



# Lab 9 - Graph Traversal

CS2040S Data Structures & Algorithms

AY20/21 Semester 1

Week 11

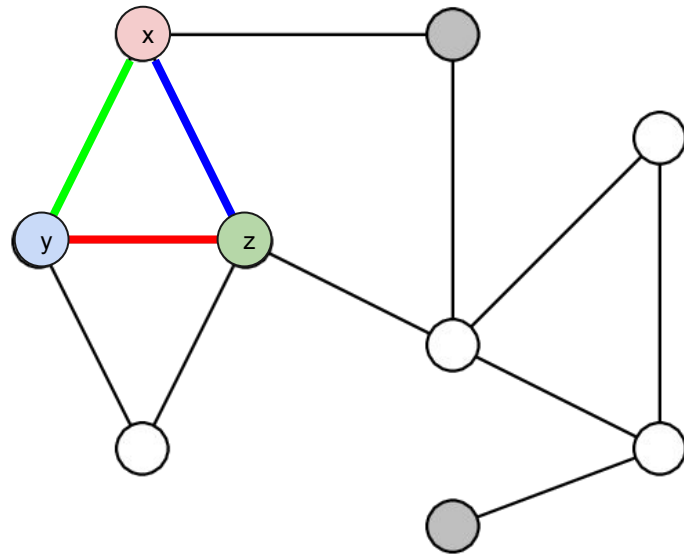
# One-Day Assignment 7 - Weak Vertices



- Given  $T (\leq 100)$  undirected unweighted graphs
  - Each graph is given in adjacency matrix form
    - $N \leq 20$  vertices per graph
  - Print out all “weak” vertices in ascending order
    - Vertex not part of any triangle  $\Rightarrow$  “weak”

# Triangles

- $(x,y,z)$  is triangle in graph
  - $\Leftrightarrow (x,y), (y,z), (x,z)$  exist
  - $\Leftrightarrow$  We have the length-3 cycle
    - $x \rightarrow y \rightarrow z \rightarrow x$
- For any vertex  $x$ ,
  - How to find if some triangle contains  $x$ ?
  - What kind of graph DS operations do we want?
  - How fast can we answer that?



# One-Day Assignment 7 - Weak Vertices

- Constraints:
  - Number of graphs: up to 100
  - Number of vertices per graph: up to 20

Can I try out every possible combination?



# One-Day Assignment 7 - Weak Vertices

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- Constraints:
  - Number of graphs: up to 100
  - Number of vertices per graph: up to 20
- $V^3$  algorithm to select all possible 3-vertex combinations
  - $20^3 = 8000$
- Up to 100 graphs
  - $8000 \times 100 = 800k \leq 100$  million
  - Runs in time!

# One-Day Assignment 7 - Weak Vertices

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- Which Graph DS to use?
  - You need to check for existence of edge many times
  - Adjacency Matrix
    - $O(1)$  to check if edge exists between two given vertices
    - Question already provides the graph in this form

# Solutions



1. For each graph:
  - Mark all vertices as weak
  - For vertex  $i$  in graph
    - For vertex  $j$  in graph
      - For vertex  $k$  in graph
        - Check if edge exists between  $i - j$ ,  $j - k$  and  $k - i$
        - If yes, mark vertex  $i$ ,  $j$  and  $k$  as strong

# One-Day Assignment 7 - Weak Vertices



- Note that it is easier to keep track of “Strong Vertices” rather than “Weak vertices”
- Finding a triangle guarantees that the three vertices are strong
- Having no triangle between the given 3 vertices does not guarantee that the vertices are weak
  - They may be part of other triangles

# Graph Traversal



- Two main method of Graph Traversal for **finite graphs**
  - Breadth-First Search
  - Depth-First Search
- Pseudocode in lecture notes, we'll cover implementation caveats

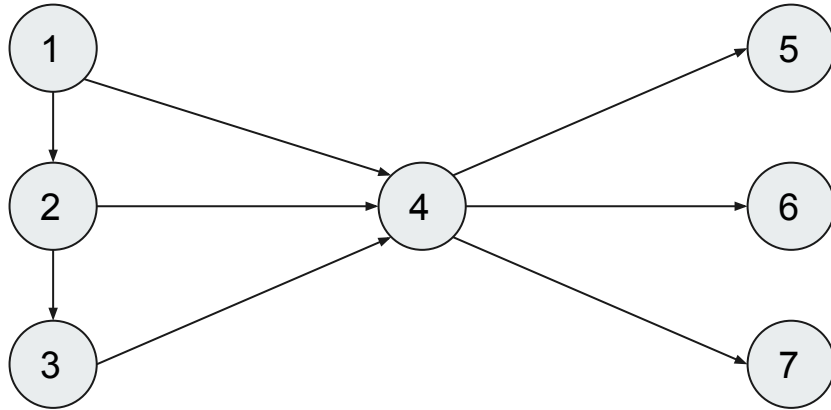
# Graph Traversal - BFS



- Breadth-First Search (BFS)
  - Tends to employ a queue
  - Keep track of visited vertices
  - **When to mark a vertex as visited?**
    - Let's try marking as visited only when a vertex is removed from the queue

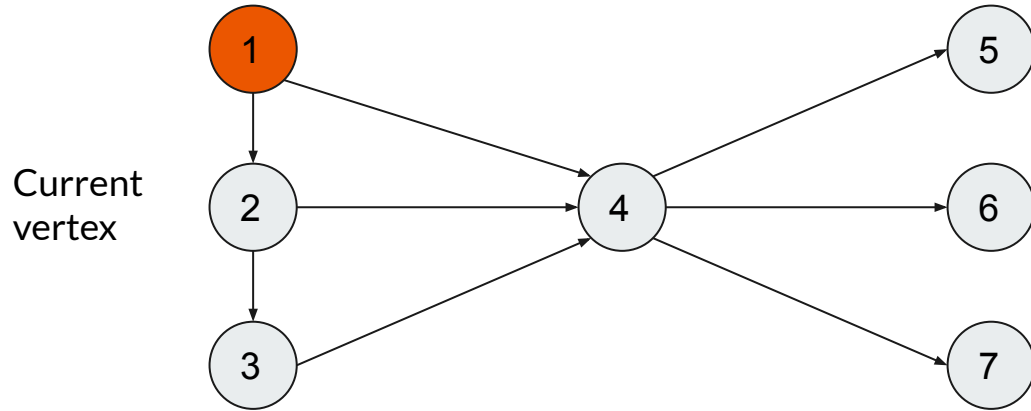
# Graph Traversal - BFS

Begin BFS from 1



Queue
Node 2
Node 4

# Graph Traversal - BFS



Queue
Node 4
Node 3
Node 4

Duplicate in the queue!

# Graph Traversal - BFS



- Same vertex is enqueued into the queue again!
  - Slows down your program
  - Worse as the graph gets more connected
- Mark a vertex as visited as you enqueue it

# Graph Traversal - DFS



- Depth-First Search (DFS)
  - Tends to employ a implicit stack via recursion
  - May result in running out of computer memory that OS provides
    - Can use iterative DFS using an explicit stack instead

# Traversing Multiple CCs

- Single call of BFS/DFS may not cover whole graph
  - If graph disconnected, it will only visit one of the CCs
- Solution:
  - Try starting from every vertex
- If we retry from every single vertex
  - Re-visiting a CC wastes time
- Solution:
  - Keep a **global** visited array
  - Shared between all search calls

For start in  $[1..V]$   
If not Visited[start]  
Search(start)

# One-Day Assignment 9 - Islands



- Given a map of  $r$  rows and  $c$  columns ( $1 \leq r, c \leq 50$ ), find the minimum number of islands possible
- Each cell can represent **land (L)**, **water (W)** and cloud (C)
- Island is defined as region of land that is connected to every other by some path, only in 4 directions (up, down, left, right)

# One-Day Assignment 9 - Islands

w	w	w	w	w
w	w	L	w	w
w	L	L	L	w
w	w	L	w	w
w	w	w	w	w

single Island

w	w	w	w	w
w	L	W	L	w
w	W	L	W	w
w	L	W	L	w
w	w	w	w	w

5 Islands

# One-Day Assignment 9 - Islands



- How should we store the graph?
  - Each coordinate is a vertex
  - Each vertex has an edge to the 4 adjacent vertex
- **You can treat the map itself as the graph!**
  - Vertex  $(x, y)$  has an edge to vertex  $(a, b)$  if their coordinate value differ only by one
  - $(3, 2)$  has an edge to  $(2, 2)$ ,  $(4, 2)$ ,  $(3, 1)$  and  $(3, 3)$

# One-Day Assignment 9 - Islands



- Curveball: Cloud can be either Land or Water
- We want to find the **minimum possible** number of islands on the map
- What should the clouds be?

# Assignment Guidelines

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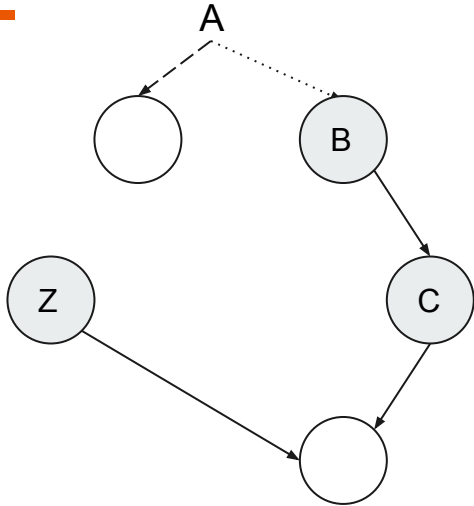
- Include your **name** and **student number** in comments at the top of your code.
- You are allowed (and encouraged) to discuss algorithms
  - List down all your collaborators in your source code
- **You are NOT allowed to:**
  - **Copy another person's code**
  - **Look at another person's code**
  - **Use another person's code as a base for your own code**
- Plagiarism checks will be in place

# Take-Home Lab 3 - Ladice

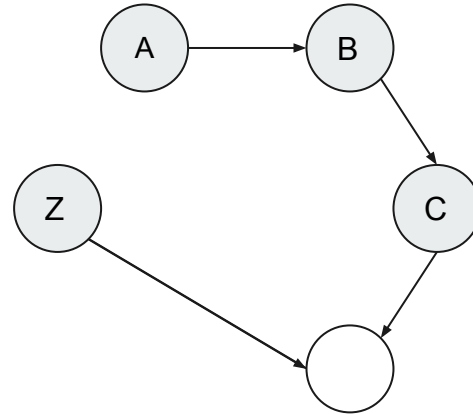
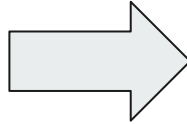


- N items, L drawers
    - Each item has 2 allowed positions  $A_i$ ,  $B_i$
  - Try to insert each item
    - If successful, print LADICA
    - If discarded, print SMECE
1. Try position  $A_i$ .
  2. Try position  $B_i$ .
  3. Try repeatedly pushing the item already at  $A_i$  to its other positions, until a free space is reached.  
If we loop, continue to next rule.
  4. Try repeatedly pushing the item already at  $B_i$  to its other positions, until a free space is reached.  
If we loop, continue to next rule.
  5. Discard the item.

# Pushing Stuff Back

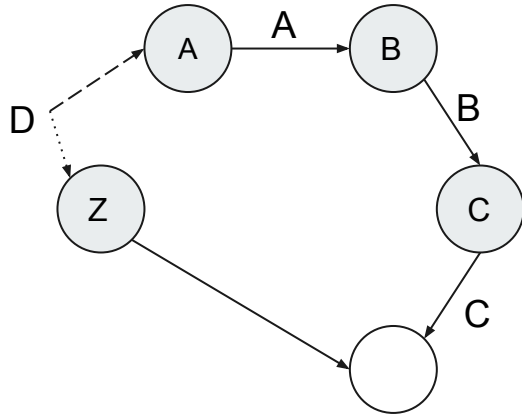


Can we track where we can “push” items to make space?

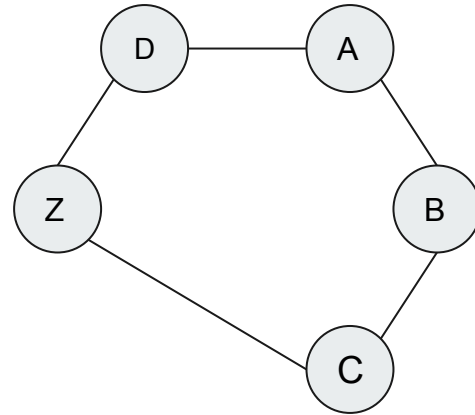
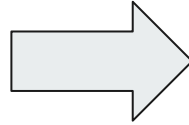


Not full yet, still have empty drawer  
Can still push stuff

# Pushing Stuff Back, Redux

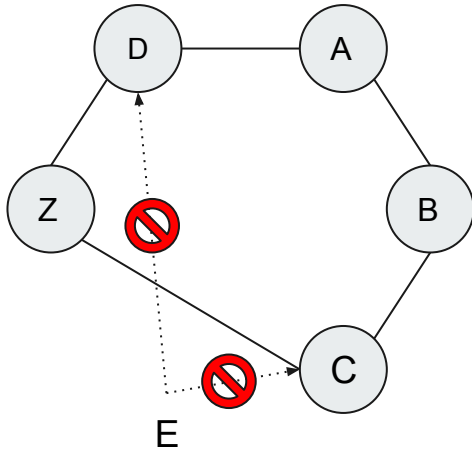


Not full yet, still have empty drawer  
Can still push stuff



Full, we can't push forward/backward  
any of these items.

# Pushing Stuff But Failing

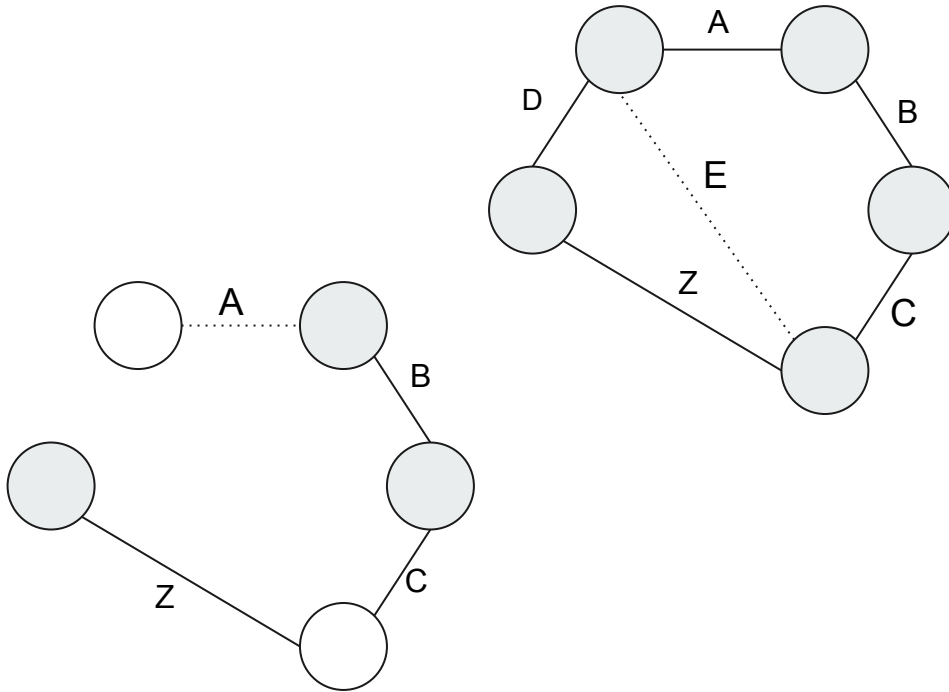


When is a “bunch” of drawers **full**?  
(i.e. cannot push to make space?)

Here, drawers holding {A,B,C,D,Z} are full.

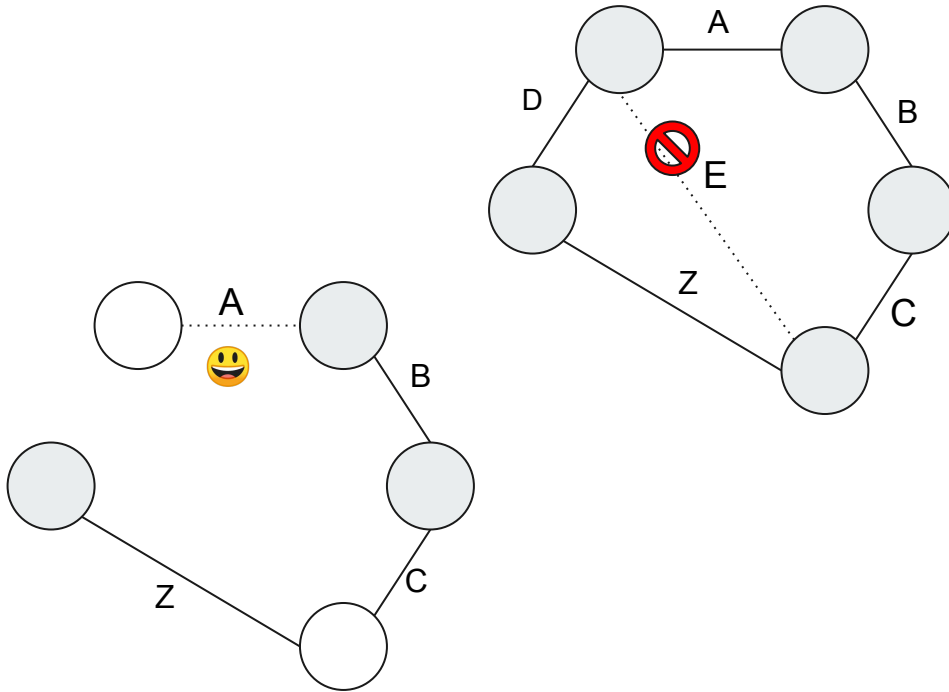
NEW: In hindsight, these look like a graph...

# Key Insight: Actual Positions Don't Matter



- Item positions don't actually matter!
  - As long as there is free space
  - Possibly after pushing back a chain of items.
- Items only have **2 valid positions**
  - Can “slide” back and forth between these 2 drawers
  - We want to push entire chains of items at once
- Model as graph
  - Vertices: Drawers
  - Edges: Items

# Key Insight: Model as Graph



- Model as graph
  - Vertices: Drawers
  - Edges: Items
- Connected component (“bunch”)
  - Still have space if:
    - $K$  vertices (drawers)
    - $K-1$  edges (items)
    - **Tree!**
  - No more space if:
    - $K$  vertices (drawers)
    - $K$  edges (items)
    - **Contains 1 cycle!**

# Graph and UFDS

- Equivalent ideas:
  - UFDS node
    - Graph vertex
  - UFDS disjoint set
    - Graph connected component
- Find(a)
  - Find **representative** for a's connected component
- Union(a,b)
  - AddEdge(a,b)

## TAKEAWAY

UFDS can be used for the **dynamic connectivity problem** for graphs.

- Connectivity => Test if (a,b) are **currently** connected.
- Dynamic => Can add edges on the fly
  - UFDS doesn't support remove!

# Cycle Detection



- How do we know when a “bunch of drawers” is full?
  - Connected component has  $|\text{vertices}| = |\text{edges}|$
  - We completed a cycle!
- When does AddEdge/Union( $u,v$ ) make a cycle?
  - When  $u$  and  $v$  are already connected.
  - i.e. Already have  $\text{Find}(u) == \text{Find}(v)$
- Slight modification of UFDS code

# Union

```
void union(int a, int b) {
    int x = find(a);
    int y = find(b);
    if(x == y) return;

    if(rank[y] < rank[x]) {
        parent[y] = x;
    } else {
        if(rank[x] == rank[y]) rank[y]++;
        parent[x] = y;
    }
}
```

```
boolean union(int a, int b) {
    int x = find(a);
    int y = find(b);
    if(x == y) return true;

    if(rank[y] < rank[x]) {
        parent[y] = x;
    } else {
        if(rank[x] == rank[y]) rank[y]++;
        parent[x] = y;
    }
    return false;
}
```

Union(a,b) returns true if a,b were already connected.  
(i.e. union-ing failed)

# Ladice




## TAKEAWAY

UFDS can be used for the **dynamic connectivity problem** for graphs.

- Connectivity => Test if (a,b) are **currently** connected.
- Dynamic => Can add edges on the fly
  - UFDS doesn't support remove!

1. Make UFDS of N drawers/vertices
2.  $IsFull = \text{new boolean}[N]$
3. For each item in input, read positions [a,b].
  - a. If  $IsFull[Find(a)] \ \&\& \ IsFull[Find(b)]$ , reject.
  - b.  $WillBeFull = IsFull[Find(a)] \ || \ IsFull[Find(b)]$
  - c. If  $Union(a,b) \ || \ WillBeFull$ 
    - If Union returns true, we completed a cycle in the CC containing a & b.
    - Otherwise, they were separate. If one was full, combined CC is full.
  - i.  $IsFull[Find(a)] = True$

# Take-Home Lab 3 - Factor-Free Tree

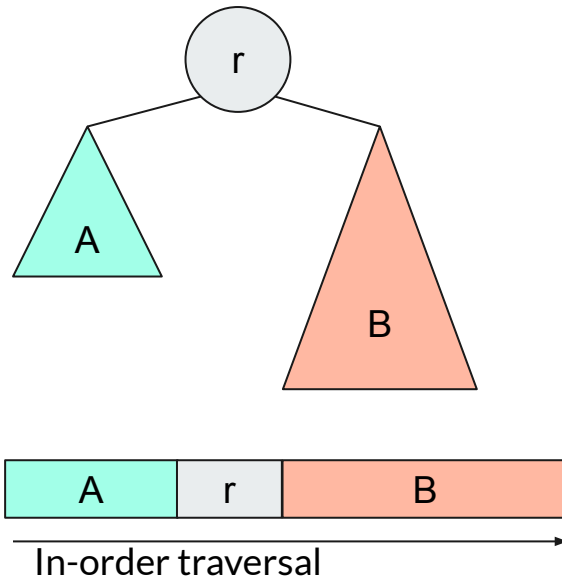


- A **factor-free** tree is a binary tree, with natural numbers at each node
  - Any node value is coprime to all of its ancestor node values
- Given an **in-order** traversal of this binary tree
  - Reconstruct a valid factor-free tree
  - Does not have to be the original, any valid is OK

Factor-free trees are made just for this problem, they are not a 2040S DS.

# Tree Construction

- Property of in-order traversal:
  - [left subtree] (root) [right subtree]
- Maybe we can borrow a page from the perfect binary tree construction.
  - Find an *appropriate* root (position  $r$ )
  - Split and recurse on left/right halves
    - Produce left/right subtrees

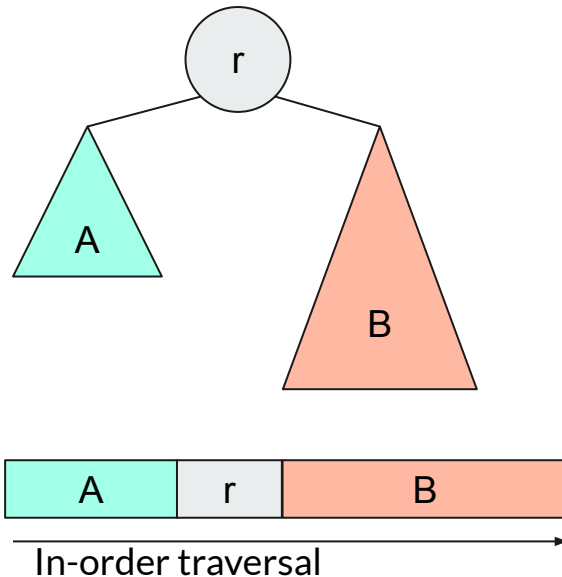


# Tree Construction

- Can we find **the original** root (if any)?
- Can we find a **possible** root?
  - Root has to be coprime with all its descendants

## IDEA: Black-box the CanBeRoot check.

- Pretend CanBeRoot is given to us.
  - “Oracle”/“Black-box”
  - We don’t know/care how it works for now
- Can query it for the answer in 🍕
  - Hopefully 🍕 is fast
    - (e.g. constant or log).



# Guessing the Root?



- If possible, guaranteed to have at least 1 tree
  - The original tree
- What happens if at some subarray  $[L,R]$ 
  - We choose a different root than the original tree?
  - Is it possible to fail later? (i.e. we made a bad choice)

# Safe!



- If we failed, that means at some subarray  $[L, R]$ 
  - We cannot find a possible subtree root
- We try following a path in the original tree
  - All original subtrees/subarrays fully covering  $[L, R]$
- At the lowest subtree still fully covering  $[L, R]$ 
  - Original choice splits  $[L, R]$ , as children do not cover  $[L, R]$
  - Original choice must be inside  $[L, R]$ 
    - Coprime to rest of  $[L, R]$  and possibly more
  - We still have that choice. Contradiction!
- **Upshot: Guessing a possible root will NOT doom us later.**

# Tree Construction

$K$  = Number of elements in subarray  
 $= R - L + 1$

$D$  = Distance of chosen root, from start

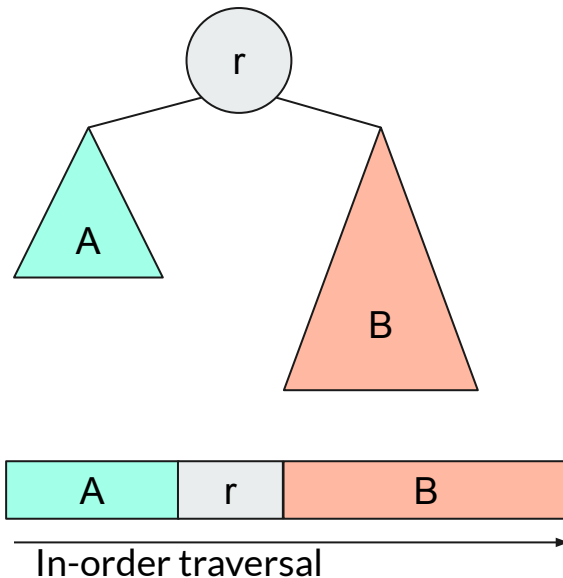
$$T(K) = D * \text{🍕} + T(D) + T(K-D)$$

```
// Try to tree-ify subarray [L,R]
// Return true iff possible.
Treeify(L, R, previousRoot)
    if( R < L )
        Subarray is empty, return True.
    For each position x in [L,R]
        if CanBeRoot(x, L, R) 🍕 repeated D times
            Parent[x] = previousRoot
            Return Treeify(L, x-1, x) T(D) && Treeify(x+1, R, x) T(K-D)

// If we reach here, we failed to find a root.
Return False.
```

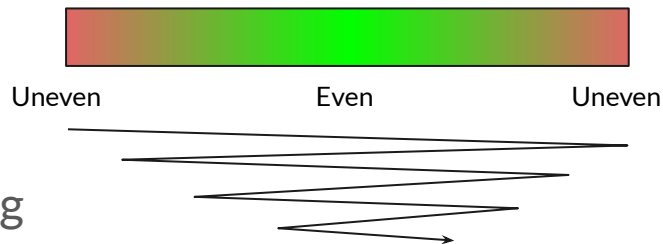
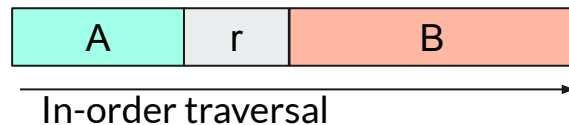
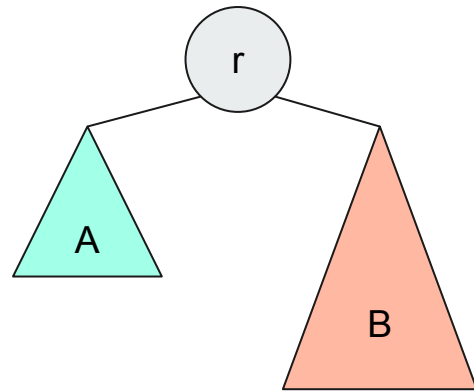
# Tree Construction

- What's our recurrence relation?
  - $T(K) = \text{🍕} * D + T(D) + T(K-D)$
  - $O(1)$  work + *uneven* split  $\Rightarrow O(\text{🍕 } n)$  total
    - Very good!
  - $O(n)$  work + even split  $\Rightarrow O(\text{🍕 } n \log n)$  total
    - Not too bad
  - $O(n)$  work + *uneven* split  $\Rightarrow O(\text{🍕 } n^2)$  total
    - How did we end up here?
    - Can we avoid this case?



# Tree Construction

- We want to avoid two bad things at once:
  - Slow work
    - Root search visits this last.
  - Uneven split
    - Root chosen near end.
- At most 1 still OK.
- IDEA: **Zigzag, starting from both ends**
  - Handle the uneven split **early**
    - Fast work + uneven split  $\Rightarrow O(\text{🍕 } n)$
  - Handle the even split **late**
    - Linear work + even split  $\Rightarrow O(\text{🍕 } n \log n)$



# (Mostly) Formal Proof by Induction

Let  $k$  be length of subarray.

Let  $d$  be minimum distance to either end.

$$1 \leq d \leq k/2$$

Assume  $T(k) \leq 2 \text{ 🍕 } k \log_2 k$ , for smaller values of  $k$ .


$$\begin{aligned}
 T(k) &\leq \min_{\{1 \leq d \leq k/2\}} 2d \text{ 🍕 } + T(d) && + T(k-d) \\
 &\leq \min_{\{1 \leq d \leq k/2\}} 2d \text{ 🍕 } + 2 \text{ 🍕 } d \log_2 d && + 2 \text{ 🍕 } (k-d) \log_2 (k-d) \\
 &= \min_{\{1 \leq d \leq k/2\}} 2 \text{ 🍕 } [d + d \log_2 d] && + (k-d) \log_2 (k-d)] \\
 &\leq \min_{\{1 \leq d \leq k/2\}} 2 \text{ 🍕 } [d + d \log_2 (k/2)] && + (k-d) \log_2 (k-d)] \\
 &= \min_{\{1 \leq d \leq k/2\}} 2 \text{ 🍕 } [d + d (\log_2 k - 1)] && + (k-d) \log_2 (k-d)] \\
 &= \min_{\{1 \leq d \leq k/2\}} 2 \text{ 🍕 } [d \log_2 k] && + (k-d) \log_2 (k-d)] \\
 &\leq \min_{\{1 \leq d \leq k/2\}} 2 \text{ 🍕 } [d \log_2 k] && + (k-d) \log_2 k] \\
 &= \min_{\{1 \leq d \leq k/2\}} 2 \text{ 🍕 } k \log_2 k \\
 &= 2 \text{ 🍕 } k \log_2 k
 \end{aligned}$$

Expand inductive hypothesis.

$d \leq k/2$ , so  $\log_2 d \leq \log_2 k/2$

$k-d \leq k$ , so  $\log_2 (k-d) \leq \log_2 k$

# Opening the Box

- How do we quickly find if an element is a possible root?
  - If we can make  fast, we are done!
- Each time we recurse on some subarray [l,r]
  - “Rootness” of element may change!
- Depends on what other items in subarray
  - Which are not coprime
    - i.e.  $\text{GCD}(\text{notRoot}, \text{other}) \neq 1$

Can 15 be a root?

2	7	15	8	9	5	✗
2	7	15				✓
	7	15	8	9	5	✗
		15	8			✓

# Coprimality

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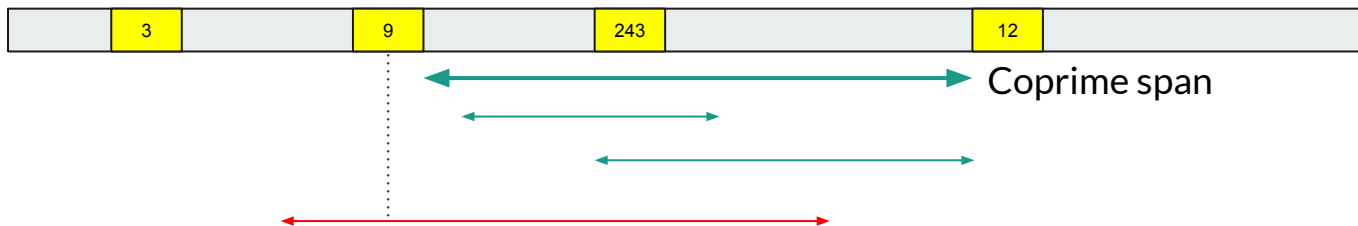
- How to test if two numbers are coprime?
  - GCD,  $O(\log M)$  for numbers at most  $M$ .
- Given  $N$  numbers, how to bulk-test pairwise coprimality?
  - $\text{GCD}(a,b) \neq 1$  iff some prime  $p$  is a common divisor
  - Maybe something to do with prime factorization?
- Let's examine special cases:
  - Only 1 prime divisor

# Prime Powers



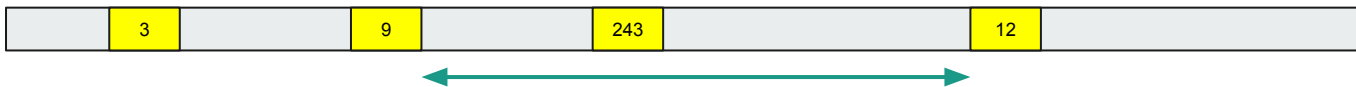
- Take for example,  $243 = 3^4$
- What can “block”/prevent 243 from becoming root?
  - $\text{GCD}(243, X) \neq 1$
  - X must be multiple of 3!
- **IDEA: Track all the multiples of 3 in the whole array.**
  - 243 is only affected by multiples of 3.

# Coprime Spans



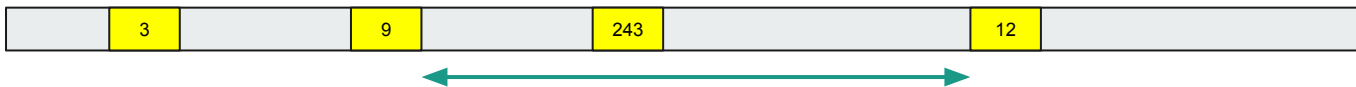
- As long as subarray doesn't cover any other multiple of 3
  - 243 can be a root
- Call the **largest** subarray around 243, without other multiples of 3:
  - **Coprime span** of 243
- 243 can be root in  $[L,R] \Leftrightarrow [L,R]$  fits within **coprime span**
  - If we **precompute all coprime spans**, 🍕 is  $O(1)$ !

# Coprime Span Computation



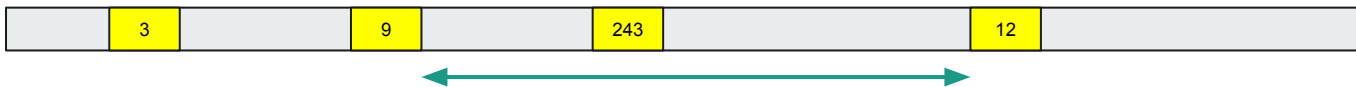
- Method 1: Start at 243.
  - Try expanding left/right, one position at a time
    - Until we hit a multiple of 3.
  - May cover significant part of whole (sub)array
    - Slow! ( $O(N)$ )
- We don't really care about "empty space". Can we "skip" ahead?

# Coprime Span Computation



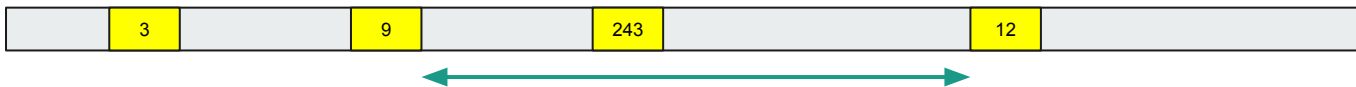
- We don't really care about "empty space". Can we "skip" ahead?
  - Skip to rightmost multiple of 3 **right before 243**
    - Largest index, **less than 243's index**
  - Skip to leftmost multiple of 3 **right after 243**
    - Smallest index, **more than 243's index**
- Looks like TreeSet.lower/higher()!

# Coprime Span Computation: Binary Search



- Method 2: Precompute positions of multiples of 3.
  - When reading input, if multiple of 3, add position to TreeSet.
    - At most  $N$  positions tracked,  $O(N \log N)$  time to add.
  - To compute 243's coprime span:
    - Check `TreeSet.lower/higher(position of 243)`
    - If no lower, span extends to start (index 0)
    - If no higher, span extends to end (index  $N-1$ )
  - $O(\log N)$  to compute 243's span!

# Coprime Span Computation: Binary Search



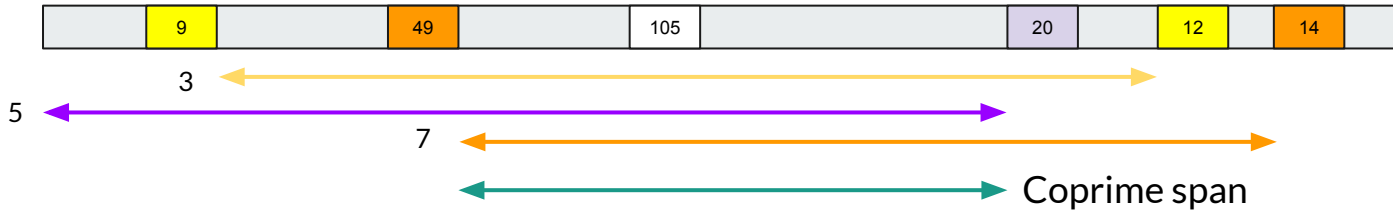
- We don't really use the “dynamic” nature of TreeSet
  - Only build whole thing, then query
- Method 2a: Precompute positions of multiples of 3.
  - When reading input, if multiple of 3, add position to **ArrayList**.
    - **$O(N)$**  time to add.
  - To compute 243's coprime span:
    - **`Collections.binarySearch`**(list, position of 243)
  - $O(\log N)$  to compute 243's span!

# Multiple Prime Factors



- 243 is really special case ( $3^k$ , prime power)
  - Many more primes than just 3
- Most numbers have multiple distinct prime factors.
- E.g.  $105 = 3 \times 5 \times 7$ 
  - Each number  $K \leq (\text{max value } M)$ 
    - Has at most  $(\log_2 K \leq \log_2 M)$  prime factors
    - Dividing off a prime  $\leq$  Dividing by 2
  - Have to worry about 3-multiples, 5-multiples, 7-multiples
  - Coprime span cannot cover any of them!

# Multiple Prime Factors



- Solution:
  - Find per-prime spans, and **take intersection**
  - $\text{Left} = \text{Max}(\text{Left}_3, \text{Left}_5, \text{Left}_7)$
  - $\text{Right} = \text{Min}(\text{Right}_3, \text{Right}_5, \text{Right}_7)$
- Total  $O(N \log N \log M)$ 
  - $N \text{ numbers} \times O(\log N) \text{ query} \times O(\log M) \text{ primes}$

# Lots of Primes



- For each prime, compute list of multiples' positions.
- How many primes do we need to worry about?
  - Maximum value is  $M$
  - Prime Number Theorem: About  $M/\ln M$  primes under  $M$ .

# Precomputation

- Keep separate ArrayList for each prime  $\leq M$ 
  - `HashMap<Integer, List<Integer>> primePositions;`
- For each input value X [ N inputs ]
  - Factorize X. [BLACK BOX,  $O(\text{🌭})$  time]
  - For each distinct prime P in factorization [  $\leq \log_2 M$  primes ]
    - `primePositions.get(P).add(current position)`  $O(1)$  get & add
- Overall  $O(N (\text{🌭} + \log M))$

# Primes



- How to prime factorize single number?
  - Trial division:  $O(\sqrt{M})$  per factor  $\times O(\log M)$  factors
  - Total precomputation:
    - $O(N(\text{hot dog} + \log M)) = O(N \sqrt{M} \log M)$ , may be too slow!
- How to prime factorize many numbers (value at most  $M$ )?
  - IDEA: For any number  $K \geq 1$ 
    - Shrink it by dividing by **smallest prime factor**
    - $O(1)$  per factor  $\times O(\log M)$  factors
    - Total precomputation:  $O(N \log M)$ , good!
- Now: **Precompute** smallest prime factors for a lot of numbers?

# Sieve of Eratosthenes



- Array of booleans `IsPrime[2...M]`, initially all true
  - For each number  $X$  in  $[2...M]$  ascending:
    - If `IsPrime[X]` is still true,  $X$  is prime.
    - Strike off all multiples of  $X$ .
- **IDEA:** Track reason why a composite number was struck off
  - The first strike-off of  $X$ , is by its **smallest** prime factor

# Sieve of Eratosthenes



```
isComposite = new boolean [M+1] // All false

For i in [2...M]
    If not isComposite[i]
        // i is prime
        For j in [i...M/i]
            isComposite[i*j] = True
```

```
smallestPF = new int[M+1] // All 0

For i in [2...M]
    If smallestPF[i] == 0
        // i is prime
        smallestPF[i] = i
        For j in [i...M/i]
            If smallestPF[i*j] == 0
                smallestPF[i*j] = i
```

Sieving up to  $M$  takes  $O(M \log \log M)$  time.  
This allows  $O(\log M)$  factorization per number, in bulk.

# Putting It All Together

1. Create map of primes to position lists.  $O(1)$
2. Run sieve up to maximum  $M$ .  $O(M \log \log M)$
3. Read in input. For each input  $X$   
    a. Store  $X$  in array  $O(1)$   
    b. For each prime in factorization  $O(\log M)$  iterations  
        i. Add position to prime's list  $O(1)$
4. For each  $X$  in array  $N$  iterations:  
    a. Left = 0, Right =  $N-1$   $O(1)$   
    b. For each prime in factorization  $O(\log M)$  iterations  
        i. Query left/right for this prime.  $O(\log N)$  queries  
    c. Save coprime span.  $O(1)$
5. Treeify(0,  $N-1$ , -1)  $O(N \log N)$

Overall  $O(N \log M)$

Overall  $O(N \log N \log M)$

Total time complexity:  
 $O(M \log \log M + N \log N \log M)$

# Speedups

1. Create map of primes to position lists.
2. Run sieve up to maximum M.
3. Read in input. For each input X
  - a. Store X in array
  - b. For each prime in factorization
    - i. Add position to prime's list
4. For each X in array
  - a. Left = 0, Right = N-1
  - b. For each prime in factorization
    - i. Query left/right for this prime.
  - c. Save coprime span.
5. Treeify(0, N-1, -1)

Faster sieving methods.

We compute factorization twice per number.

- The first time, we add it to a list.
- The second time, we want the item right before/after it in the list
  - Via binary search

Combine/Fuse the two loops

- Replace binary search with array lookup
  - Adjacent element at current time
- $O(\log N) \Rightarrow O(1)$

Total time complexity:

$$O(M \log \log M + N \log N \log M)$$

# Minor Speedups



- Faster than Fast IO
  - Custom per-digit reading of input integers
  - Manual input/output buffer management
- Replace HashMap with arrays where feasible
  - Our keys are often integers
    - Small (at most a few million)
    - Dense (Prime density is still  $1/\ln M \approx 1/16$ )
  - Even best-case hashmap access is slower than array access
- Avoid producing temporary arrays to store factorization
  - Compute in loop directly, from smallestPF table

# Take-Home Lab 3 - Baby Names [Optional]

- Update and query a database of baby names, with gender suitability
- $Q \leq \underline{500,000}$  queries
  0. Exit program.
  1. Given name and gender suitability, add suggestion
  2. Given name and gender suitability, remove suggestion
  3. Given [start] and [end], and suitability
    - Print number of names satisfying  $\{ [start] \leq \text{name} < [end] \}$

**FOCUS ON PREVIOUS PROBLEMS/OTHER MODS FIRST**

This problem is much harder, but offers decent practice in implementing DSes.

# Query



- Kattis sample input gives you 1-letter queries 'A' and 'Z'

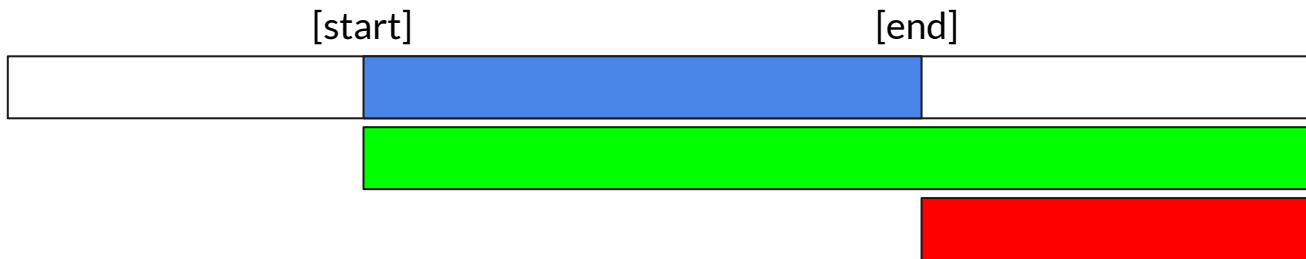
- Not true in general!

followed by two strings: start, end,

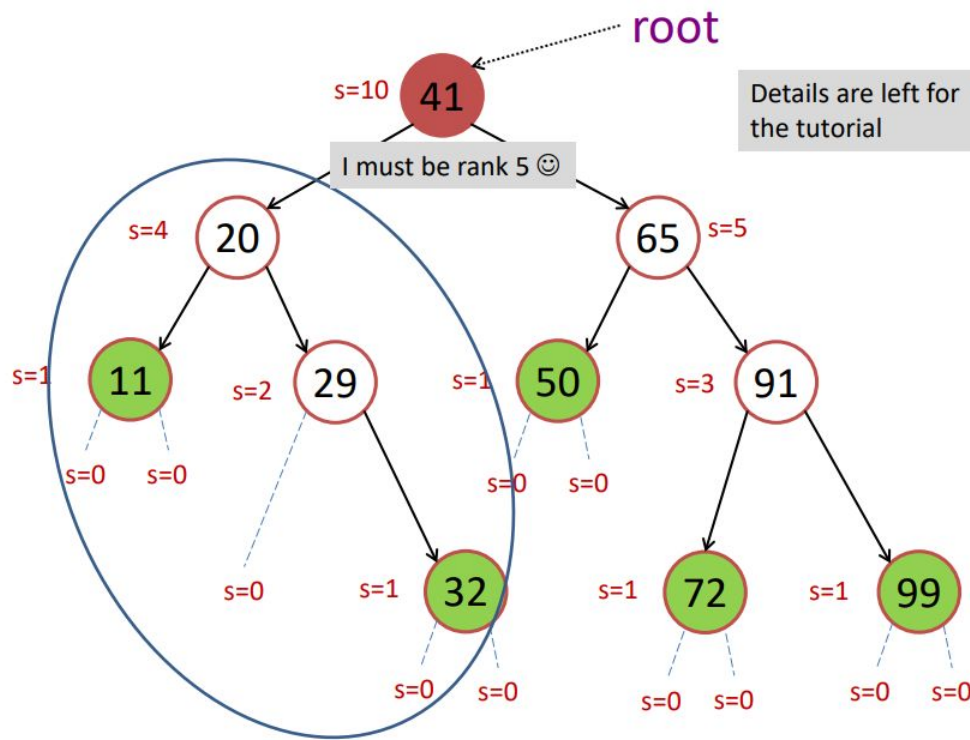
- Only guarantee is at most 30 letters.
- We can ask: In {"Andy", "Brian", "Charlie"}
  - How many names are ("Ada" ≤ name < "Anna")?
  - Answer: 1 ("Andy")

# Counting

- We want to answer queries of the form
  - Size of  $\{ [start] \leq name < [end] \}$
- We can rewrite these as:
  - Size of  $\{ [start] \leq name \}$  - Size of  $\{ [end] \leq name \}$



# Binary Search Trees: Size (s)



Since this image grew much bigger than last time, this is probably an important hint.

# Rank



- Rank of value X (borrowing from BSTs)
  - Size of  $\{ \text{names} \leq [X] \}$
- What we want
  - Size of  $\{ [\text{start}] \leq \text{name} \}$
- Just count in reverse order

# Counting

- If [start] is “EFG”, already went into “E” node
  - How do we **count** things like “EGA”, but not “EEA”?
  - Count whole of everything after EF:
    - EG(...), EH(...), ...

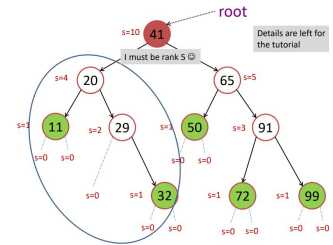
Don't recurse, just add summary values.
    - Part of EF(...) should count
      - How to count part?

Recurse with remainder of string.
    - Do not count anything before EF:
      - EE(...), ED(...), ...

Don't recurse, just ignore entirely.

$$T(L) = O(26) + T(L-1)$$

Binary Search Trees: Size (s)



# Performance Caveats!

The 10 best scoring solutions in Java

#	NAME	SCORE	RUNTIME	DATE	ID
1	<a href="#">Matthew Ng</a>	100	0.65 s	2019-10-15 09:05:36	4775481@other site
2	<i>Hidden user</i>	100	0.68 s	2020-09-10 17:02:44	6065896
3	<a href="#">Andrew Godbout</a>	100	0.68 s	2020-09-10 17:07:01	6065926
4	<a href="#">Ryan Chew</a>	100	0.69 s	2020-08-07 06:42:27	<a href="#">5924988</a>
5	<a href="#">Chow Yuan Bin</a>	100	0.86 s	2020-09-23 15:31:49	6140048
6	<a href="#">Enzio Kam Hai Hong</a>	100	0.87 s	2020-10-09 03:42:06	6243256
7	<a href="#">Steven Halim</a>	100	0.91 s	2019-10-12 02:24:25	4753870@other site
8	<a href="#">Lim Daekoon</a>	100	0.99 s	2020-03-15 10:17:20	5466844

Fenwick Tree  
RSQ solutions

Trie Model solution

AVL

- Most likely to just scrape past 0.99s
- Question is highly specific to particular trie implementation
- $5 \times 10^5$  queries, storing  $2 \times 10^5$  names
  - A lot of things to read in/write out (hint hint)

# Trie



- Java API does not contain a trie class
- Some suggestions:
  - Avoid implementing trie “optimizations” for longer strings
    - E.g. path compression, qp-trie, etc.
    - Names are at most 30 characters
  - Take advantage of small radix
    - Names consist of only uppercase characters A-Z