# Data Structures Chapter 5: Heap and Priority Queue

- 1. Heap & Priority Queue
- 2. Heapsort
- 3. Heap & PQ Coding



내가 그리스도와 함께 십자가에 못 박혔나니 그런즉 이제는 내가 사는 것이 아니요 오직 내 안에 그리스도께서 사시는 것이라 이제 내가 육체 가운데 사는 것은 나를 사랑하사 나를 위하여 자기 자신을 버리신 하나님의 아들을 믿는 믿음 안에서 사는 것이라 (갈라디아서 2:20)

# Data Structures Chapter 5: Heap and Priority Queue

- 1. Heap & Priority Queue
- 2. Heapsort
  - Heap Construction Heapify
  - Heapsort
  - Time Complexity
- 3. Heap & PQ Coding

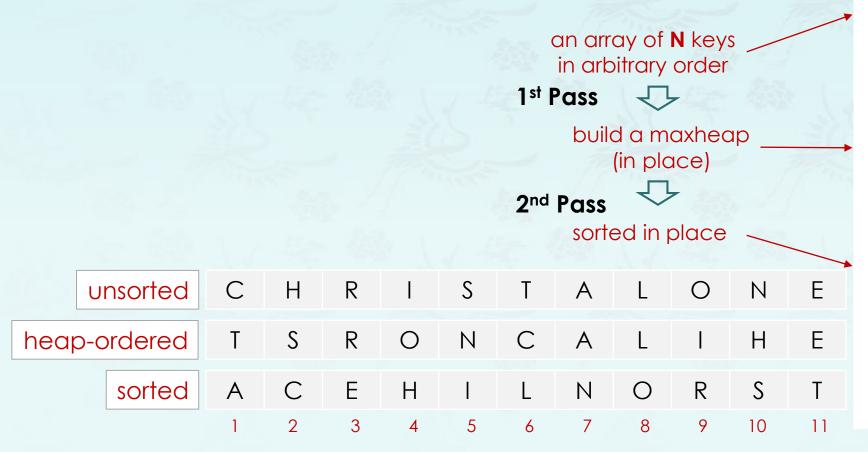
#### Basic plan for in-place sort

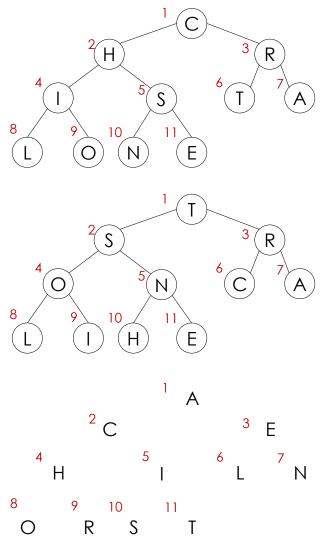
- 1st Pass: Build maxheap with all N keys.
- 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.



#### Basic plan for in-place sort

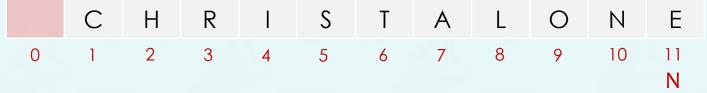
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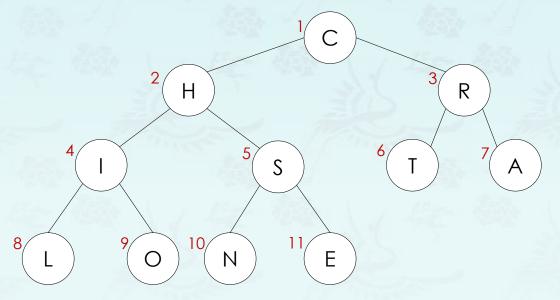
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## 1st Pass: Heap construction (heapify)

- Build max heap using bottom-up method.
- Assume array entries are indexed from 1 to N.

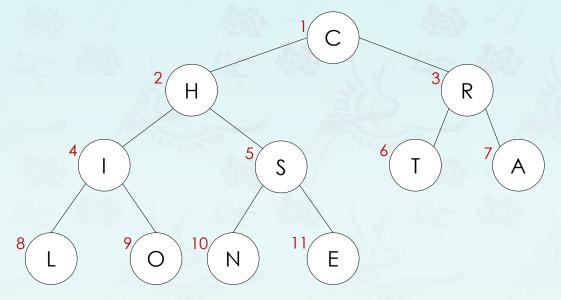


|   | С | Н | R | I | S | T | Α | L | 0 | Ν  | Е              |
|---|---|---|---|---|---|---|---|---|---|----|----------------|
| 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11<br><b>N</b> |

Where should we start from?

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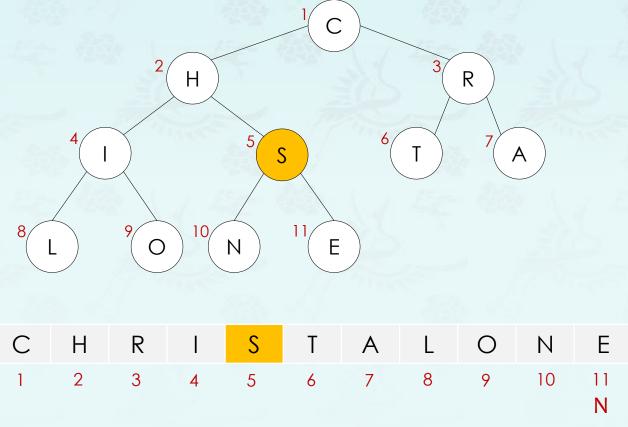
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#### 1st Pass: Heap construction (heapify)

0

- Where should we start from?
- root, leaf, or any particular node?
- Since leaf nodes are already 1-node heap, go up and to the left node which is not a leaf which is called
- How do you locate the last internal node?

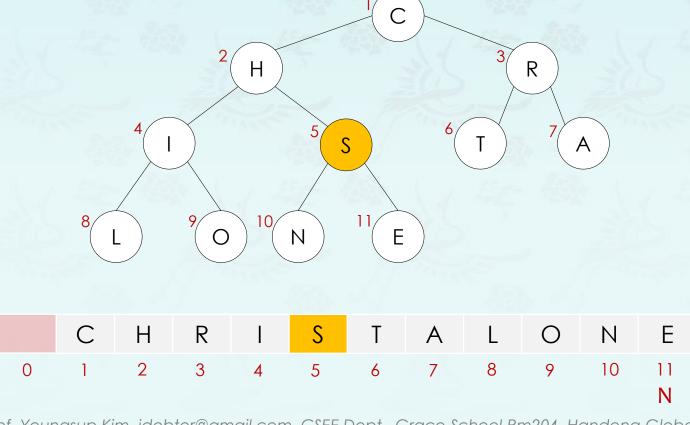
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- How do you locate the last internal node? floor( N / 2 )



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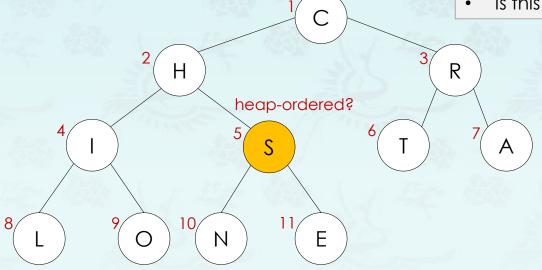
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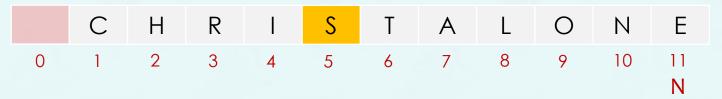
> How do you locate the **last internal node?** floor(N/2)

Since leaf nodes are already 1-node heap,

Is this 3-node heap at 5 heap-ordered?







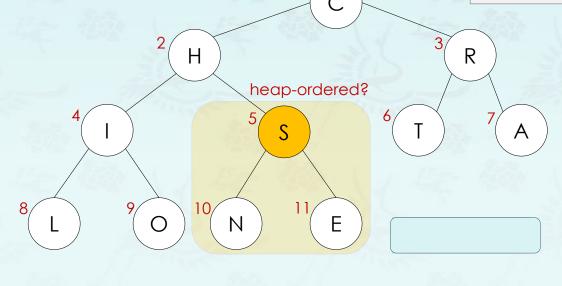
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Recall:root >= max(left, right)

- Build max heap using bottom-up method.
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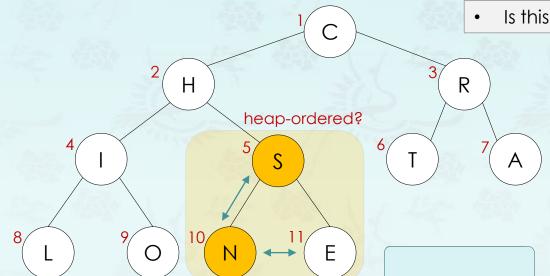
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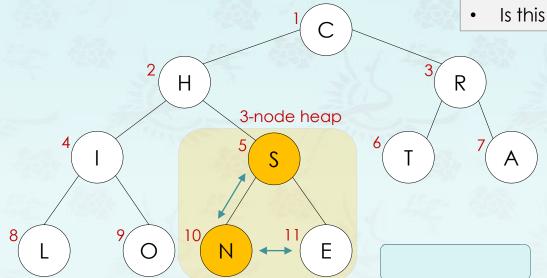
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Is this 3-node heap at 5 heap-ordered?

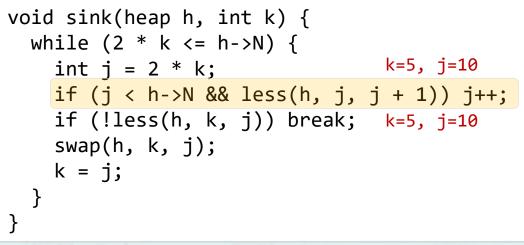
Recall: root >= max(left, right)

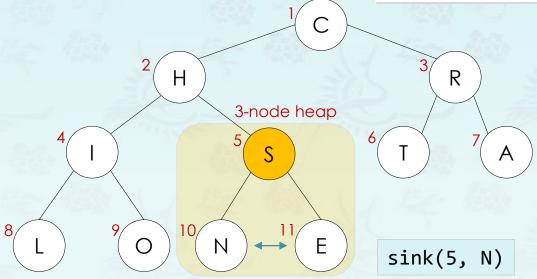


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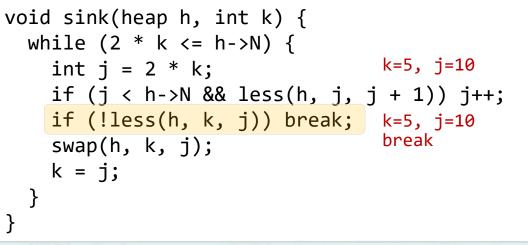


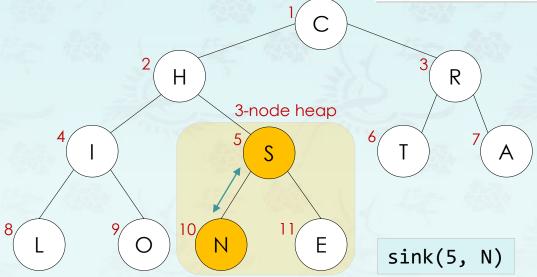




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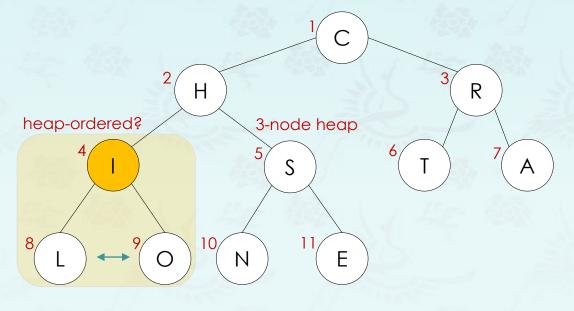


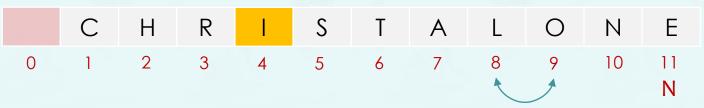




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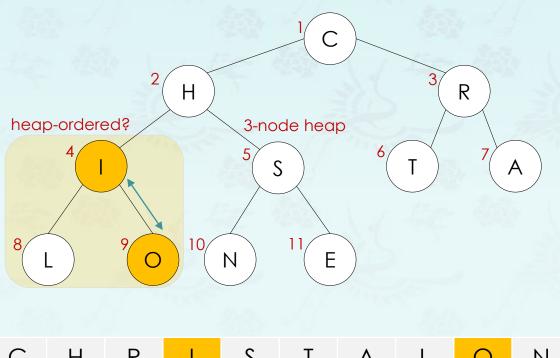
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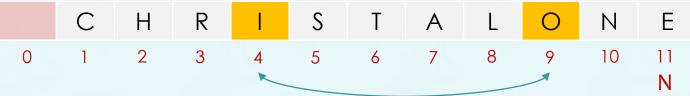




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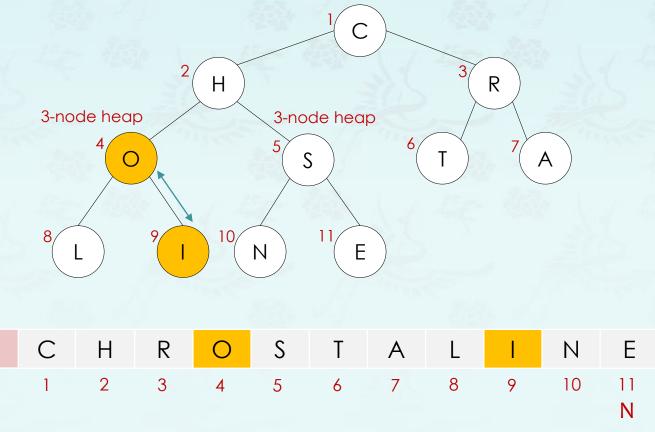




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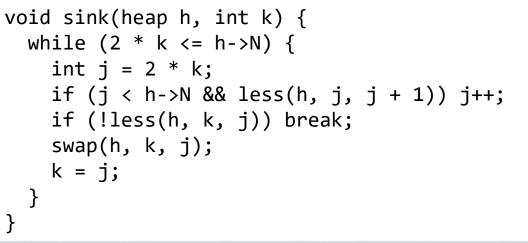
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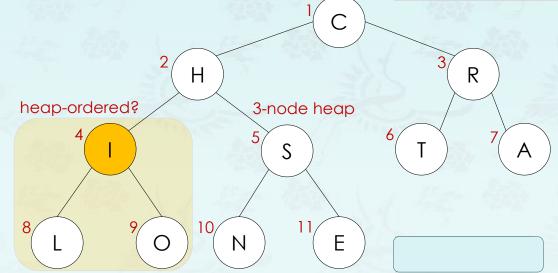
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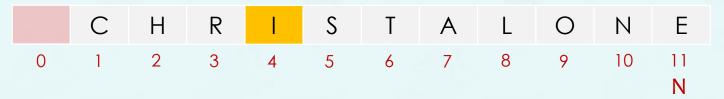


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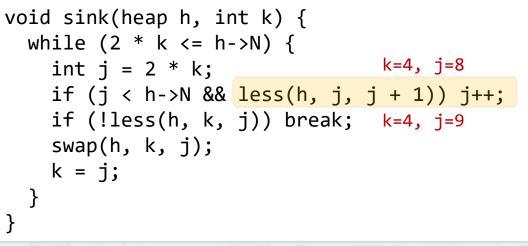


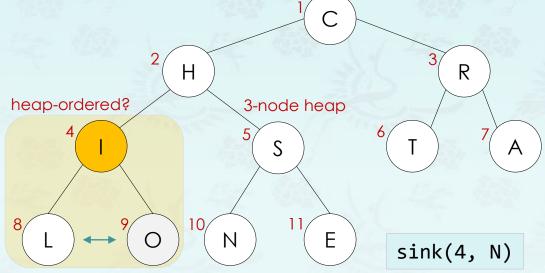


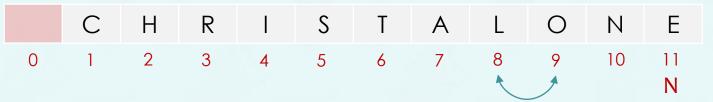


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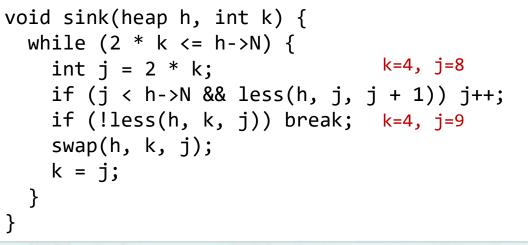


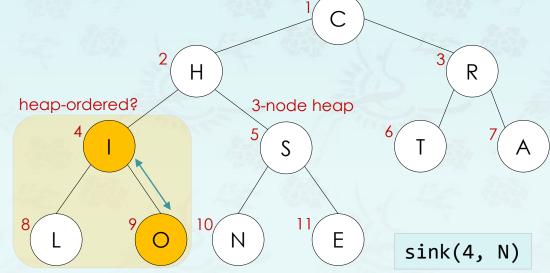


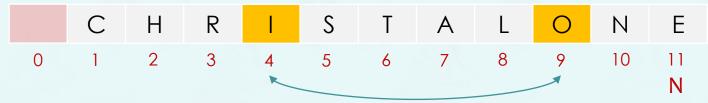


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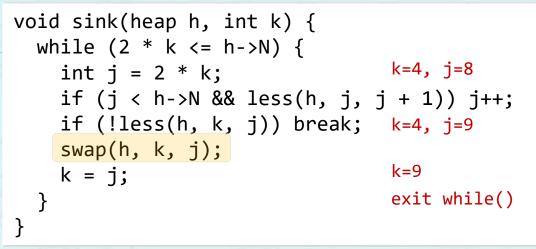


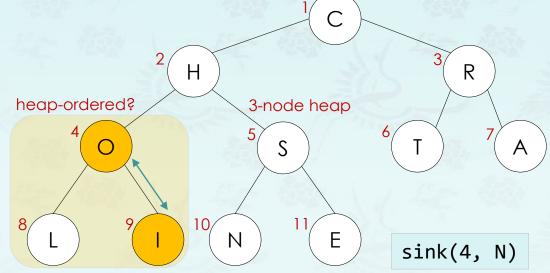


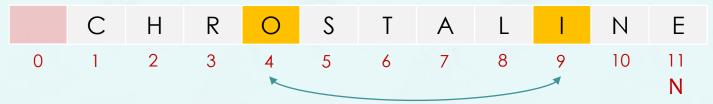


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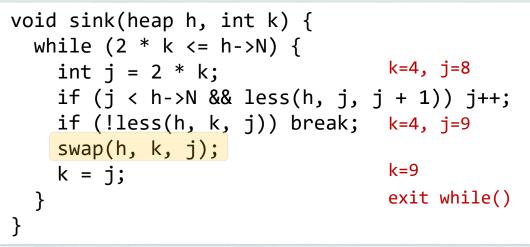


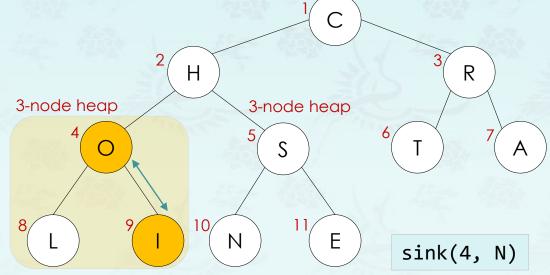


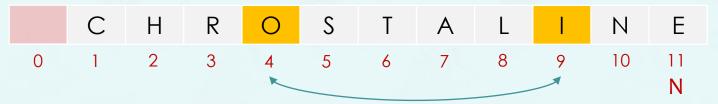


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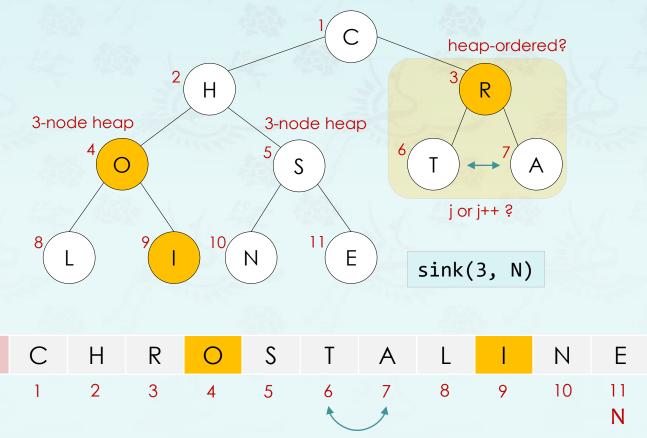




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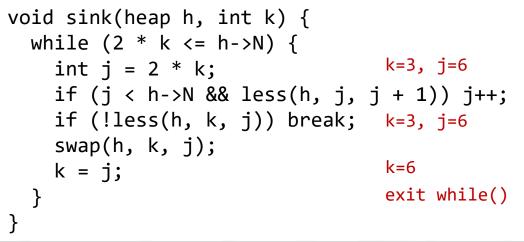
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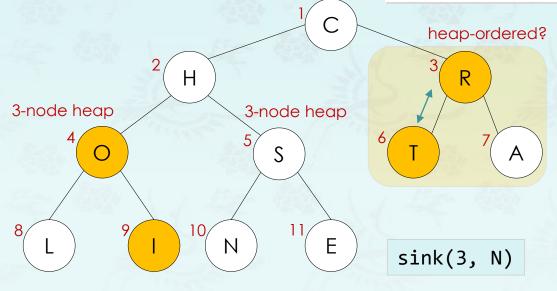
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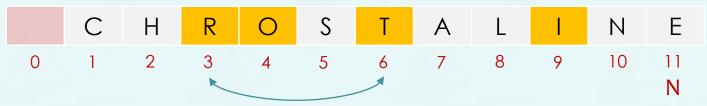


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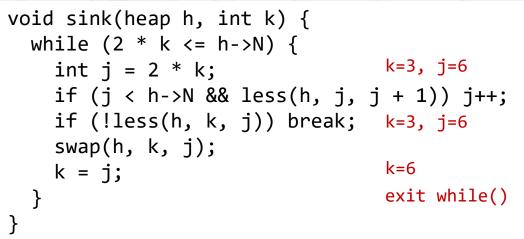


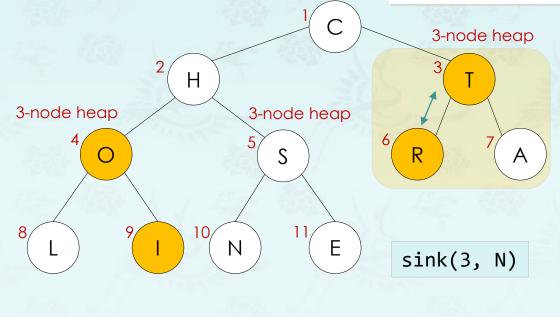


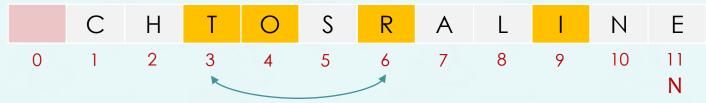


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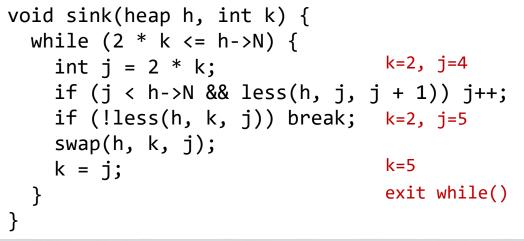


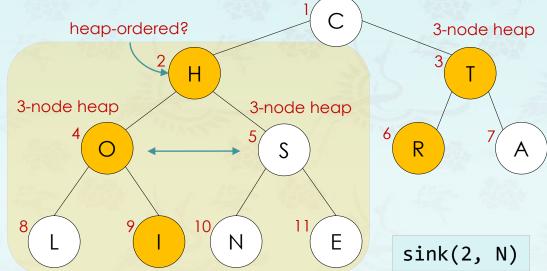




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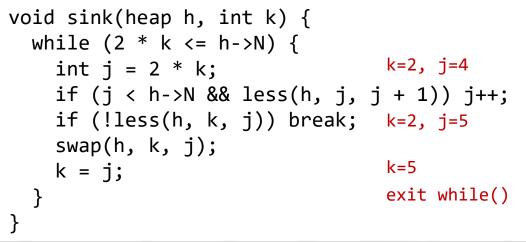


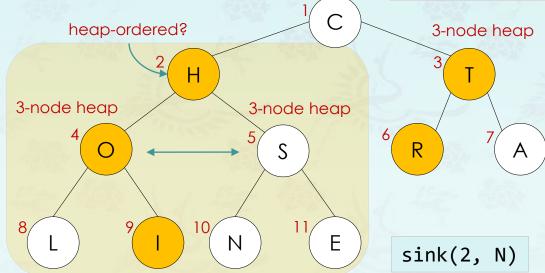




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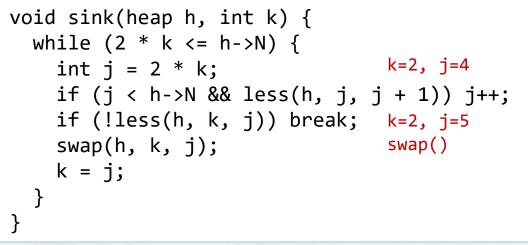


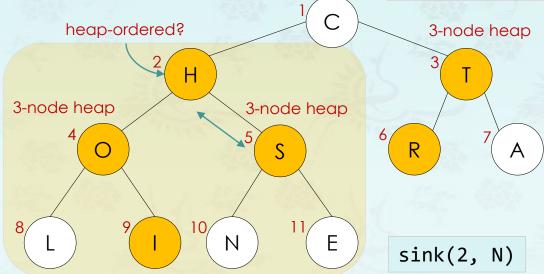




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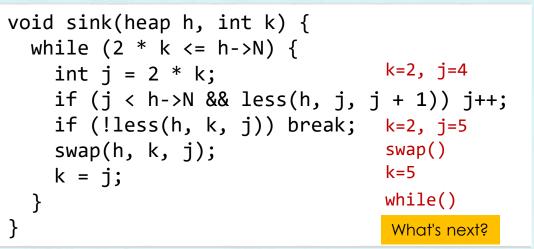


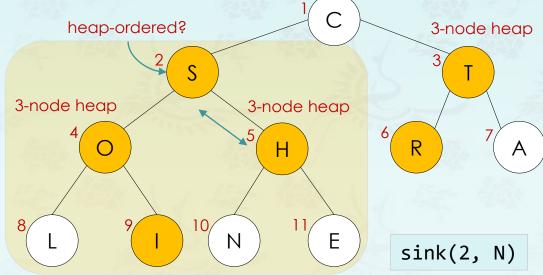




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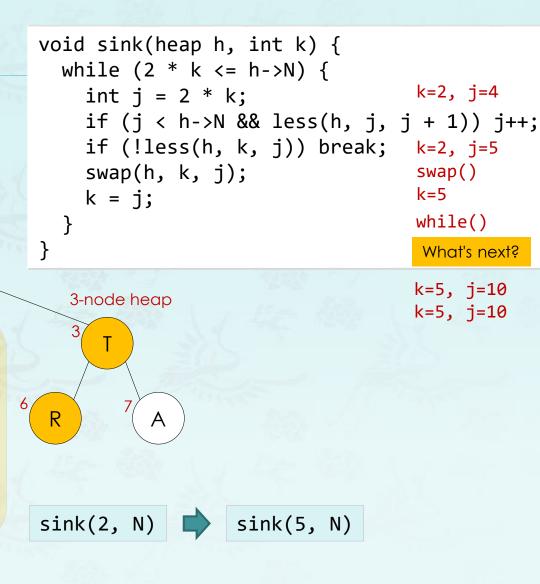
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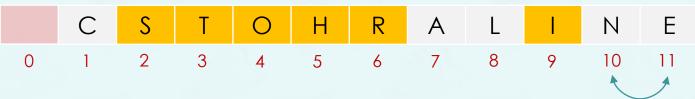
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3-node heap

heap-ordered?

array in arbitrary order





3-node heap

Н

Ν

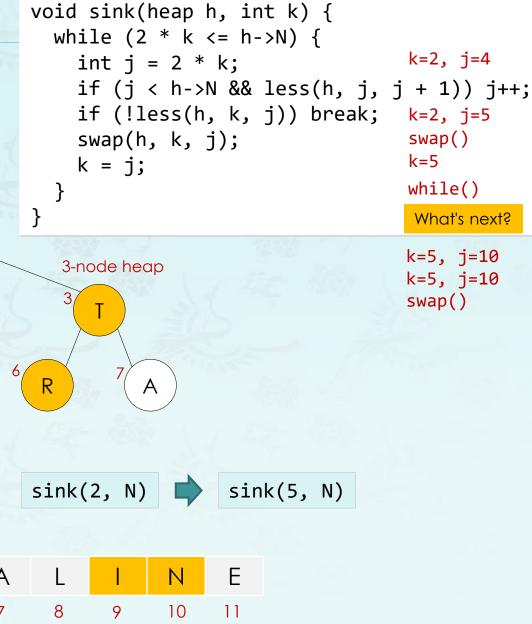
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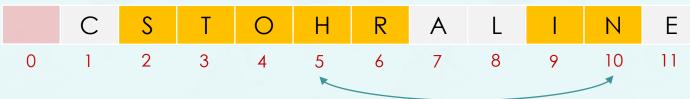
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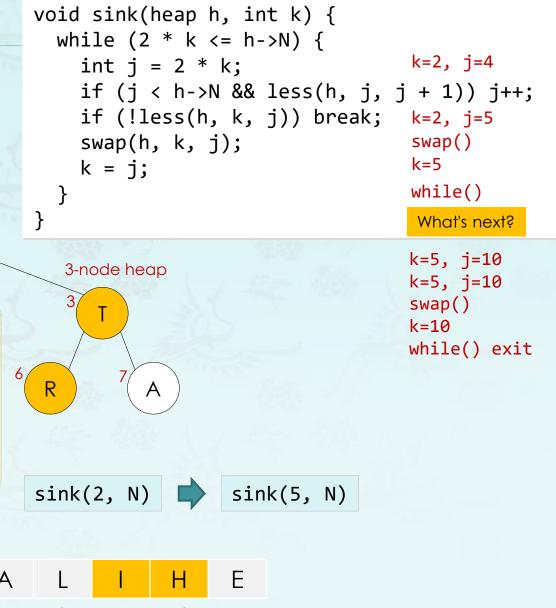
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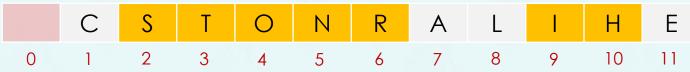
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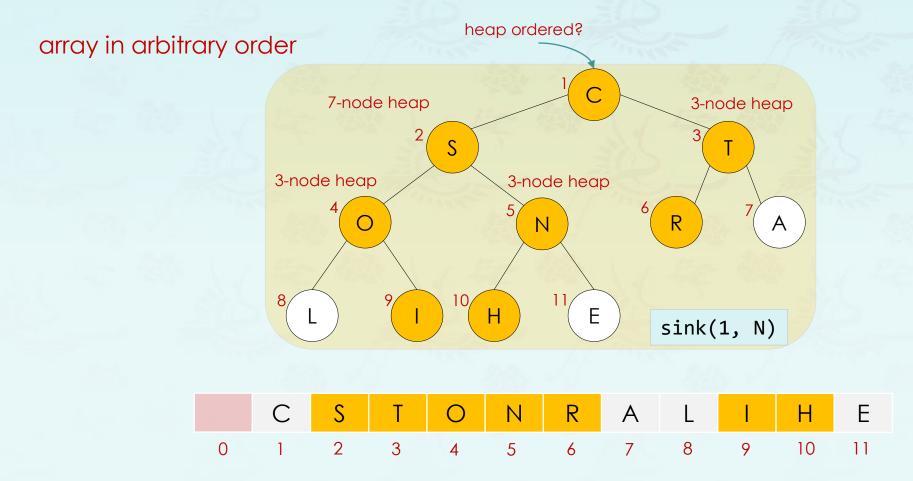
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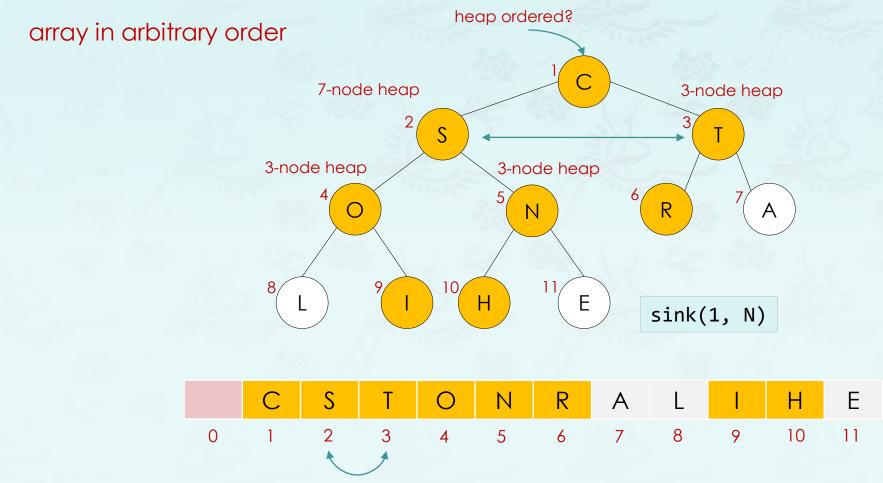
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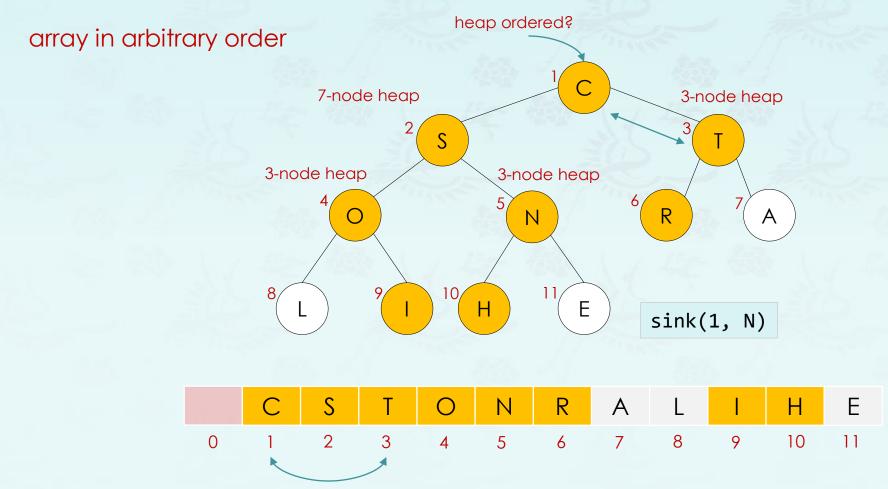
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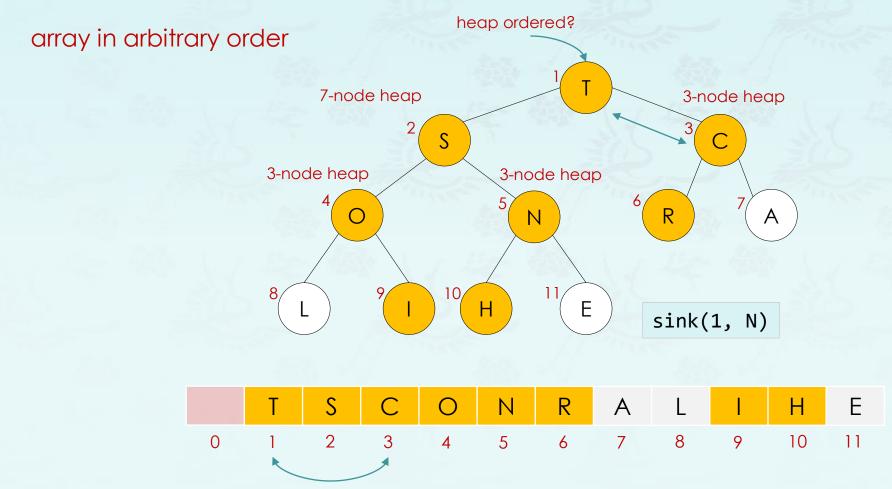
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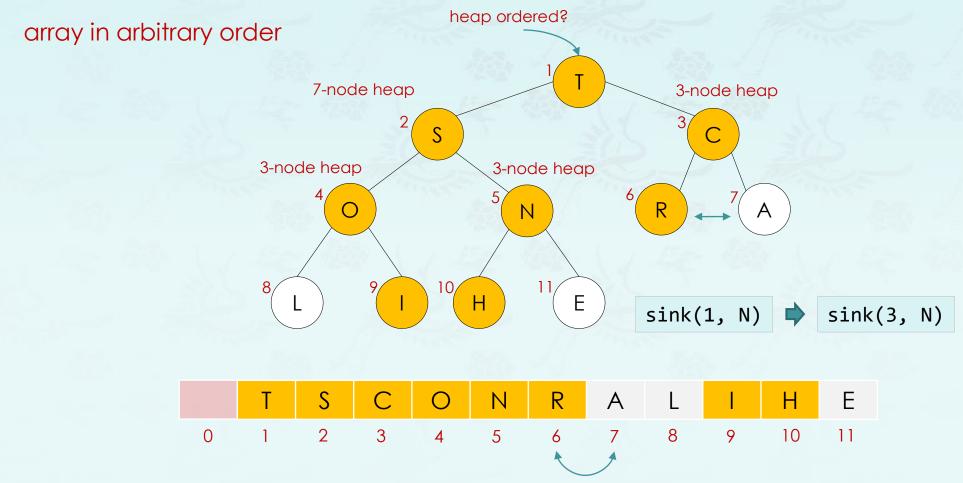
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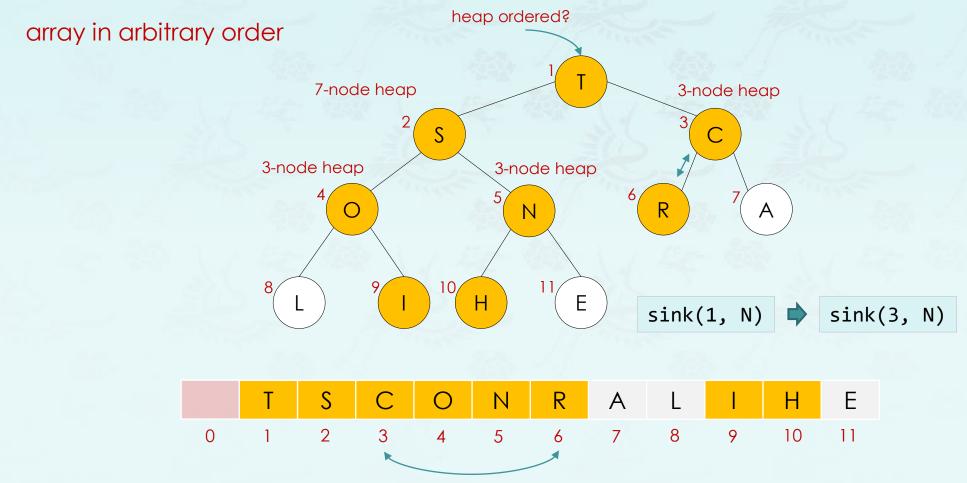
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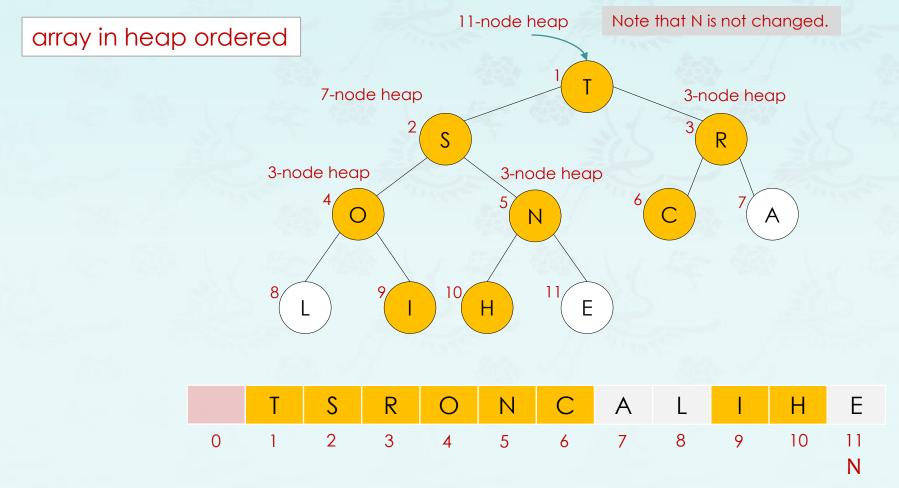
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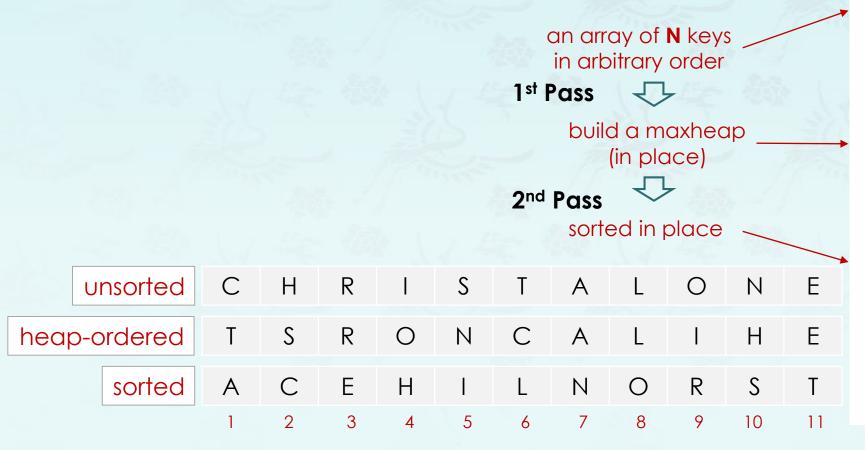
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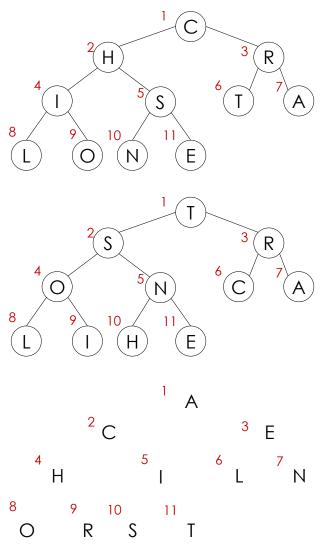
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#### Basic plan for in-place sort

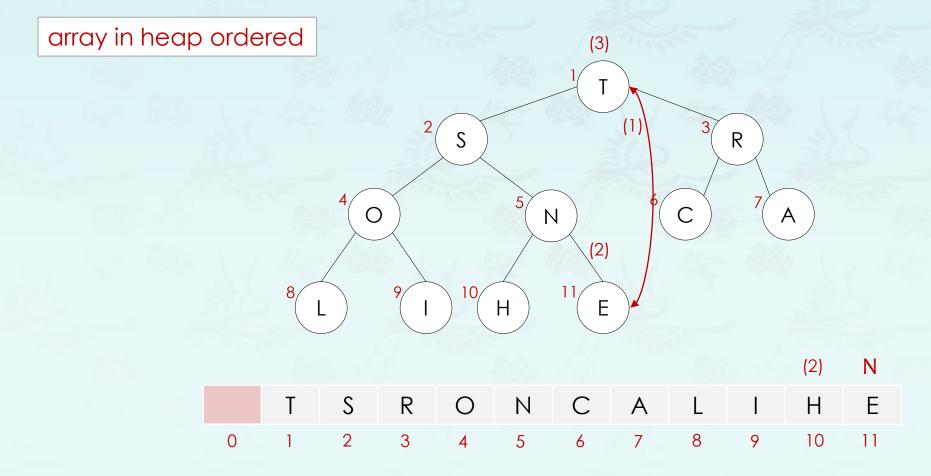
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- 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.





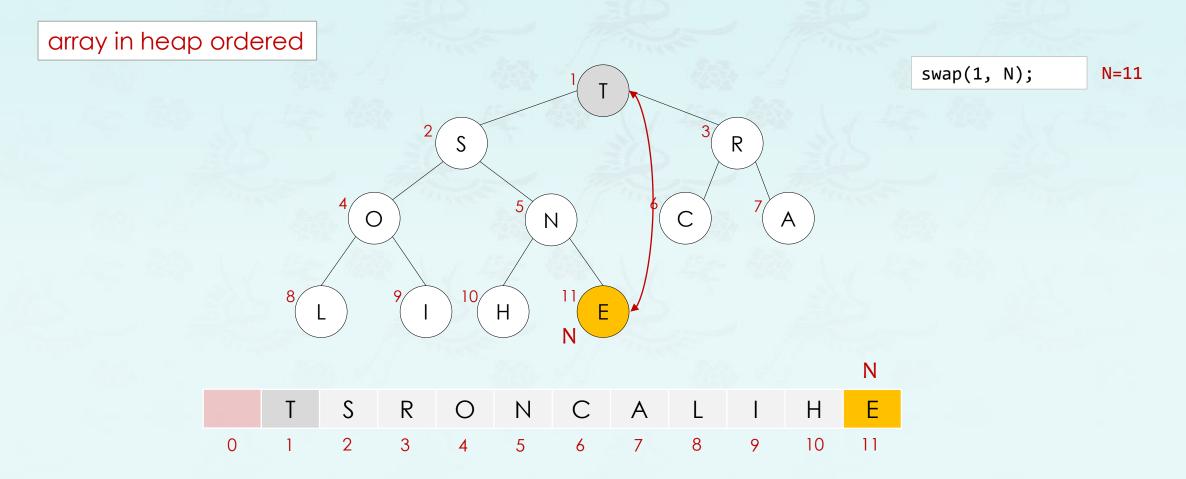
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out

- (1) Swap root (the max) and the last node.
- (2) Reduce N by one, but the value in memory.
- (3) Sink the new root to make it heap-ordered.



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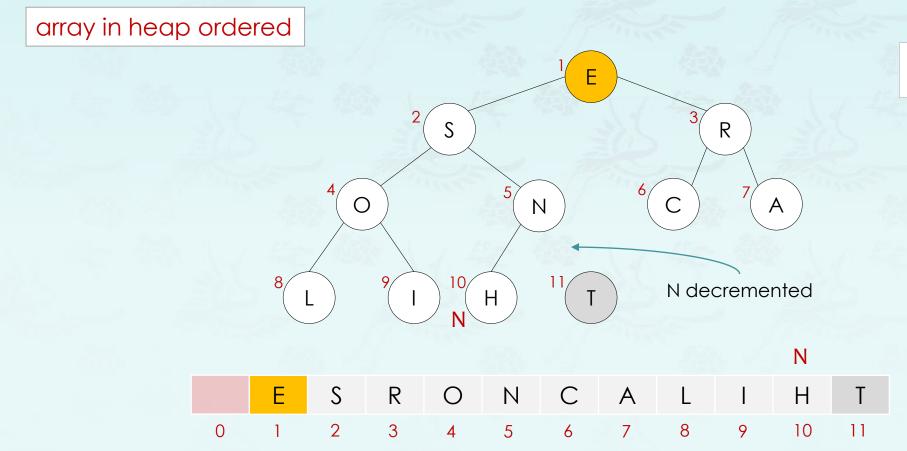
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array in heap ordered Ν N decremented Η N 0

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- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out

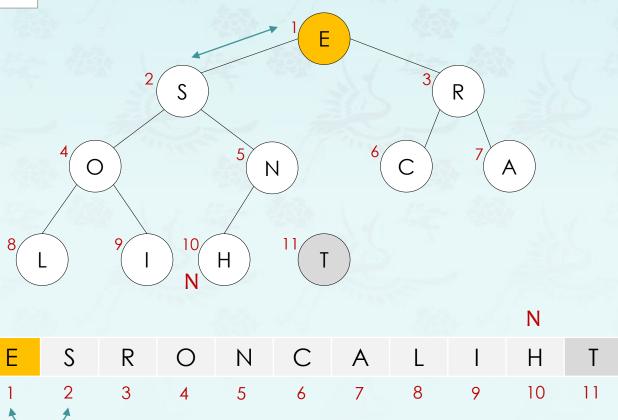
array in heap ordered S Ν N decremented Н N 0

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out

array in heap ordered

0

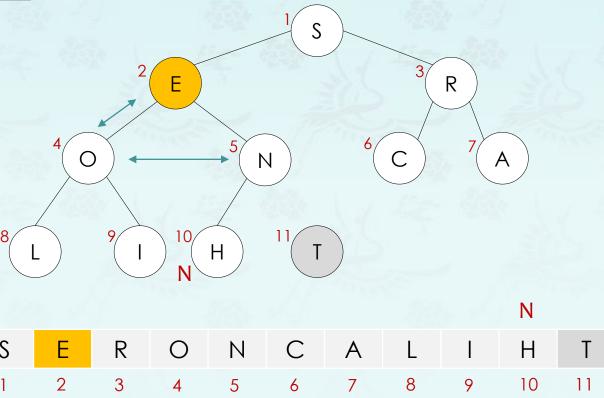


#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out

array in heap ordered

0



swap(1, N); N=11
sink(1, --N); N=10

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out

array in heap ordered Ν Η N 0

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

Remove the maximum, one at a time.

0

Leave them in array, instead of nulling out

array in heap ordered Ν Η N

swap(1, N);
sink(1, --N);

What's next?

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out

array in heap ordered swap(1, N); sink(1, --N);swap(1, N); R sink(1, --N); Ν N 0 8

N = 11

N=10

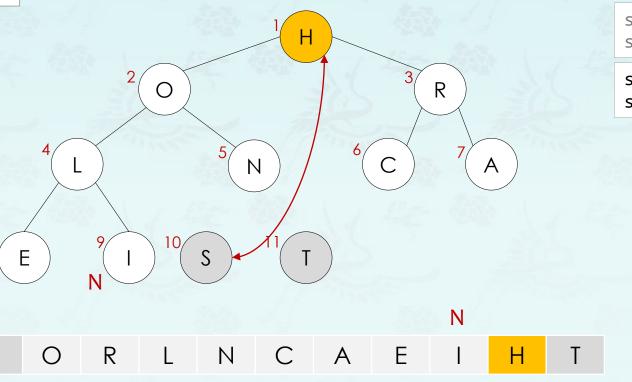
N = 10

N=9

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

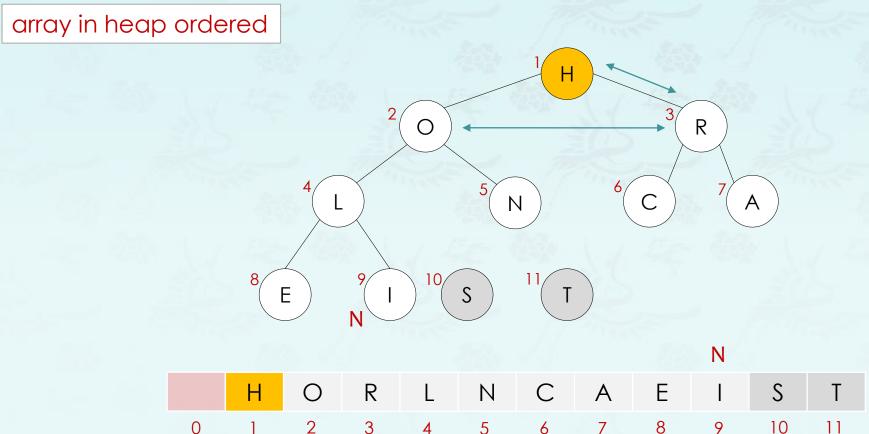
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out

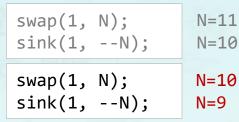
array in heap ordered



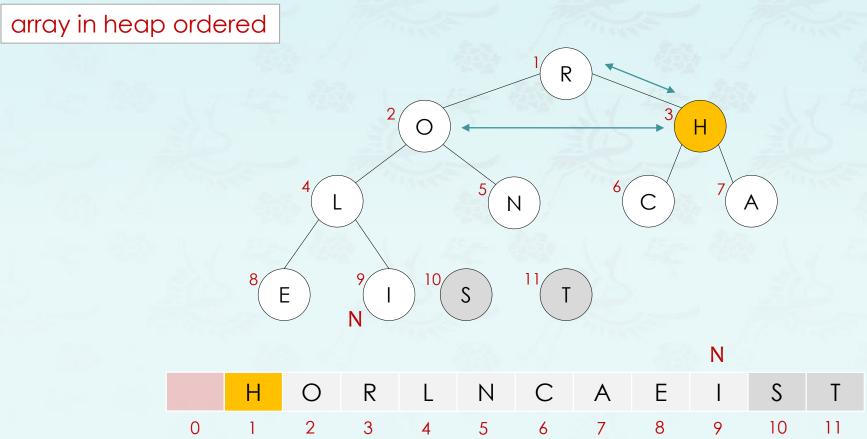
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=11<br>N=10 |
|----------------------------|------------|--------------|
| <pre>swap(1, sink(1,</pre> | • •        | N=10<br>N=9  |

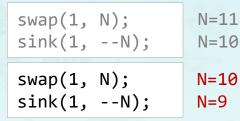
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out





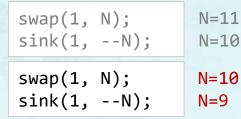
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out





#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

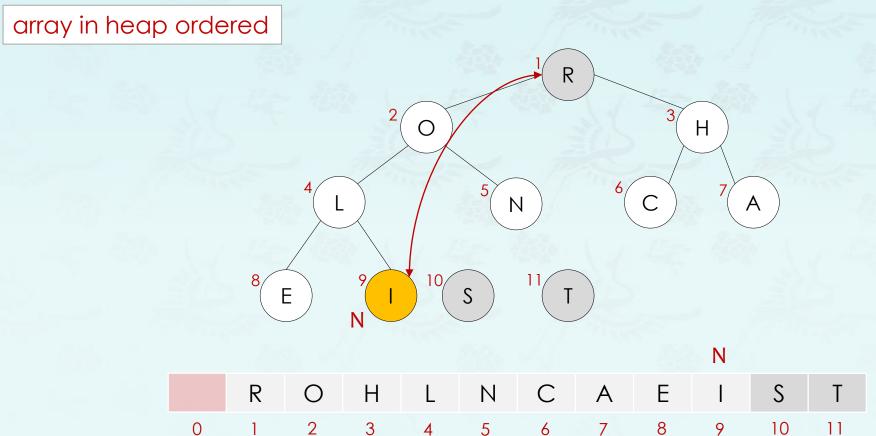
Remove the maximum, one at a time.

0

Leave them in array, instead of nulling out

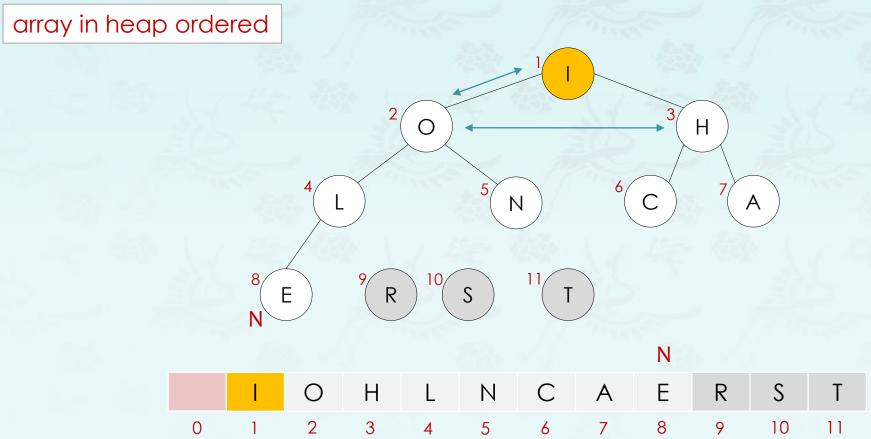
| swap(1, N);<br>sink(1,N);         | N=11<br>N=10 |
|-----------------------------------|--------------|
| <pre>swap(1, N); sink(1,N);</pre> | N=10<br>N=9  |
| What's next?                      |              |
|                                   |              |

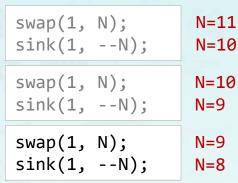
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=9<br>N=8   |
|----------------------------|------------|--------------|
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=16<br>N=9  |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=11<br>N=16 |
| G1 1212 / 1                | M > .      | N_11         |

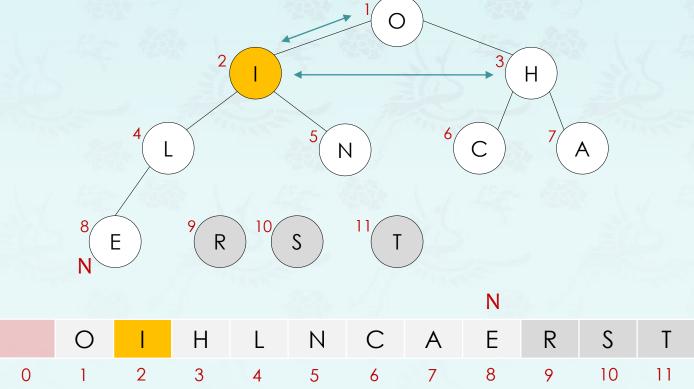
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out





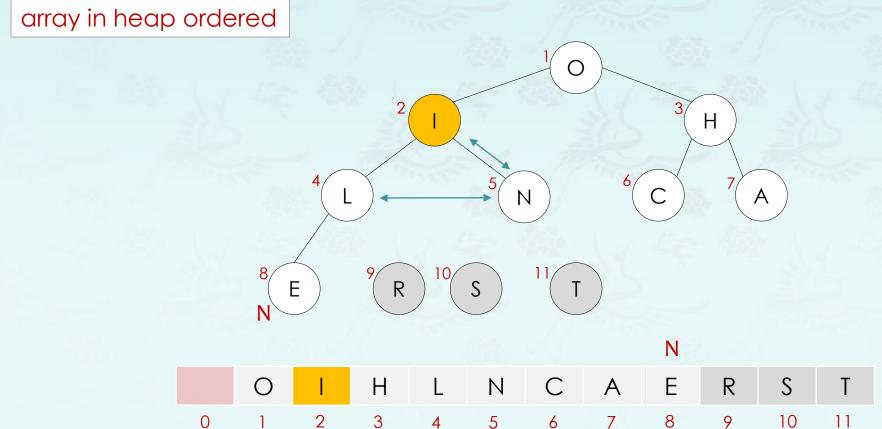
#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=9<br>N=8   |
|----------------------------|------------|--------------|
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=16<br>N=9  |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=11<br>N=10 |

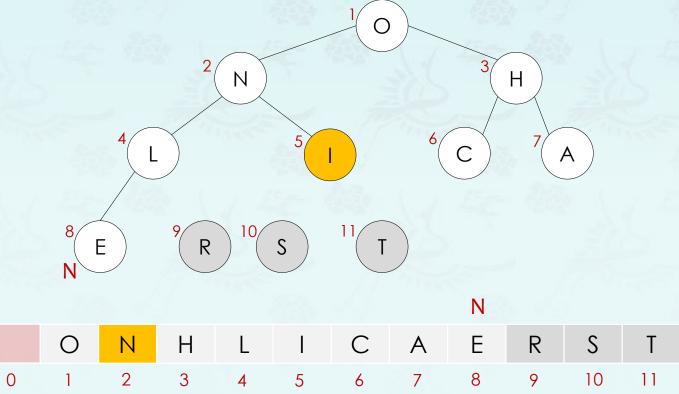
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=9<br>N=8   |
|----------------------------|------------|--------------|
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=10<br>N=9  |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=11<br>N=10 |
| swap(1,                    | N);        | N=11         |

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

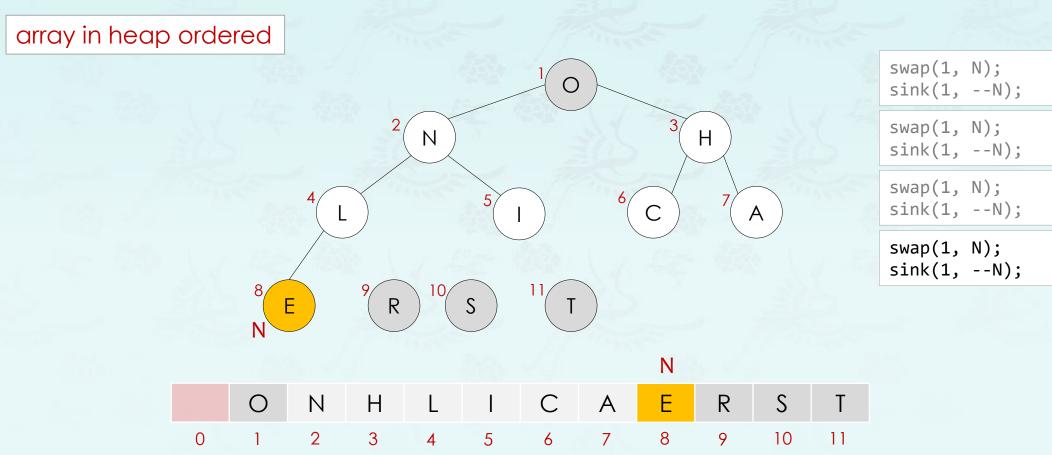
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=9<br>N=8   |
|----------------------------|------------|--------------|
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=10<br>N=9  |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=11<br>N=16 |

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



N = 11

N = 10

N = 10

N=9

N=9

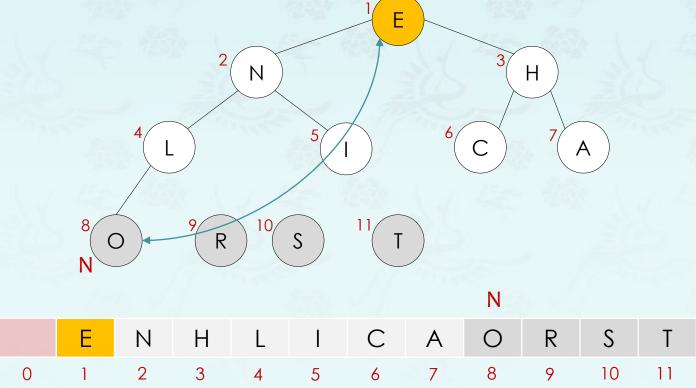
N=8

N=8

N=7

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

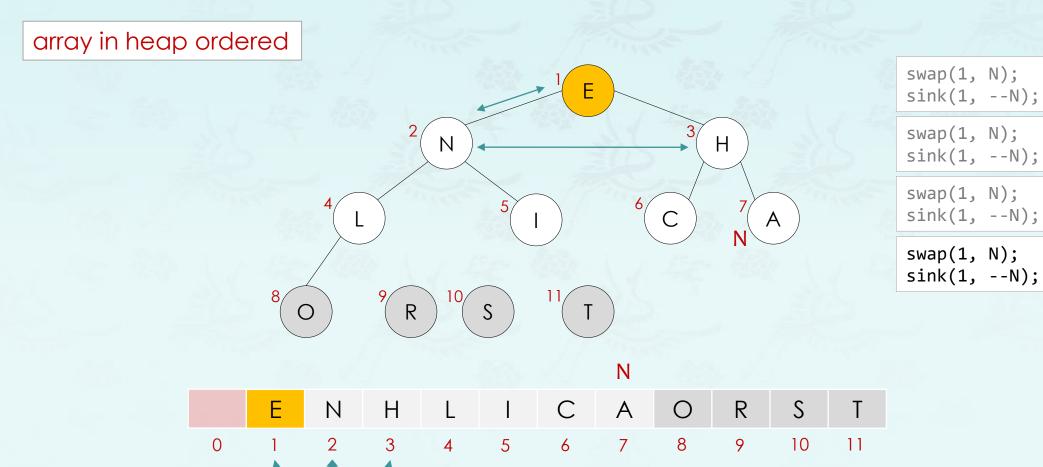
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=11<br>N=10 |
|----------------------------|------------|--------------|
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=10<br>N=9  |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=9<br>N=8   |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=8<br>N=7   |
|                            |            |              |
|                            |            |              |

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



N = 11

N = 10

N = 10

N=9

N=9

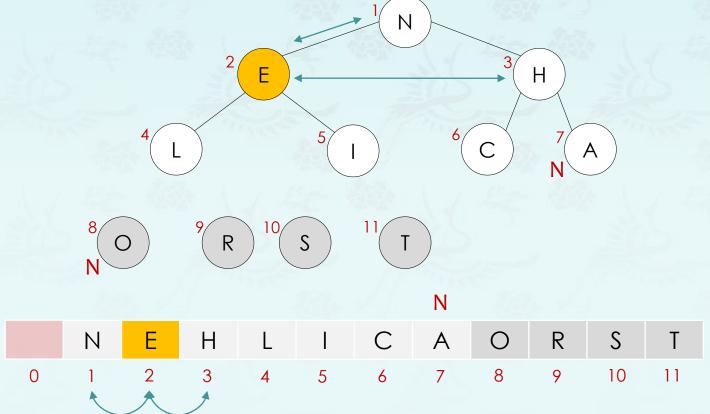
N=8

N=8

N=7

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

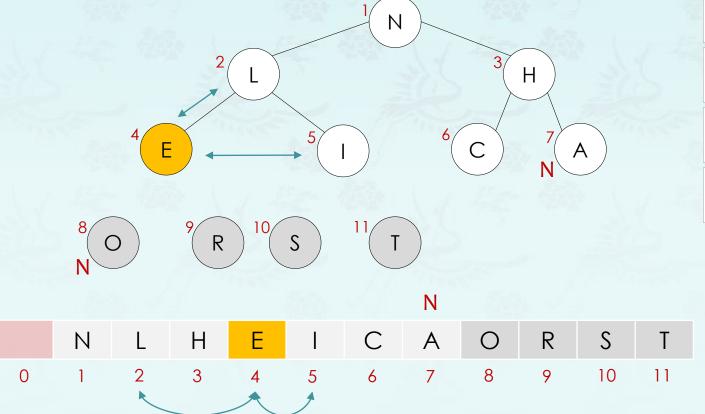
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



| swap(1, | N); | N=8  |
|---------|-----|------|
| sink(1, | N); | N=7  |
| swap(1, | N); | N=9  |
| sink(1, | N); | N=8  |
| swap(1, | N); | N=10 |
| sink(1, | N); | N=9  |
| swap(1, | N); | N=11 |
| sink(1, | N); | N=10 |
|         |     |      |

#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

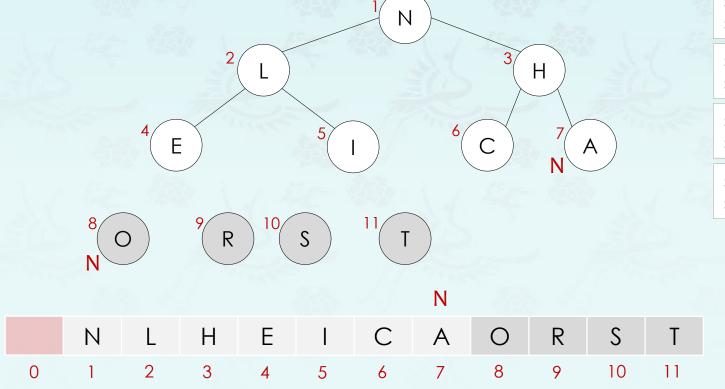
- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=8<br>N=7   |
|----------------------------|------------|--------------|
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=9<br>N=8   |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=10<br>N=9  |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=11<br>N=10 |
|                            |            |              |

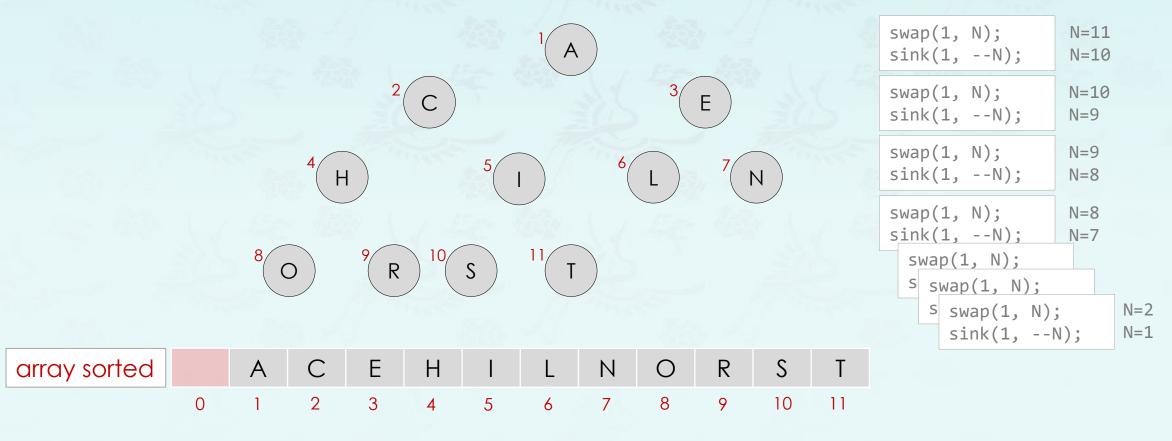
#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=1<br>N=1 |
|----------------------------|------------|------------|
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=1<br>N=9 |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=9<br>N=8 |
| <pre>swap(1, sink(1,</pre> | N);<br>N); | N=8<br>N=7 |
|                            |            |            |

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out



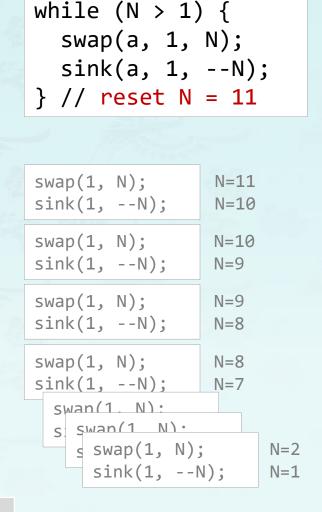
array sorted

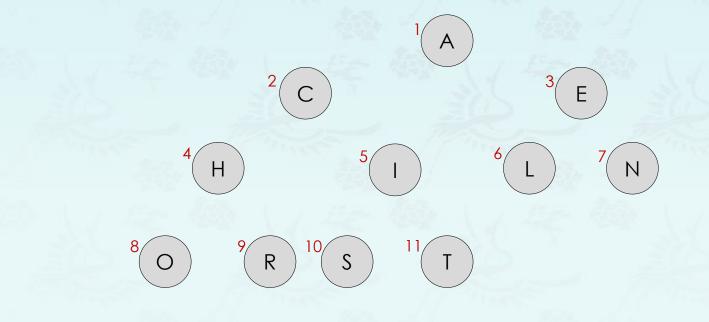
#### 2<sup>nd</sup> Pass: Repeatedly remove the maximum key.

- Remove the maximum, one at a time.
- Leave them in array, instead of nulling out
- After sorted, do not forget resetting N.

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## Heapsort tracing

```
Enter a word to sort: CHRISTALONE
                                                      printed in main()
Input String:[ CHRISTALONE ], N=11
                                                      printed in main()
Input a[11]: CHRISTALONE
ASCENDING:
1st pass(heapify - O(n)) begins:
   N=11 k=5 C H R I S T A L O N E
   N=11 k=4 C H R O S T A L I N E
                                                 1st path
   N=11 k=3 C H T O S R A L I N E
   N=11 k=2 C S T O N R A L I H E
                                                 printed in sink()
   N=11 k=1 T S R O N C A L I H E
HeapOrdered: T S R O N C A L I H E
                                                     printed in heapSort()
2nd pass(swap and sink - O(n log n) begins:
   N=10 k=1 S O R L N C A E I H
   N=9 k=1 R O H L N C A E I
   N=8 k=1 O N H L I C A E
   N=7 k=1 N L H E I C A
   N=6 k=1 L T H E A C
                                                 2<sup>nd</sup> path
   N=5 k=1 I E H C A
   N=4 k=1 H E A C
                                                 printed in sink()
   N=3 k=1 E C A
   N=2 k=1 C A
   N=1 k=1 A
                                                      printed in main()
a[11]: A C E H I L N O R S T
NOTE: This implementation does not sort the first element in the array.
NOTE: N=?? k=? .... lines are outputs at the end of each sink()
```

## Binary heap operations time complexity with N items:

- Level of heap is  $\lfloor \log_2 N \rfloor$
- insert: O(log N) for each insert
  - In practice, expect less
- delete: O(log N) // deleting root node in min/max heap
- decreaseKey: O(log N)
- increaseKey: O(log N)
- remove: O(log N) // removing a node in any location
- Heapify(): ○(N)
- Heapsort(): O(n log n)
- Because O(N) heapify + O(n log n) remove nodes = O(n log n)
- Proof:
  - https://stackoverflow.com/questions/9755721/how-can-building-a-heap-be-on-time-complexity
  - https://www.growingwiththeweb.com/data-structures/binary-heap/build-heap-proof/
  - https://www.quora.com/How-is-the-time-complexity-of-building-a-heap-is-o-n
  - http://www.cs.umd.edu/~meesh/351/mount/lectures/lect14-heapsort-analysis-part.pdf

# Data Structures Chapter 5: Heap and Priority Queue

- 1. Heap & Priority Queue
- 2. Heapsort
  - Heap Construction Heapify
  - Heapsort
  - Time Complexity
- 3. Heap & PQ Coding