

1. Finish analysis of randomized QuickSort
 2. Heaps & Heapsort



$E[T(n)]$ = expected time to QS. n elements

"
 $E(n)$

$T(n)$ is a r.v.

For $k=1, \dots, n$, let

X_k be the indicator r.v.

for the event,

"the pivot ends up at index k after the first partition"

Then,

$$T(n) = \underbrace{n}_{\text{time for partition}} + \sum_{k=1}^n \underbrace{(T(k-1) + T(n-k))}_{\text{Time assuming pivot at index } k} X_k$$

$$= n + \sum_{k=1}^n (T(k-1) + T(n-k)) X_k$$

$$E(n) = E[T(n)] = \underbrace{E[n]}_n + \sum_{k=1}^n \underbrace{E[(T(k-1) + T(n-k)) X_k]}_{\text{independent}}$$

$$= n + \sum_{k=1}^n E[T(k-1) + T(n-k)] \underbrace{E[X_k]}_{\substack{\text{prob} \\ \text{index } k \\ 1/n}}$$

$$= n + \frac{1}{n} \sum_{k=1}^n (E(k-1) + E(n-k))$$

$$= \boxed{n + \frac{2}{n} \sum_{k=0}^{n-1} E(k)} = E(n)$$

recurrence on $E(n)$

Substitution method:

$$E(n) = \Theta(n \lg n)$$

Assume $E(m) \leq c m \lg m$ for $m < n$.

$$E(n) = n + \frac{2}{n} \sum_{k=0}^{n-1} E(k)$$

$$= n + \frac{2}{n} \sum_{k=1}^{n-1} E(k)$$

$$\leq n + \frac{2}{n} \sum_{k=1}^{n-1} c k \lg k$$

$$\leq n + \frac{2c}{n} \lg n \sum_{k=1}^{n-1} k$$

$$= n + c \lg n \left(\frac{2}{n} \frac{n(n-1)}{2} \right)$$

$$= n + (c \lg n)(n-1)$$

$$= c n \lg n - c \lg n + n$$

$$\leq c n \lg n$$

Try: $E(m) \leq c m \lg m - dm$
 ... sol'n to be posted.

Heaps & Heapsort

Priority queue:

collection of items where each item x has a numerical value $x.\text{key}$

Basic operations supported:

Insert new element x into the priority queue

Delete an element with min key value

Find element with min key value (priority)

Decrease the key of an element.

A heap (minheap) is an implementation of a priority queue. A maxheap is like a minheap, but sense of ordering is reversed.
 * Find/remove max
 * Increase key

Binary heap: array
 $H[1..n]$ (n = capacity of the heap)

Actual portion used is
 $H[1..H.size]$

Assume elements of H are just the keys (numbers)
 (Any satellite data has constant size)
 (otherwise, just store pointer to satellite data with the heap item.)

2 kinds: min heap, max heap
 describe similar

An array $H[1..n]$ is in min heap order iff the following holds:

For every $i \in \{1, \dots, \lfloor n/2 \rfloor\}$
 $H[i] \leq H[2i]$ (assuming $2i \leq n$)
 $H[i] \leq H[2i+1]$ (assuming $2i+1 \leq n$)

A binary (min)heap is just an array of numbers satisfying (min) heap order.

$H: [10, 13, 11, 7, 4, 5, 6, 9, 8]$

[equivalently: For all $j \in \{2, \dots, n\}$
 $H[\lfloor j/2 \rfloor] \leq H[j]$

Full binary tree layout of H :

 write entries of H as nodes of a binary tree, by increasing level and left-to-right within each level.

For $i \geq 1$, define

$left(i) := 2i$
 $right(i) := 2i+1$

For $j \geq 2$, define
 $parent(j) := \lfloor \frac{j}{2} \rfloor$

Heap order property:

For all $2 \leq j \leq n$

$H[parent(j)] \leq H[j]$

Find Min — passively returns item with min key val.
 return $H[1]$.
 Time = $O(1)$.

Insert(x, H)

// assume $H.size < capacity$



$H.size++$

$H[H.size] := x$

$j := H.size$

while $j \geq 2$ and

$H[j] < H[parent(j)]$

do

$H[j] \leftrightarrow H[parent(j)]$

$j := parent(j)$

// invariant: $H[j] = x$

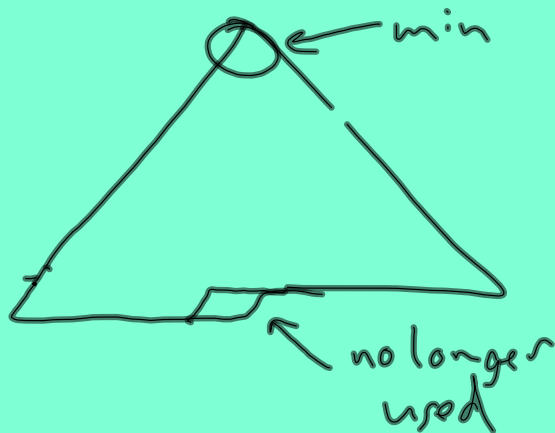
endwhile

"cascading up"

Delete Min

Delete Min

// assume $H.size > 0$



$H.size --$

$temp := H[H.size + 1]$

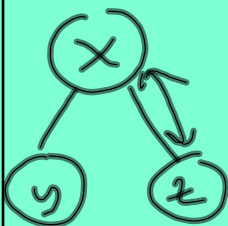
$min := H[1]$

$H[1] := temp$

$j := 1$

while $H[j]$ has a child
that is $< H[j]$

$H[j] \leftrightarrow H[\text{whichever child is smaller}]$



end-while

return min

$y < x$

$z < x$