

Random Trees

A **Cartesian tree** is a binary tree, introduced by Vuilleman (1980) for geometric range searching.

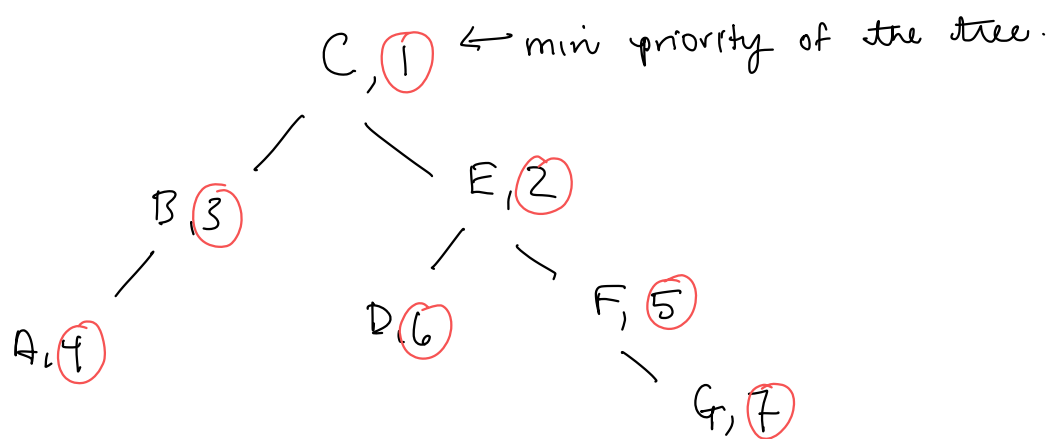
Ex.

Suppose given: A list of keys and associated priorities:

Keys:	A	B	C	D	E	F	G
Priorities:	4	3	1	6	2	5	7

Priorities \Leftrightarrow also called "time stamps".

Build a BST on the keys by inserting them in the order given by their priorities.



Note that the tree has min heap priority based on the *Time stamps/priorities*

The *inorder* traversal of the tree results in the sorted keys. This is equivalent to BSTs.

DEFINITION: Cartesian tree

Given a set $(x_1, y_1), \dots, (x_n, y_n)$

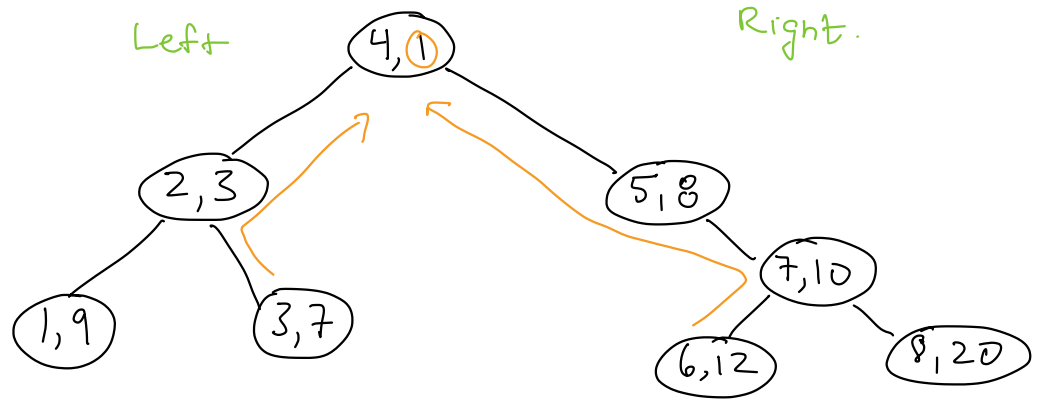
↑ key ↖ priority (time stamp).

A cartesian tree is a B.S.T. with respect to the keys and a min. heap with respect to the priorities.

Fact: Given data $(x_1, y_1), \dots, (x_n, y_n)$, the cartesian tree is unique.

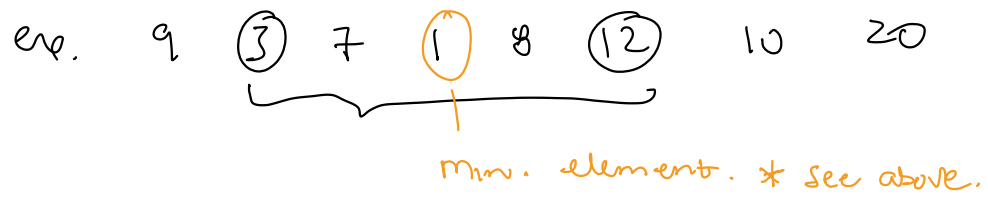
* The choice of root is unique, the L/R subtrees are determined by the root.

A Cartesian tree can be built on a **sequence** of items y_1, \dots, y_n by using the y 's as the priorities and the order of the items as the keys:



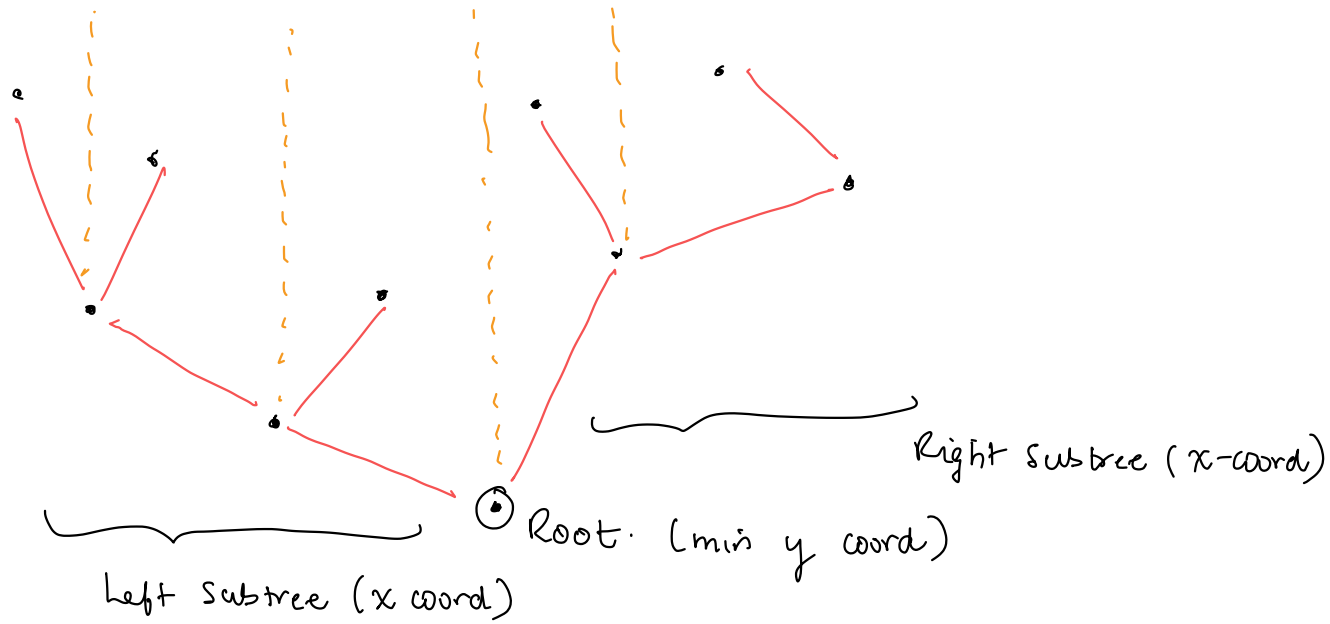
* The keys are "sorted".

Application: Range Searching: Given 2 elements in the above sequence/array, the minimum value in the subarray is the **lowest common ancestor** in the tree.



Application: Cartesian trees can be used to store 2-dim data:

BST keys: x-coord
 Priorities: y-coord



Suppose we have keys x_1, \dots, x_n for a **Binary search tree**. To build a Cartesian tree, we would need priorities. We could use the priorities $1, \dots, n$.

$x_1 \dots x_n$ Keys
 $1 \dots n$ priorities.
 }
 The result \Rightarrow Keys get inserted into BST in order $x_1 \rightarrow x_n$. Could be unbalanced!!

In a **Random binary search tree** the keys are inserted in **Random** order. This could be achieved by **permuting** the data and the inserting them one by one into the Cartesian tree with priorities $1, \dots, n$.

Keys : $x_{\sigma_1} \dots x_{\sigma_n}$
 (after permutation)
 priorities : $1 \dots n$
}
 \Rightarrow The result \Rightarrow Keys are inserted into the tree in random order.

The above construction of a Cartesian tree is equivalent to a Random binary search tree. So it's depth is logarithmic with high probability!

Problem: How could we maintain this randomized property as items are added/removed from the tree? This happens if we receive only 1 item at a time...

TREAPS

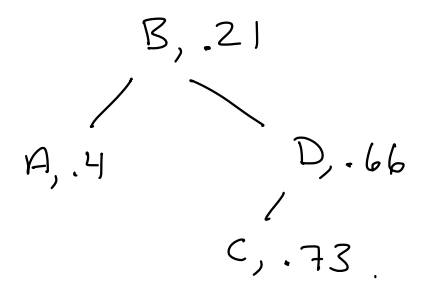
First introduced by Aragon, Seidel (1989). It is a Cartesian tree where each node received a **Randomly chosen priority**

- Given keys $x_1 \dots x_n$
- Assign priority T_i to each x_i .

\downarrow
 Random value (ex. uniform # in $(0,1)$)

ex

Keys	A	B	C	D
assign priorities	.4	.21	.73	.66

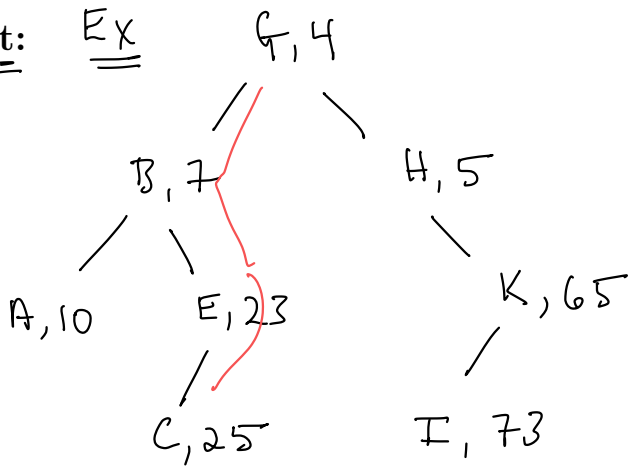


Treaps are easy to maintain as new items are added/removed...

Operations: Goal is to "maintain" the random BST relationship...

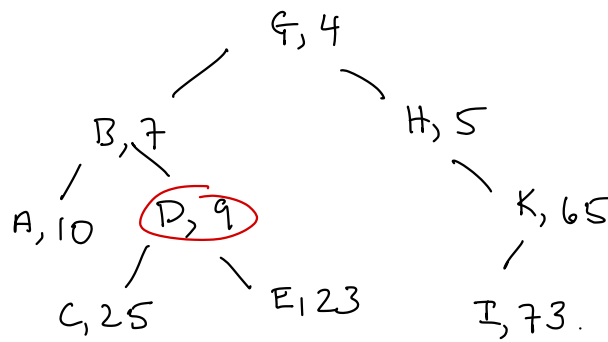
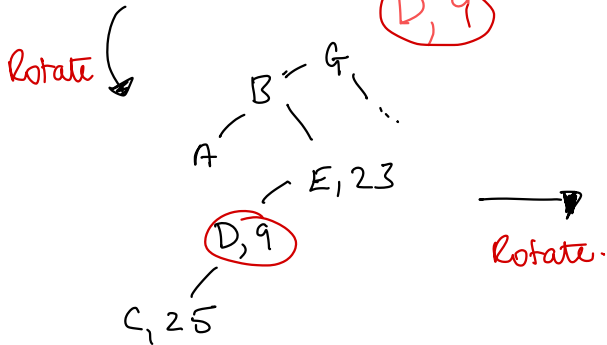
Insert:

Ex



Insert 'D':

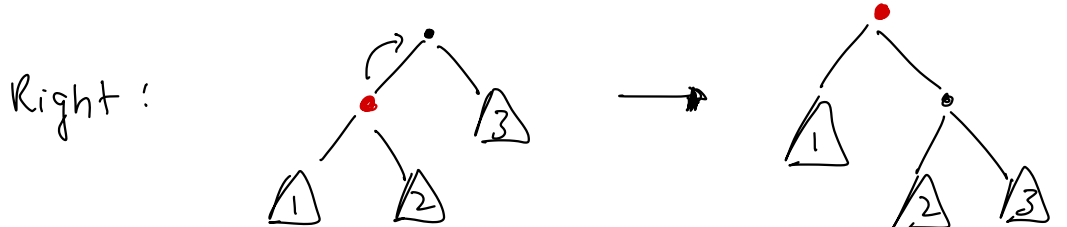
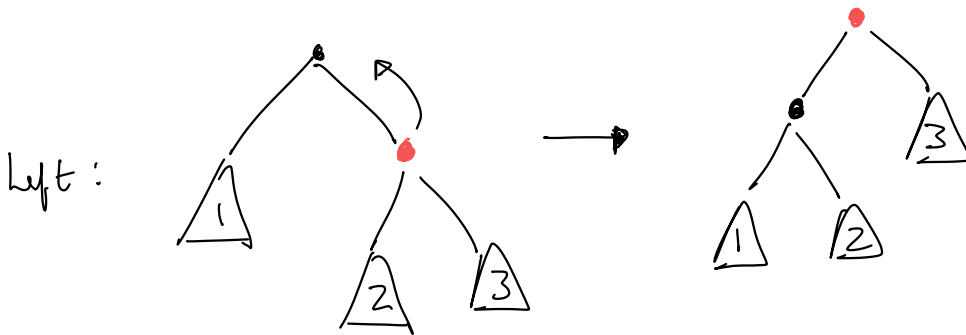
- assign priority (random) 9.
- B.S. to insert D into tree.
- perform rotations to fix the heap.



The insert operation:

- assigns the new node a random priority
- searches for the position according to the BST
- performs a sequence of rotations to maintain the heap property

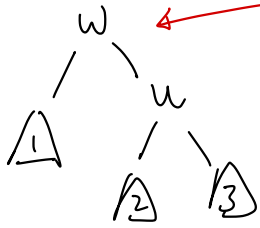
The rotate operation:



Pseudocode for Moving node u up: (rotate up).

While $u \neq \text{root}$ & $\& \text{time}[\text{parent}[u]] > \text{time}[u]$

Before:



$w = \text{parent}[u]$

if $\text{right}[w] == u$ then:

$\text{right}[w] = \text{left}[u]$.

$\text{left}[u] = w$

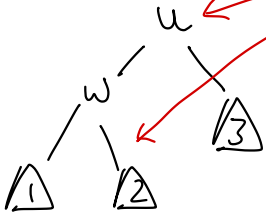
$\text{parent}[u] = \text{parent}[w]$

$\text{parent}[\text{right}[w]] = w$

$\text{parent}[w] = u$

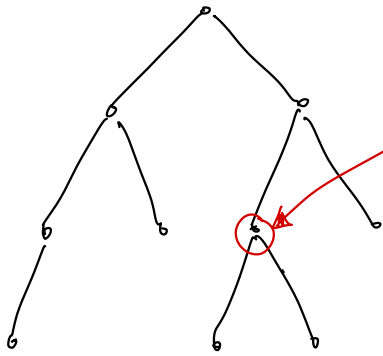
Left rotation.

After:



else (right rotation) * see notes.

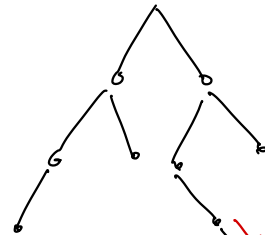
Delete a node:



To delete this node, make his priority ∞ .

Perform rotations (down) to maintain the heap.

Node will go to leaf!



Now chop off leaf!!

Split a treap: Given a value x , we wish to split the treap into 2 treaps, T_1, T_2 where:

$$\text{Keys}(T_1) < x < \text{Keys}(T_2).$$

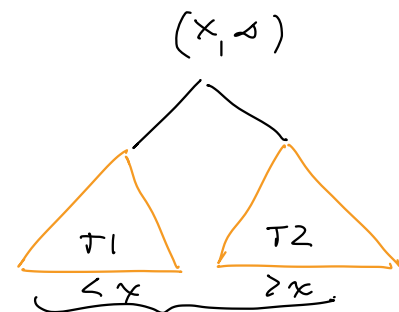
How?



original treap

→ insert (x, ∞) → →

will become root.



These are your 2 treaps.

Join 2 Treaps:

Assume we are given 2 treaps, T_1, T_2 such that

$$\text{Keys}(T_1) \prec \text{Keys}(T_2).$$

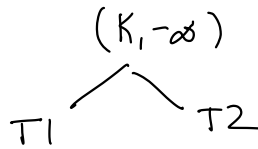
Want to join the 2 treaps into one treap.

How?

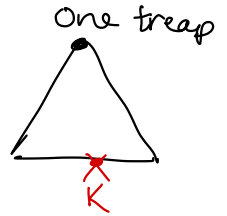
Create a node with key 'K' such that

$$\text{Keys}(T_1) \prec K \prec \text{Keys}(T_2).$$

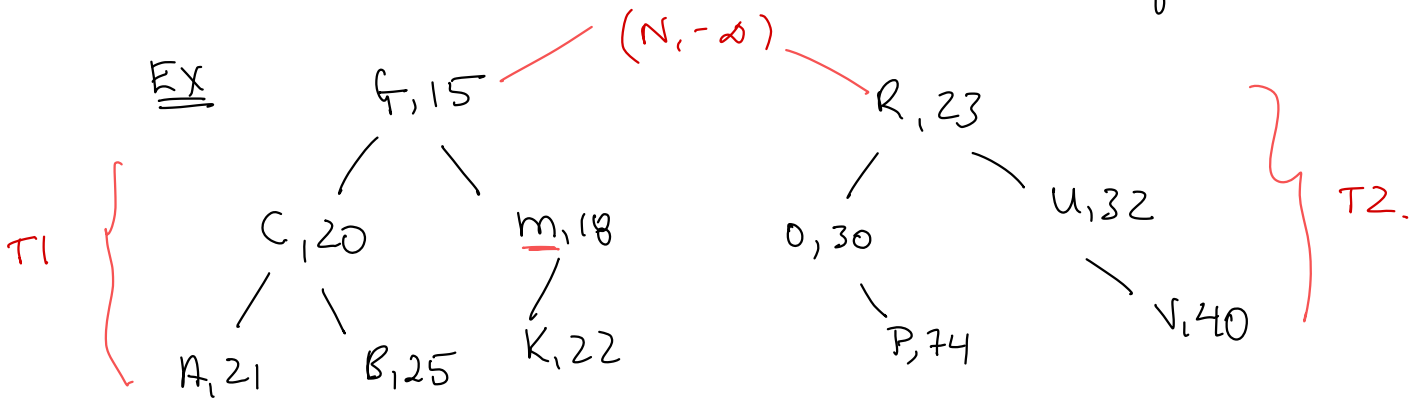
Join the 2 treaps by first placing K at the root, with priority $-\infty$:



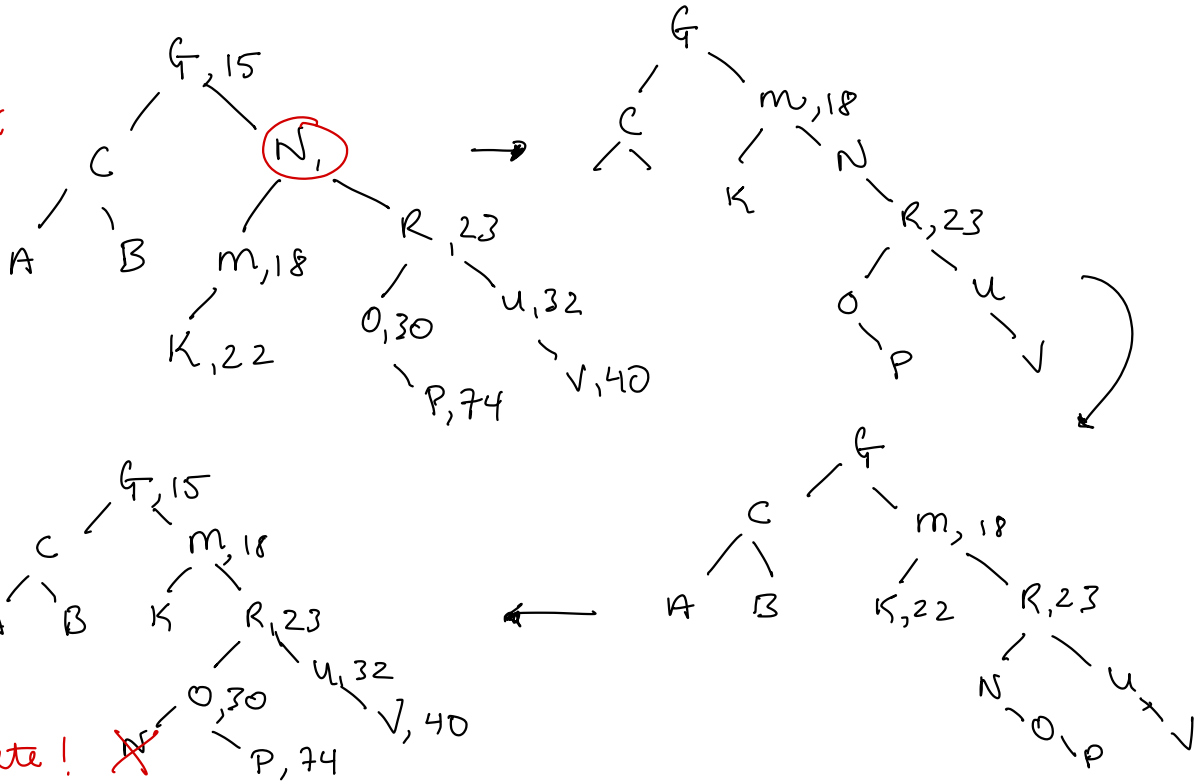
now delete node K using above technique.



EX



Now delete $(N, -\infty)$:



Recall the Cartesian tree, given a sequence of priorities:

Keys!	^{left:} 1	2	3	4	5	6	7	8	9	^{Right:}
Priorities!	12	10	24	20	35	30	100	60	18	

Building this starting at the root, yields $2, 10$
 $\swarrow \quad \searrow$
 $1, 12 \quad \quad 4, 20$
 $\vdots \quad \quad \quad \vdots$ etc....

The tree can also be constructed sequentially in linear time, using the above insert algorithm:

- Insert the items one by one, maintaining a cartesian tree at each step...
- The new key will be inserted as the right child of the last element.

① (1, 12)

② $\begin{matrix} (1, 12) \\ \searrow \\ (2, 10) \end{matrix} \xrightarrow{R} \begin{matrix} (2, 10) \\ / \\ (1, 12) \end{matrix}$

③ $\begin{matrix} (2, 10) \\ / \quad \backslash \\ (1, 12) \quad (3, 24) \end{matrix}$

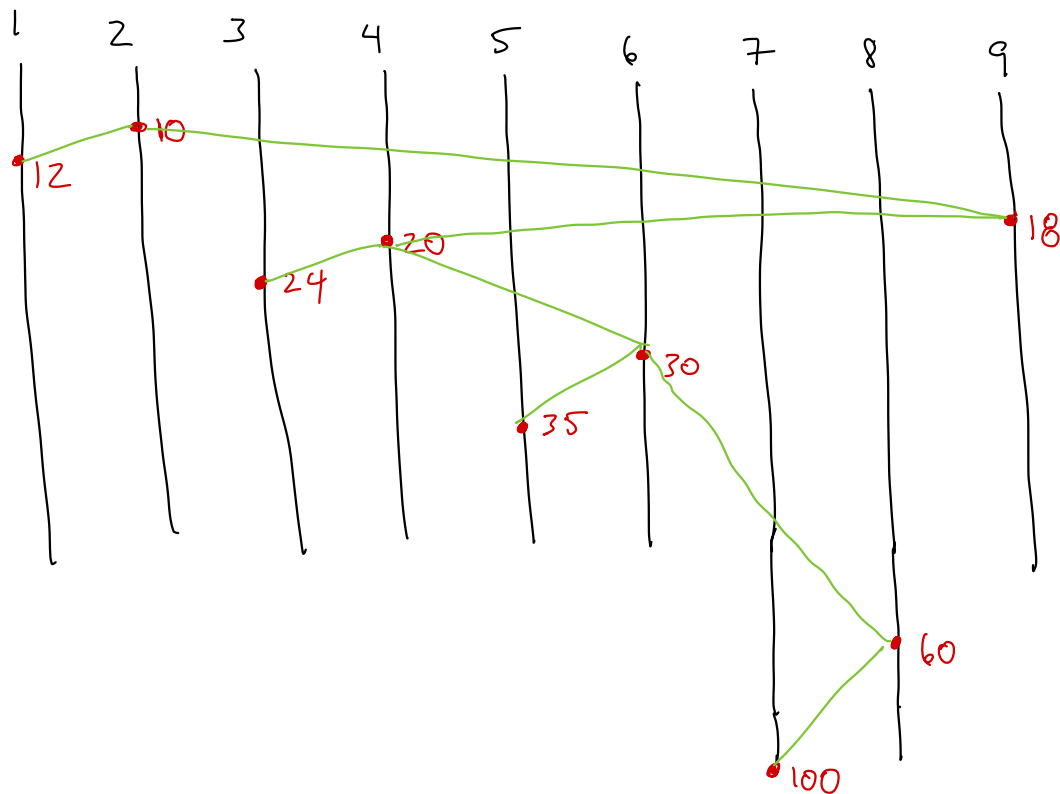
④ $\begin{matrix} (2, 10) \\ / \quad \backslash \\ (1, 12) \quad (3, 24) \\ \quad \quad \quad \backslash \\ \quad \quad \quad (4, 20) \end{matrix} \xrightarrow{R} \begin{matrix} (2, 10) \\ / \quad \backslash \\ (1, 12) \quad (4, 20) \\ \quad \quad \quad / \\ \quad \quad \quad (3, 24) \end{matrix}$

⑤-⑧ $\begin{matrix} (2, 10) \\ / \quad \backslash \\ (1, 12) \quad (4, 20) \\ \quad \quad \quad / \quad \backslash \\ \quad \quad \quad (3, 24) \quad (5, 35) \\ \quad \quad \quad \quad \quad \quad \backslash \\ \quad \quad \quad \quad \quad \quad (6, 30) \end{matrix} \xrightarrow{R} \begin{matrix} (2, 10) \\ / \quad \backslash \\ (1, 12) \quad (4, 20) \\ \quad \quad \quad / \quad \backslash \\ \quad \quad \quad (3, 24) \quad (6, 30) \\ \quad \quad \quad \quad \quad \quad / \quad \backslash \\ \quad \quad \quad \quad \quad \quad (5, 35) \quad (7, 100) \\ \quad \quad \quad \quad \quad \quad \quad \quad \quad \quad \quad \backslash \\ \quad \quad \quad \quad \quad \quad \quad \quad \quad \quad \quad (8, 60) \end{matrix} \xrightarrow{R} \begin{matrix} (2, 10) \\ / \quad \backslash \\ (1, 12) \quad (4, 20) \\ \quad \quad \quad / \quad \backslash \\ \quad \quad \quad (3, 24) \quad (6, 30) \\ \quad \quad \quad \quad \quad \quad / \quad \backslash \\ \quad \quad \quad \quad \quad \quad (5, 35) \quad (8, 60) \\ \quad \quad \quad \quad \quad \quad \quad \quad \quad \quad \quad / \\ \quad \quad \quad \quad \quad \quad \quad \quad \quad \quad \quad (7, 100) \end{matrix}$

ETC....

A Cartesian tree on the sequence above can be pictured on an abacus...

The final tree can be drawn on vertical lines (keys) where the 'height' represents the time stamp (priority...)



Towards the analysis of treap depth:

Recall that for a discrete Random Variable,

$$E(X) = \sum_n x_n P(X = x_n)$$

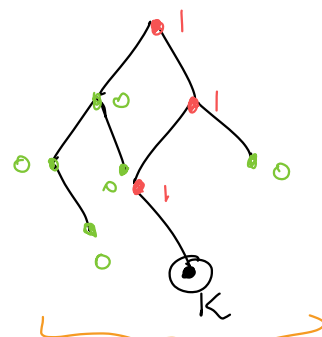
Assume that the data of our treap is $(1, T_1), \dots, (n, T_n)$. In other words, our keys are $1 \dots n$ for simplicity.

Let the depth of node k be D_k :

↑ time stamps. (random).
↑ keys

$$D_k = \sum_{j \neq k} X_{jk}$$

$$X_{jk} = \begin{cases} 1 & \text{if } j \text{ is ancestor of } k \\ 0 & \text{otherwise.} \end{cases}$$



depth of $k = 3$

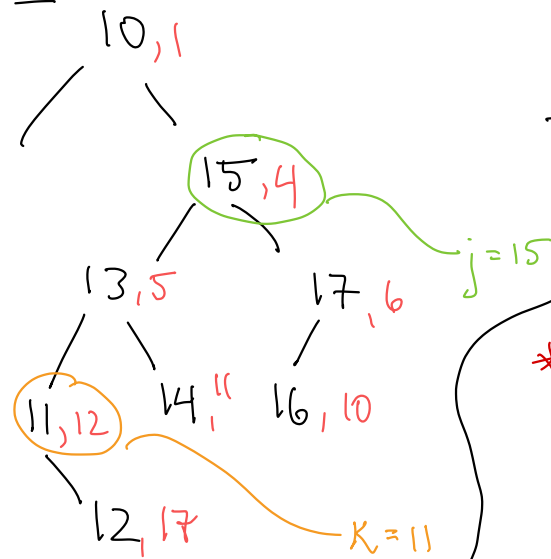
$$= \sum X_{jk} = 1+1+1+0+0+0+0+0$$

To find the **Expected** depth we sum up the chance that each node in the tree is an ancestor of k :

$$E(D_k) = \sum_{j \neq k} P(j \text{ is ancestor of } k)$$

$$= \sum_{j < k} P(j \text{ is ancestor of } k) + \sum_{j > k} P(j \text{ is ancestor of } k)$$

$$= \sum_{j < k} P(T_j \text{ is smallest of } T_j, \dots, T_k) + \sum_{j > k} P(T_j \text{ is smallest of } T_k, \dots, T_j)$$



* Note 15 is ancestor of 11 because

$$T_{11}, T_{12}, T_{13}, T_{14}, T_{15} \text{ min!!}$$

12 17 5 11 4

$$\rightarrow = \sum_{j < k} \frac{1}{k-j+1} + \sum_{j > k} \frac{1}{j-k+1}$$

$$= \left(\frac{1}{2} + \dots + \frac{1}{k}\right) + \left(\frac{1}{2} + \dots + \frac{1}{(n-k+1)}\right)$$

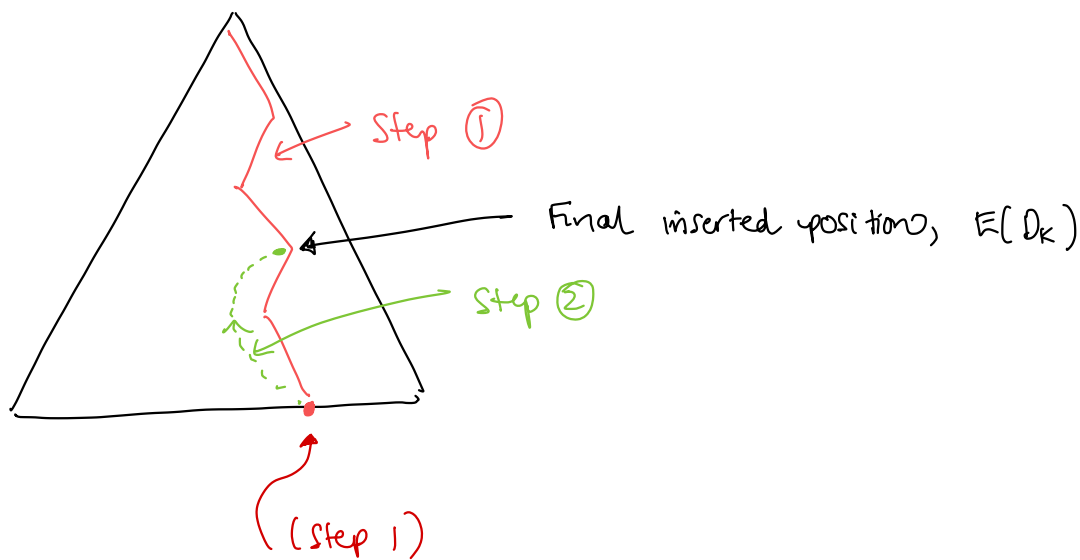
$$= H_k - 1 + H_{n-k+1} - 1$$

$$= \boxed{H_k + H_{n-k+1} - 2} \quad E(D_k). *$$

$$\approx 2 \ln n \approx 1.39 \log_2 n$$

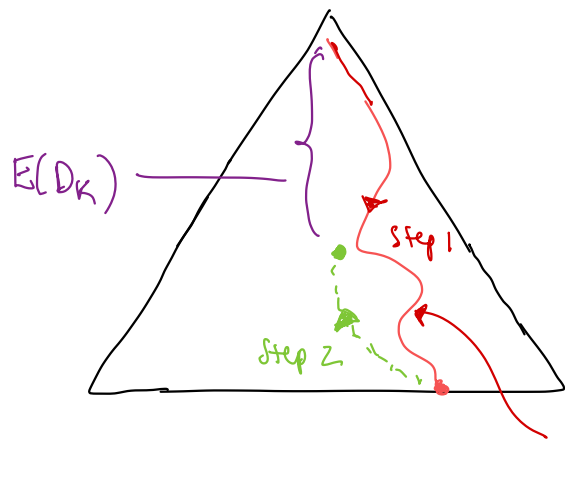
The insert operation:

Recall it first searches through the BST to insert the key as a leaf, and then rotates up to maintain the heap property of the priorities.



How **deep** is the leaf expected to be? The expected depth of a leaf is computed in the same way, however we assume its priority is ∞ since it is at the bottom of the tree.

$$E(\text{depth of leaf}) = \sum_{j < k} \frac{1}{k-j} + \sum_{j > k} \frac{1}{j-k}$$



$P(T_j \text{ is the min of } T_j \dots T_{k-1})$

$P(T_j \text{ is the min of } T_{k+1} \dots T_j)$

$$= H_{k-1} + H_{n-k}$$

$H_{k-1} + H_{n-k}$

After the node is rotated up to its final position, its depth is that of a typical random node:

$$E(D_k) = H_k + H_{n-k+1} - 2$$

Thus the number of rotations is the difference between these 2 paths:

$$\text{Green} = \left(\overset{\text{red}}{H_{k-1} + H_{n-k}} \right) - \left(\overset{\text{purple}}{H_k + H_{n-k+1} - 2} \right) \leq 2$$

The insert time is bounded by the expected depth of the leaf.

$$\sim 2 \ln n.$$

Similarly, delete in a treap is $O(\log n)$.

Note that the expected height of the treap is $O(\log n)$, (not shown).

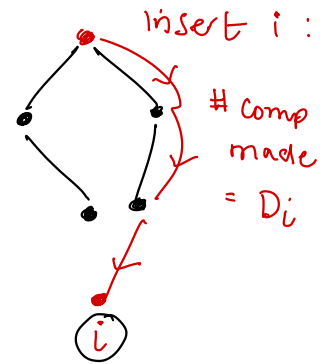
QuickSort:

Note that the algorithm for quicksort is essentially the same as building a RBST.

- Pick pivot \rightarrow like picking root of RBST.
- Partition into L/R \rightarrow Partition into L/R subtrees.
in quicksort

The number of comparisons is thus the same as those made when building a BST:

$$\begin{aligned} \# \text{ comp} &= \sum_{i=1}^n D_i \\ E(\# \text{ comp}) &= \sum_{i=1}^n E(D_i) \\ &= \sum_{i=1}^n (H_i + H_{n-i+1}) - 2 \end{aligned}$$



ex. if $n=3$...

$$\begin{aligned} (H_1 + H_3) + (H_2 + H_2) + (H_3 + H_1) &= \left(2 \sum_{i=1}^3 H_i \right) - 2n \\ &= 2 \sum_{i=1}^3 \sum_{j=1}^i \frac{1}{j} - 2n \end{aligned}$$

$$\underline{1} + (\underline{1} + \underline{1/2}) + (\underline{1} + \underline{1/2} + \underline{1/3}) + \dots$$

Collect terms...

$$= 2 \sum_{j=1}^n \left(\frac{1}{j} \right) (n-j+1) - 2n$$

$$= \left(2nH_n - 2 \sum (1) + 2 \sum \frac{1}{j} \right) - 2n$$

$$= 2nH_n - 2n + 2H_n - 2n$$

$$= 2nH_n + 2H_n - 4n$$

$$\approx 2n \ln n \approx 1.38 n \log_2 n$$

