

This course material is now made available for public usage.
Special acknowledgement to School of Computing, National University of Singapore
for allowing Steven to prepare and distribute these teaching materials.



CS3233

Competitive Programming

Dr. Steven Halim

Week 02 – Data Structures & Libraries

Focus on Bit Manipulation & Binary Indexed Tree

Outline

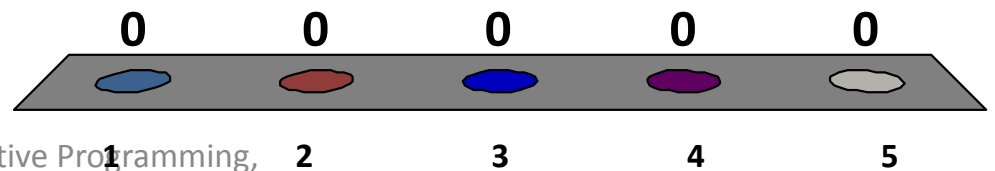
- Mini Contest #1 + Break + Discussion + Admins
- Data Structures With Built-in Libraries
 - Just a *very quick* walkthrough
 - The pace of this lecture may be frightening for some students...
 - Additional help session on Saturday, 26 Jan 2013, 10am-12pm @ PL6
 - Read the book (Chapter 2) + experiment with the details on your own
 - Linear Data Structures (CS1010/1st half of CS2020)
 - Non Linear Data Structures (CS2010/2nd half of CS2020)
- Data Structures With Our-Own Libraries
 - Focus on Binary Indexed (Fenwick) Tree

Basic knowledge that all ICPC/IOI-ers must have!

LINEAR DATA STRUCTURES WITH BUILT-IN LIBRARIES

I am...

1. A pure C coder
2. A pure C++ coder
3. A mix between C/C++ coder
4. A pure Java coder
5. A multilingual coder: C/C++/Java



Linear DS + Built-In Libraries (1)

1. Static Array, built-in support in C/C++/Java
 2. Resize-able: C++ STL **vector**, Java **Vector**
 - Both are very useful in ICPCs/IOIs
 - PS: Java **ArrayList** *may be* slightly faster
- There are 2 very common operations on Array:
 - Sorting
 - Searching
 - Let's take a look at efficient ways to do them

Two “fundamental” CS problems

SORTING + SEARCHING INVOLVING ARRAY

Sorting (1)

- Definition:
 - Given unsorted stuffs, sort them... *
- Popular Sorting Algorithms
 - $O(n^2)$ algorithms: Bubble/Selection/Insertion Sort
 - $O(n \log n)$ algorithms: Merge/Quick[^]/Heap Sort
 - Special purpose: Counting/Radix/Bucket Sort
- Reference:
 - http://en.wikipedia.org/wiki/Sorting_algorithm

Sorting (2)

- In ICPC, you can “forget” all these...
 - In general, if you need to sort something..., just use the $O(n \log n)$ sorting library:
 - C++ STL **algorithm::sort**
 - Java **Collections.sort**
- In ICPC, sorting is either used as *preliminary step* for more complex algorithm or to *beautify output*
 - Familiarity with sorting libraries is a must!

Sorting (3)

- Sorting routines in C++ STL **algorithm**
 - `sort` – a bug-free implementation of *introsort**
 - Fast, it runs in $O(n \log n)$
 - Can sort basic data types (ints, doubles, chars), **Abstract Data Types (C++ class)**, **multi-field sorting (≥ 2 criteria)**
 - `partial_sort` – implementation of *heapsort*
 - Can do $O(k \log n)$ sorting, if we just need top-k sorted!
 - `stable_sort`
 - If you need to have the sorting ‘stable’, keys with same values appear in the same order as in input

Searching in Array

- Two variants:
 - When the array is sorted versus not sorted
- Must do $O(n)$ linear scan if not sorted - trivial
- Can use $O(\log n)$ binary search when sorted
 - PS: must run an $O(n \log n)$ sorting algorithm once
- Binary search is ‘tricky’ to code!
 - Instead, use C++ STL **algorithm::lower_bound** or Java **Collections.binarySearch**

Linear DS + Built-In Libraries (2)

3. Array of Boolean: C++ STL **bitset**

- Should be faster than **array of Booleans** or **vector<bool>!**
- No specific API in Java that is similar to this

4. **Bitmask (One important point of this lecture)**

- **a.k.a. lightweight set of Boolean or bit string**
- **Explanation via:**

<http://www.comp.nus.edu.sg/~stevenha/visualization/bitmask.html>



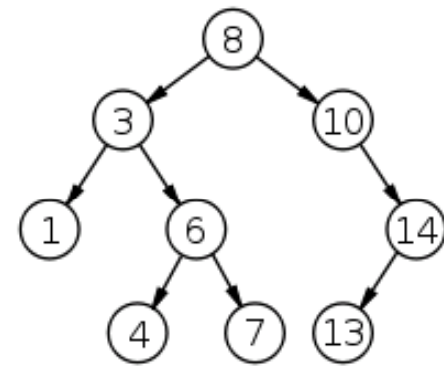
Linear DS + Built-In Libraries (3)

5. Linked List, C++ STL **list**, Java **LinkedList**
 - Usually not used... just use **vector**!
6. Stack, C++ STL **stack**, Java **Stack**
 - Used by default in Recursion, Postfix Conversion/Calculation, Bracket Matching, etc
7. Queue, C++ STL **queue**, Java **Queue**
 - Used in Breadth First Search, Topological Sort, etc
8. Deque, C++ STL **deque**, Java **Deque**
 - Used in algorithms for ‘Sliding Window’ problem, etc

More efficient data structures

NON-LINEAR DATA STRUCTURES WITH BUILT-IN LIBRARIES

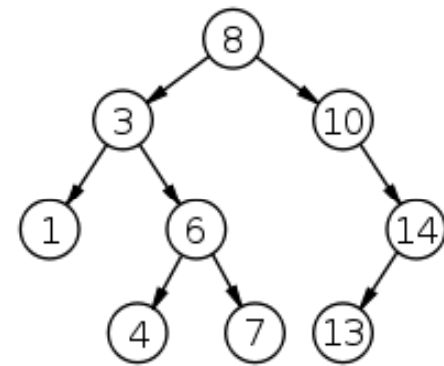
Binary Search Tree (1)



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)*

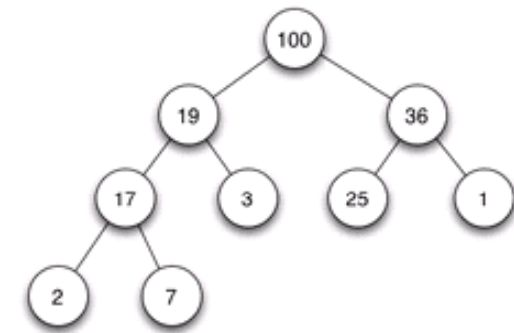
Binary Search Tree (2)



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

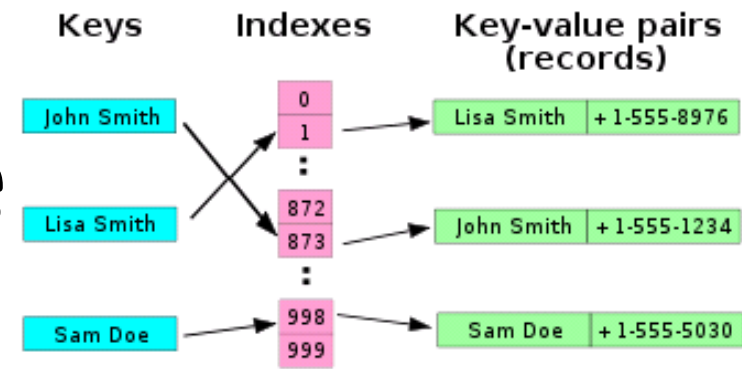
Heap



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)

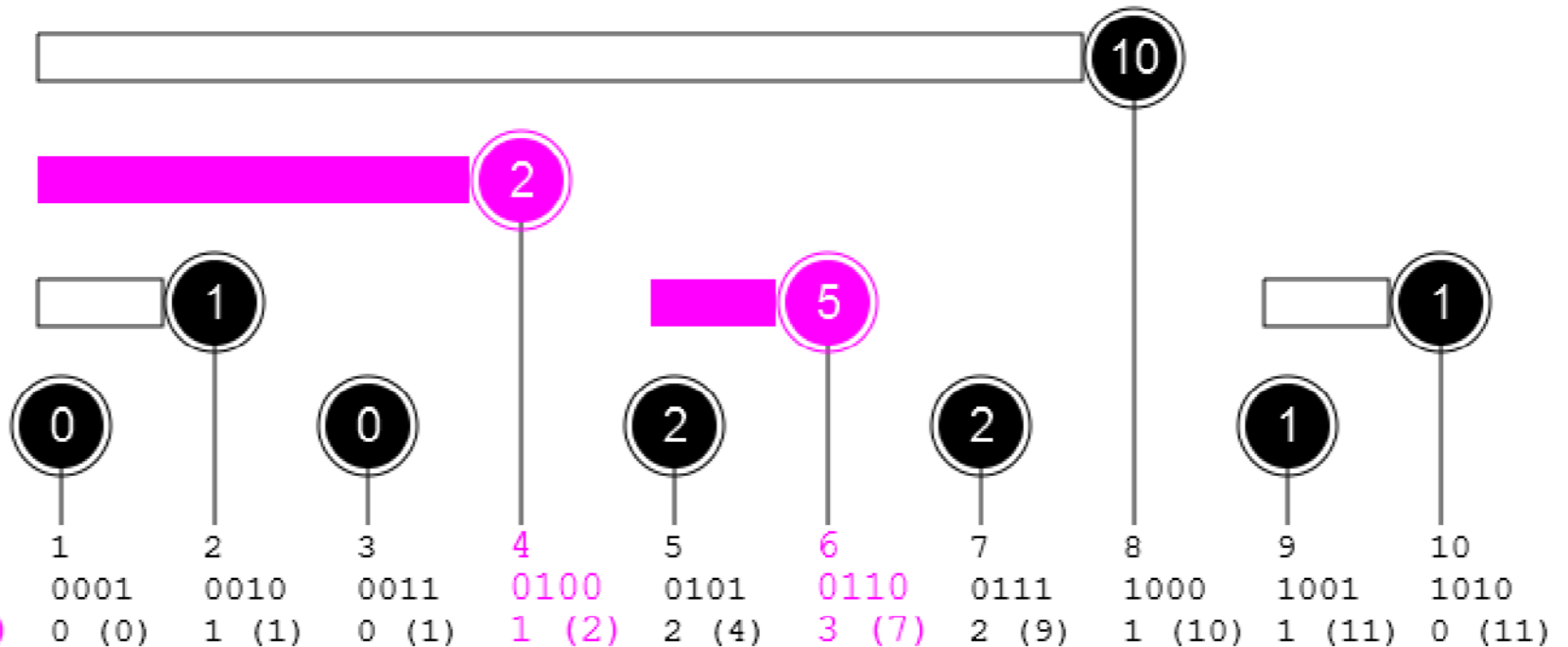
- Cumulative Frequency Table
 - Example, $s = \{2,4,5,5,6,6,6,7,7,8,9\}$ (already sorted)

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

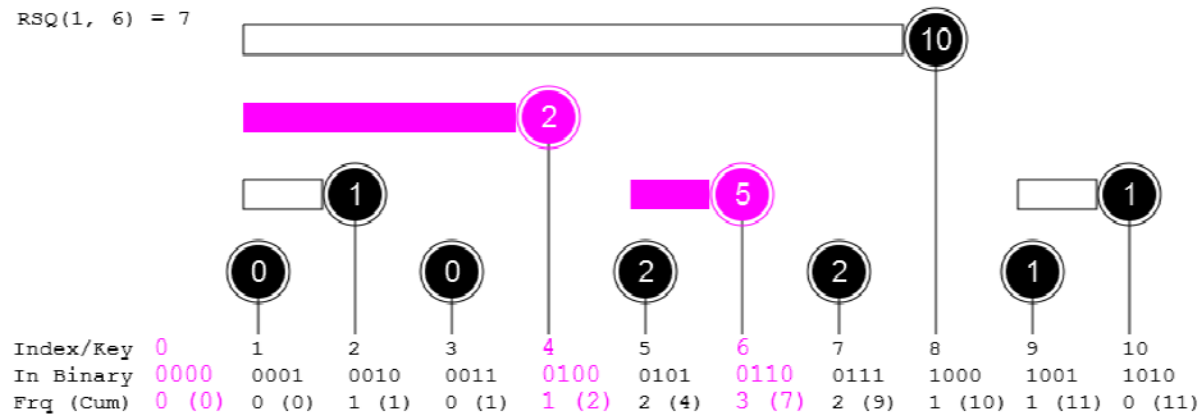


Fenwick Tree – Basics (3)

- 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

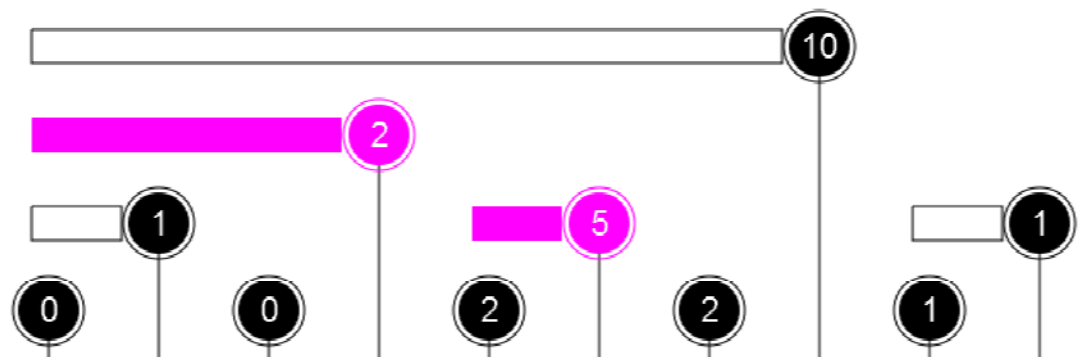
RSQ(1, 6) = 7



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 $b' = b - \text{LSOne}(b)$
 - Apply this formula iteratively until b is 0
 - Example: $rsq(6)$
 - $b = 6 = 0110$, $b' = b - \text{LSOne}(b) = 0110 - 0010$, $b' = 4 = 0100$
 - $b' = 4 = 0100$, $b'' = b' - \text{LSOne}(b') = 0100 - 0100$, $b'' = 0 \rightarrow \text{stop}$
 - Sum $ft[6] + ft[4] = 5 + 2 = 7$ (the pink area covers range $[1..4] + [5..6] = [1..6]$)

$RSQ(1, 6) = 7$



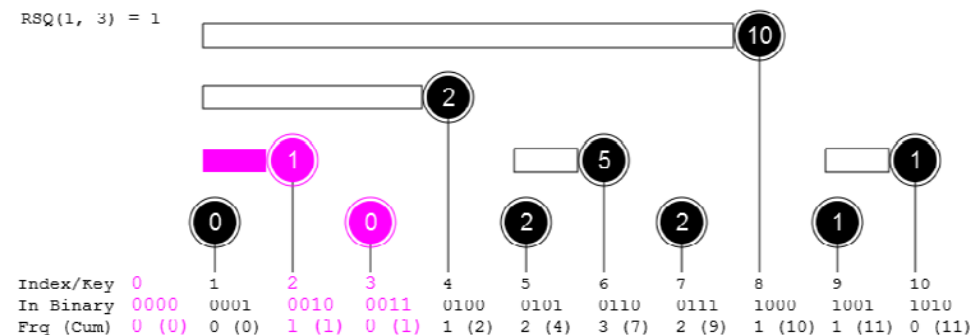
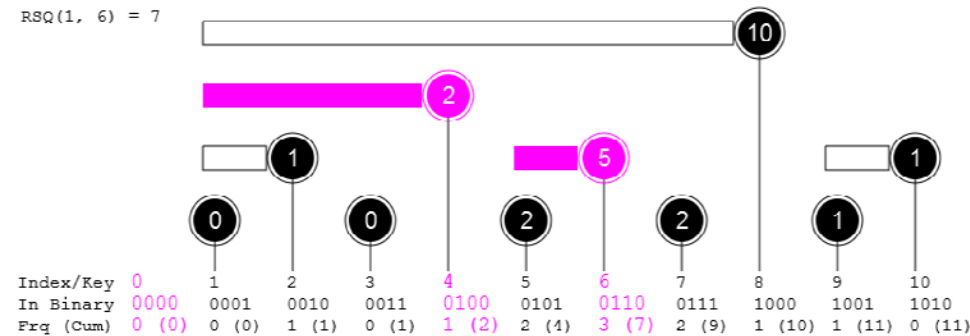
Index/Key	0	1	2	3	4	5	6	7	8	9	10
In Binary	0000	0001	0010	0011	0100	0101	0110	0111	1000	1001	1010
Frq (Cum)	0 (0)	0 (0)	1 (1)	0 (1)	1 (2)	2 (4)	3 (7)	2 (9)	1 (10)	1 (11)	0 (11)

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:

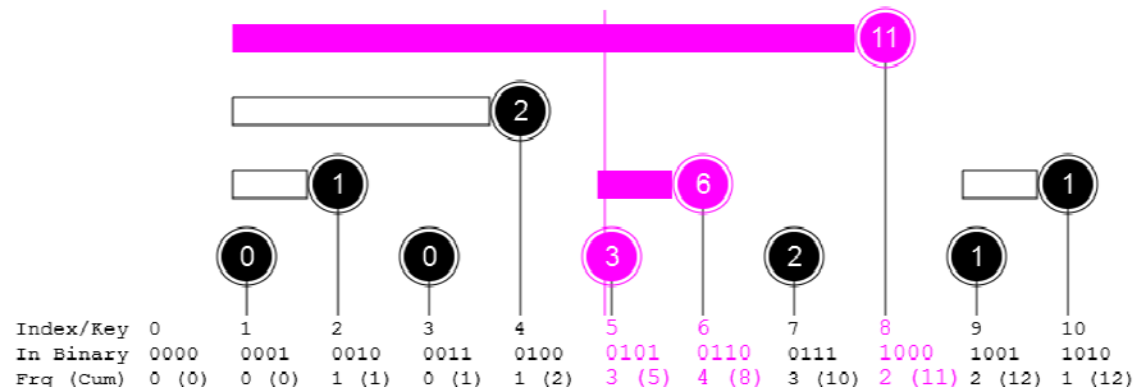
This is
 $O(2 \log n) =$
 $O(\log n)$

Why?

Fenwick Tree – Update

- To update the frequency of an key/index k by v (v is either positive or negative), use `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: `adjust(5, 1)`
 - $k = 5 = 010\mathbf{1}$, $k' = k + \text{LSOne}(k) = 010\mathbf{1} + 000\mathbf{1}$, $k' = 6 = 01\mathbf{10}$
 - $k' = 6 = 01\mathbf{10}$, $k'' = k' + \text{LSOne}(k') = 01\mathbf{10} + 00\mathbf{10}$, $k'' = 8 = \mathbf{1000}$
 - $k'' = 8 = \mathbf{1000}$, $k''' = k'' + \text{LSOne}(k'') = \mathbf{1000} + \mathbf{1000}$, $k''' = 16 = \mathbf{10000} \rightarrow \text{stop}$
 - 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 -= LOne(b)) sum += ft[b];
        return sum; } // note: LOne(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 += LOne(k)) ft[k] += v; }
};
```

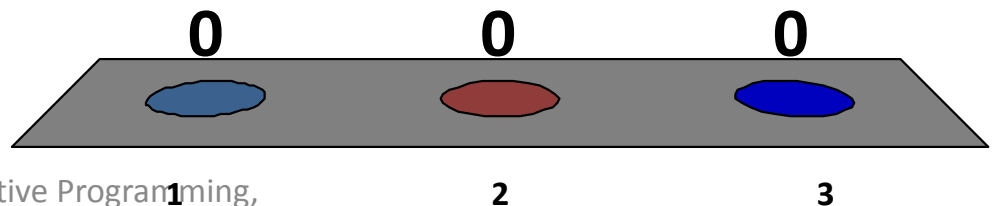
Fenwick Tree – Sample Application

- 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