tree to deal with this problem?



# Quick Check

1. I am lost with Fenwick Tree
2. I understand the basics of Fenwick Tree, but since this is new for me, I may/may not be able to recognize problems solvable with FT
3. I have solved several FT-related problems before





# Summary

- There are a lot of *great* Data Structures out there
  - We need the most efficient one for our problem
    - Different DS suits different problem!
- Many of them have **built-in libraries**
  - For some others, we have to build **our own (focus on FT)**
    - Study these libraries! Do not rebuild them during contests!
- From Week03 onwards and future ICPCs/IOIs, use C++ STL and/or Java API and our built-in libraries!
  - Now, your team should be in rank 30-45 (from 60) (still solving ~1-2 problems out of 10, but faster)

# References

- **Competitive Programming 2.9**, Chapter 2
  - Steven, Felix ☺
- **A new data structure for cumulative frequency table**
  - Peter M Fenwick
  - <http://www.uop.edu.jo/download/pdfcourses/ds/19492.pdf>
- **Fenwick Tree @ TopCoder**
  - By boba5551
  - <http://community.topcoder.com/tc?module=Static&d1=tutorials&d2=binaryIndexedTrees>

# Study These Visualizations

- <http://www.comp.nus.edu.sg/~stevenha/visualization/bitmask.html>
- <http://www.comp.nus.edu.sg/~stevenha/visualization/bit.html>
- You can use your smart phones/tablet PCs to access them 😊
- Google searches (as of last year), there is no other visualizations on bitmask/BIT like these
- PS: Report bugs to Steven, if any