

# Data Structures and Algorithms

## (資料結構與演算法)

### Lecture 10: Heap

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motivation

# Visual Intuition of Priority Queue



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## max-priority-out

- priority boarding
- bandwidth management
- job scheduler

priority queue: 'extension' of queue for more realistic use

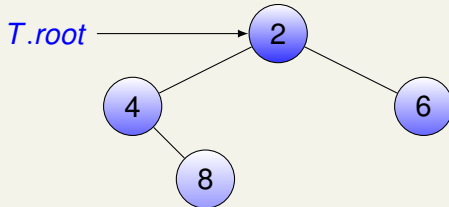
# Priority Queue with Binary Tree

previously

data	
left	right

next

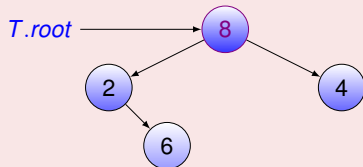
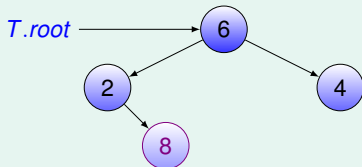
key	data
left	right



- *key*: priority (the **larger** the better)
- *data*: item in todo list  
—will show *key* only for simplicity

goal: get the node with **largest** key fast (& remove it)

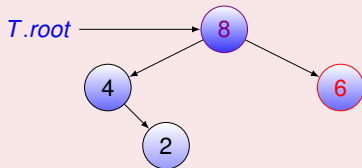
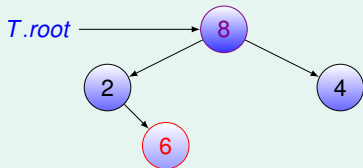
# Max-Root Tree



faster access to **largest key** if put at  $T.root$

max-root (binary) tree: **largest key @ root**

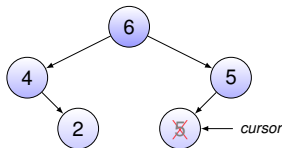
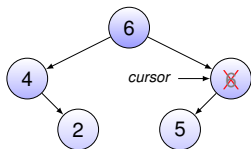
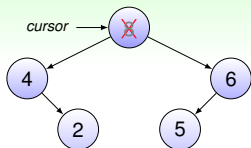
# Max Tree



hard to **remove largest** fast if cannot easily locate **second largest**

max (binary) tree: **largest key @ root**  
**for every subtree**

# Simple Removal for Max Tree



REMOVE-LARGEST(max tree  $T$ )

```

1  result = T.data
2  cursor = T.root
3  while [cursor not NIL]
4      larger =
          COMPARE(cursor.left, cursor.right)
5      if [larger not NIL]
6          cursor.key = larger.key
7          cursor.data = larger.data
8          cursor = larger
9  return result

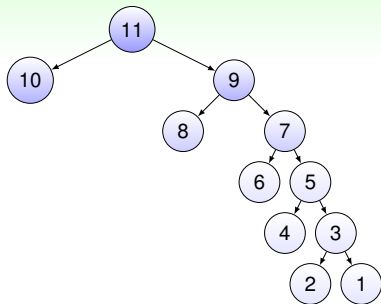
```

REMOVE-LARGEST for height- $h$  max-tree takes  $O(h)$  time

max heap



# Worst Case of REMOVE-LARGEST for Max Tree

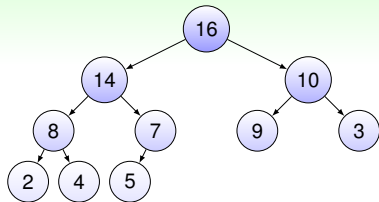


REMOVE-LARGEST(max tree  $T$ )

```
1  result =  $T.data$ 
2  cursor =  $T.root$ 
3  while [cursor not NIL]
4      larger =
          COMPARE(cursor.left, cursor.right)
5      if [larger not NIL]
6          cursor.key = larger.key
7          cursor.data = larger.data
8      cursor = larger
9  return result
```

$h = O(n)$  and hence REMOVE-LARGEST is  $O(n)$  :-)

# Max Heap: “Shortest” Max Tree



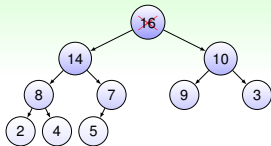
max heap = max tree  
+ complete binary tree

REMOVE-LARGEST(max tree  $T$ )

```
1  result =  $T.data$ 
2  cursor =  $T.root$ 
3  while [cursor not NIL]
4      larger =
          COMPARE(cursor.left, cursor.right)
5      if [larger not NIL]
6          cursor.key = larger.key
7          cursor.data = larger.data
8      cursor = larger
9  return result
```

but REMOVE-LARGEST cannot  
preserve **complete binary tree** easily

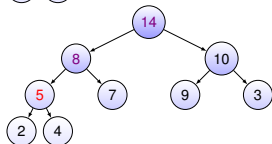
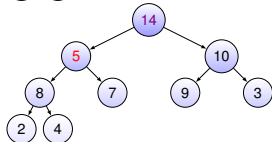
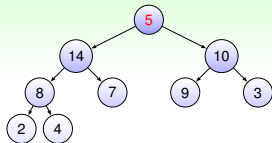
# REMOVE-LARGEST for Max Heap



REMOVE-LARGEST(max heap  $T$ )

```

1  result = T.data
2  remove T.tail & copy it to T.root
3  cursor = T.root
4  repeat
5      largest =
6          LARGEST(cursor, cursor.left, cursor.right)
7      if [largest equals cursor ]
8          break the loop
9      else
10         SWAP(cursor, largest)
11         cursor = largest
12 until cursor = NIL
13 return result
  
```

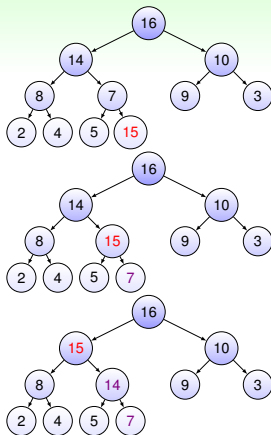


lines 3-12: HEAPIFY; can similarly DECREASE-KEY

# INSERT for Max Heap

INSERT(max heap  $T$ ,  $key$ ,  $data$ )

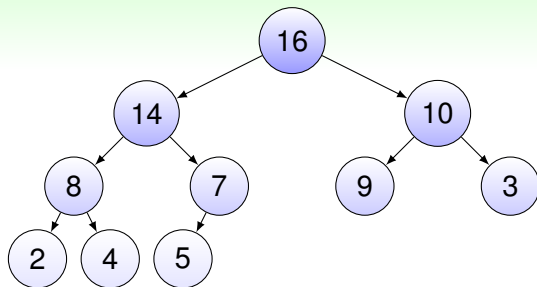
```
1  insert ( $key$ ,  $data$ ) to  $T.tail$ 
2   $cursor = T.tail$ 
3  repeat
4     $larger =$ 
5      LARGER( $cursor$ ,  $cursor.parent$ )
6    if [ $larger$  equals  $cursor$  ]
7      break the loop
8    else
9      SWAP( $cursor$ ,  $larger$ )
10      $cursor = larger$ 
11 until  $cursor = NIL$ 
```



can similarly INCREASE-KEY

heap sort

# Heap $\iff$ Partially Ordered Array



index	1	2	3	4	5	6	7	8	9	10
key	16	14	10	8	7	9	3	2	4	5

unordered array  $\rightarrow$  heap  
selection sort  $\rightarrow$  heap sort

# Selection Sort versus Heap Sort

## SELECTION-SORT(*A*)

```
1  for i = 1 to A.length
2      m = GET-MIN-INDEX(A, i, A.length)
3      SWAP(A[i], A[m])
4  return A // which has been sorted in place
```

time:  $O(n) \cdot O(n)$

**without any preprocessing**

## HEAP-SORT(*A*)

```
1  for i = A.length downto 1
2      (key, data)
        = REMOVE-LARGEST(A, 1, A.length)
3      copy (key, data) to A[i]
        // original A[i] is already in A[1]
4  return A // which has been sorted in place
```

time:  $O(n) \cdot O(\lg n)$

**after building heap**

heap sort: faster selection sort algorithm  
with help of heap data structure

# Missing Piece: Building Heap from Unordered Array

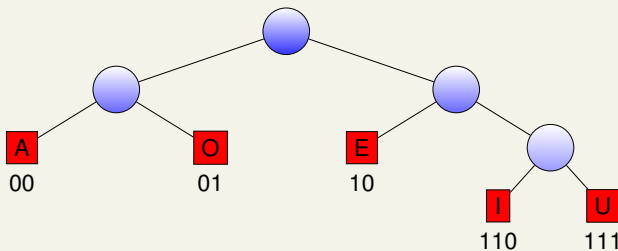
check textbook for details:

- suffices to heapify first half of all elements;
- total time (careful calculation) is  $O(n)$



application: huffman tree building

# Huffman Tree



## Huffman Tree

a special binary tree where

- each **leaf node** stores a symbol (i.e. 'A', 'E')
- **path** to **leaf node**  $\equiv$  **code** of symbol
- symbol string **IEEEAI**  $\Leftrightarrow$  code stream **11010101000110**
- **compress** symbol string under some assumptions

important behind lossless compression (zip, inside jpeg)

# Huffman Tree Construction (1/2)

compute frequency of each symbol

A: 800

E: 1200

I: 800

O: 800

U: 340

remove two smallest-frequency nodes; build sub-tree & insert

A: 800

E: 1200

O: 800



I: 800

U: 340

repeat the step

E: 1200

IU: 1140

AO: 1600

I: 800

U: 340

A: 800

O: 800

# Huffman Tree Construction (2/2)

E: 1200

IU: 1140

AO: 1600

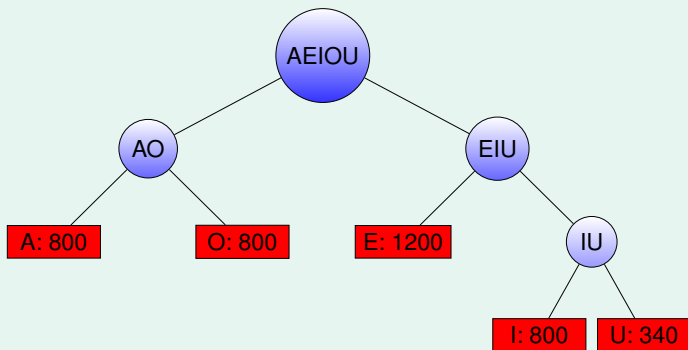
I: 800

U: 340

A: 800

O: 800

repeat two more steps and done!



# Take-Home Message

## DSA is useful

- binary tree is useful
    - huffman tree!
  - heap is useful
    - ‘remove two smallest-freq’ when constructing huffman tree
- and connects to other classes (e.g. Information Theory)

# Summary

## Lecture 10: Heap

- motivation

**possibly efficient priority queue by max tree**

- max heap

**max + complete bin. tree for  $O(\lg n)$  removal/insertion**

- heap sort

**max heap in array to speed up selection sort**

- application: huffman tree building

**priority queue to build huffman tree for compression**