

Data Structures

BTree Analysis (and Heaps)

CS 225

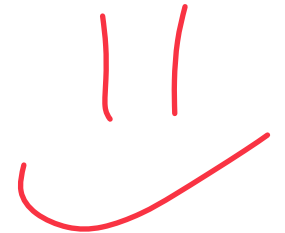
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Exam 3 (10/16 — 10/18)

Sign up now on PrairieTest!

↳ Practice Exam is up

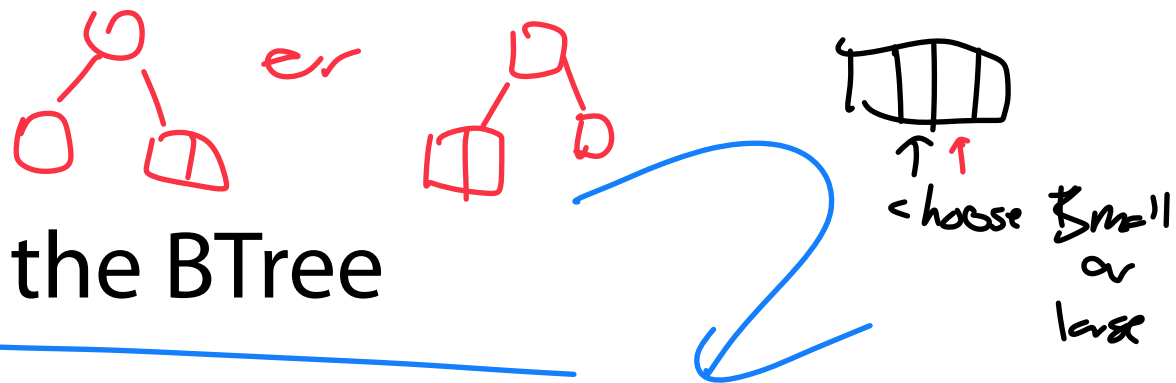
Cumulative content through end of BTrees (today)

Coding question based on trees (know your tree labs!)

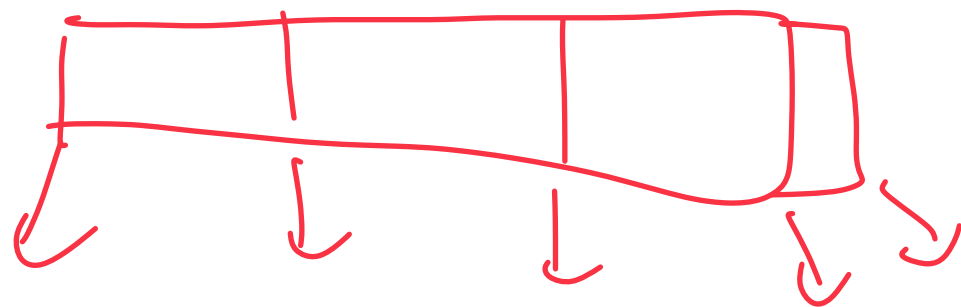
tree, bst, AVL
mosaic

Learning Objectives

Analyze the performance of the BTree



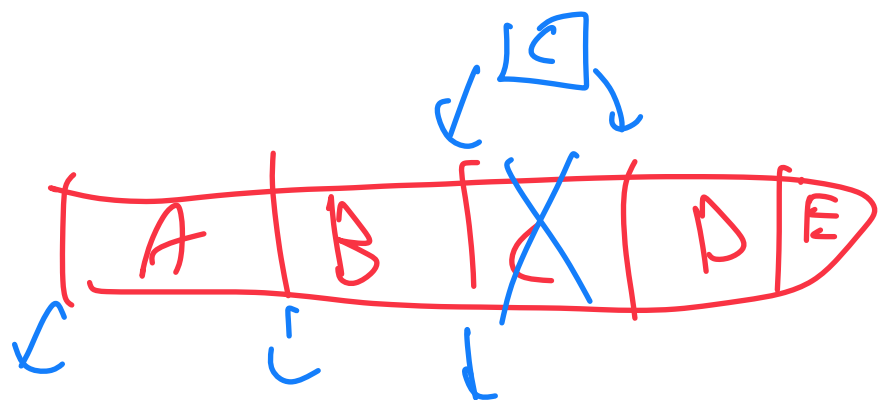
Introduce a specialized data structure (discuss tradeoffs)



4 keys
5 children

$m \geq 5$

Yes split when
keys = 4



$\lceil \frac{m}{2} \rceil - 1$ keys
 $\lceil \frac{m}{2} \rceil$ children

Very important property!

BTree Properties

Minimize seek operations

A **BTree** of order **m** is an m-ary tree and by definition:

- All keys within a node are ordered
- All nodes contain no more than **m-1** keys.
- All internal nodes have exactly **one more child than keys**

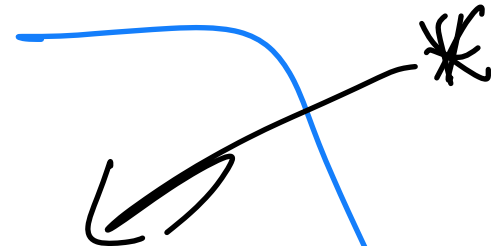
← Max

$$\text{children} = \text{keys} + 1$$

Root nodes can be a leaf or have **[2, m]** children.

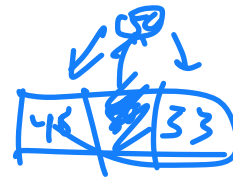
All non-root, internal nodes have **[ceil(m/2), m]** children.

All leaves in the tree are at the same level.



BTree Analysis

of order 3



$\lceil m/2 \rceil - 1$ keys

$\lceil m/2 \rceil$ children for internal nodes

Let n be the number of keys in a BTree of order m .

What is our best approximation for the runtime for find? For insert?

m 's constant that we set

Size of nodes

of nodes is not \pm keys

$$N = \# \text{ nodes} \cdot (m-1) \quad (\text{max})$$

$$\# \text{ nodes} = \lceil m/2 \rceil - 1$$

internal + leaf (non-root)

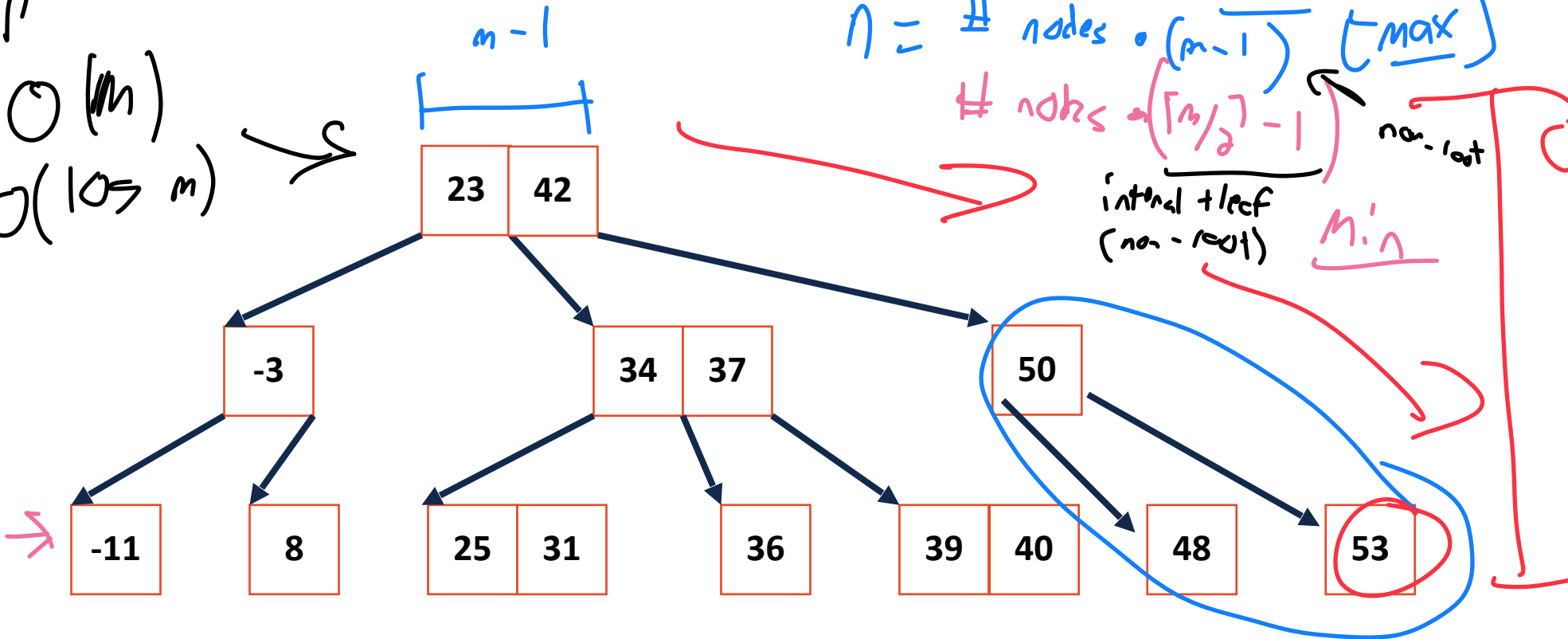
Min

non-leaf

$O(h)$

$$O(m)$$

$$O(\log m)$$



BTree Analysis

or AVL

Like the BST, BTree height determines the runtime of our operations!

Claim: The BTree structure limits our height to $O(\log_m(n))$

Proof: We want to find a relationship for BTrees between the number of keys (**n**) and the height (**h**).

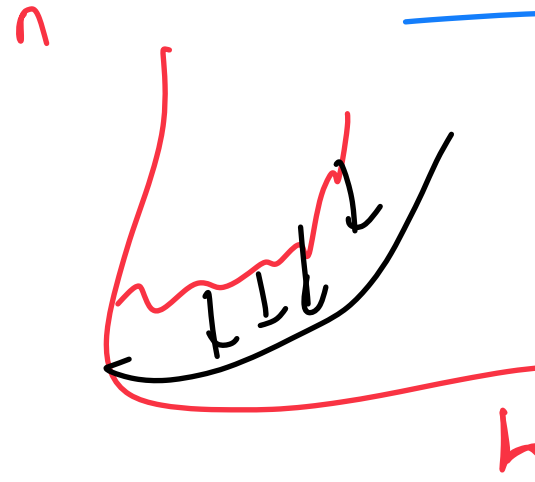
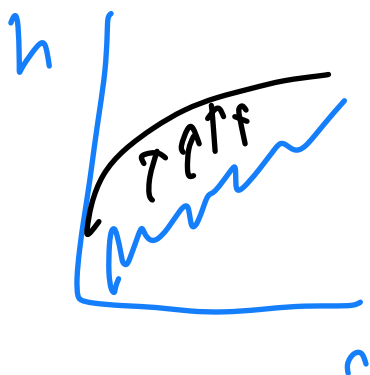
estimate min n given h

estimating height

given nodes
is hard

∴

invert



BTree Analysis

nodes have multiple keys

Strategy:

We will first count the number of nodes, level by level.

Then, we will add the minimum number of keys per node (n).

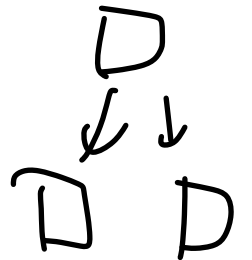
The minimum number of nodes will tell us the largest possible height (h), allowing us to find an upper-bound on height.

2 children \equiv 1 key

Key Facts:

Root nodes can be a leaf or have $[2, m]$ children.

All non-root, internal nodes have $[\text{ceil}(m/2), m]$ children.



BTree Analysis

$$1 = t = \lceil \frac{m}{2} \rceil$$

The **total number of nodes** is the sum of all the levels:

Summation Identity

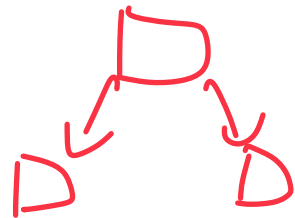
$$1 + 2 \sum_{k=0}^{h-1} t^k = 1 + 2 \left(\frac{t^h - 1}{t - 1} \right)$$

$$\sum_{i=0}^{n-1} x^i = \frac{x^n - 1}{x - 1}$$

↳ How can we relate # nodes to # keys?

BTree of order 2 is a BST

Note this doesn't work for $m=2$



As long as $m \geq 3$, BTree is efficient!

$m > 2$

BTree Analysis

The **total number of nodes**:

$$1 + 2 \frac{t^h - 1}{t - 1}$$

(The term 1 is labeled "root" and the fraction $2 \frac{t^h - 1}{t - 1}$ is labeled "leaf + internal")

$$t = \left\lceil \frac{m}{2} \right\rceil$$

The **total number of keys**:

root has how many keys? 1
 internal nodes: $\lceil \frac{m}{2} \rceil - 1 \equiv t - 1$
 leaf nodes: $\lceil \frac{m}{2} \rceil - 1 \equiv t - 1$

$$1 + 2 \left(\frac{t^h - 1}{t - 1} \right) \cdot (t - 1)$$

$$= 1 + 2t^h - 2$$

$$= 2t^h - 1$$

min # keys in tree of height h

→ Engineer, 😊

BTree Analysis

For height h

$$t = \lceil \frac{m}{2} \rceil$$



The **smallest total number of keys** is: $2t^h - 1$

$$t = \frac{m}{2}$$

So an inequality about n , the total number of keys:

$$\log_2 \left(\frac{n+1}{2} \right) \geq \log_2 \left(\frac{2^h - 1}{2} \right)$$

$$\log_2 \left(\frac{n+1}{2} \right) \geq h$$

$$\log_{\frac{m}{2}} \left(\frac{n+1}{2} \right) \geq h$$

Solving for h , since h is the max number of seek operations:



It's ok to be imbalanced
The min. is still efficient

$$h = O(\log_{\frac{m}{2}} n)$$

m does matter but not in theory 😊

BTree Analysis

Given $m=101$, a tree of height $h=4$ has:



Minimum Keys: $2t^h - 1 = 2\left(\frac{m}{2}\right)^h - 1$

$2 \cdot 5^4 - 1 = \underline{\underline{1250}}$ million

13 ↓ ?? slightly larger



Maximum Keys: Same logic but $t = m$

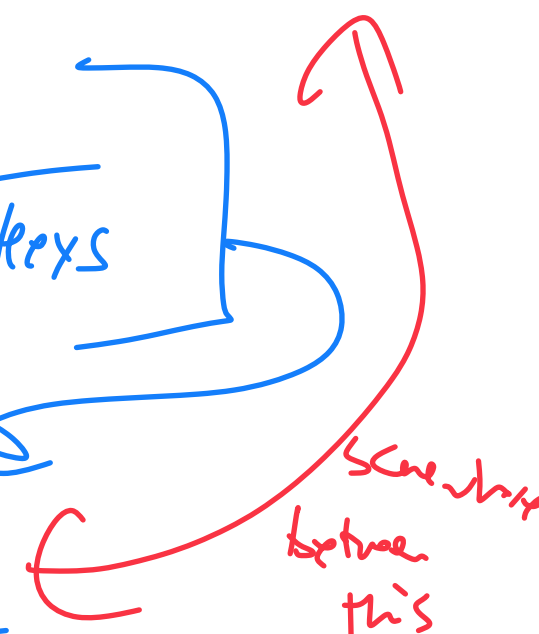
+ root is not 1 key but m keys

$2 + (m^2 + m^3 + \dots)$ nodes



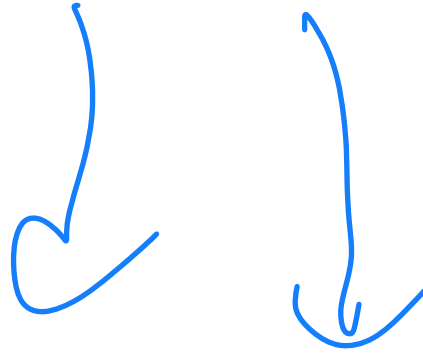
$m^{h+1} - 1$ keys

10.5 Billion



BTree

The BTree is still used heavily today!



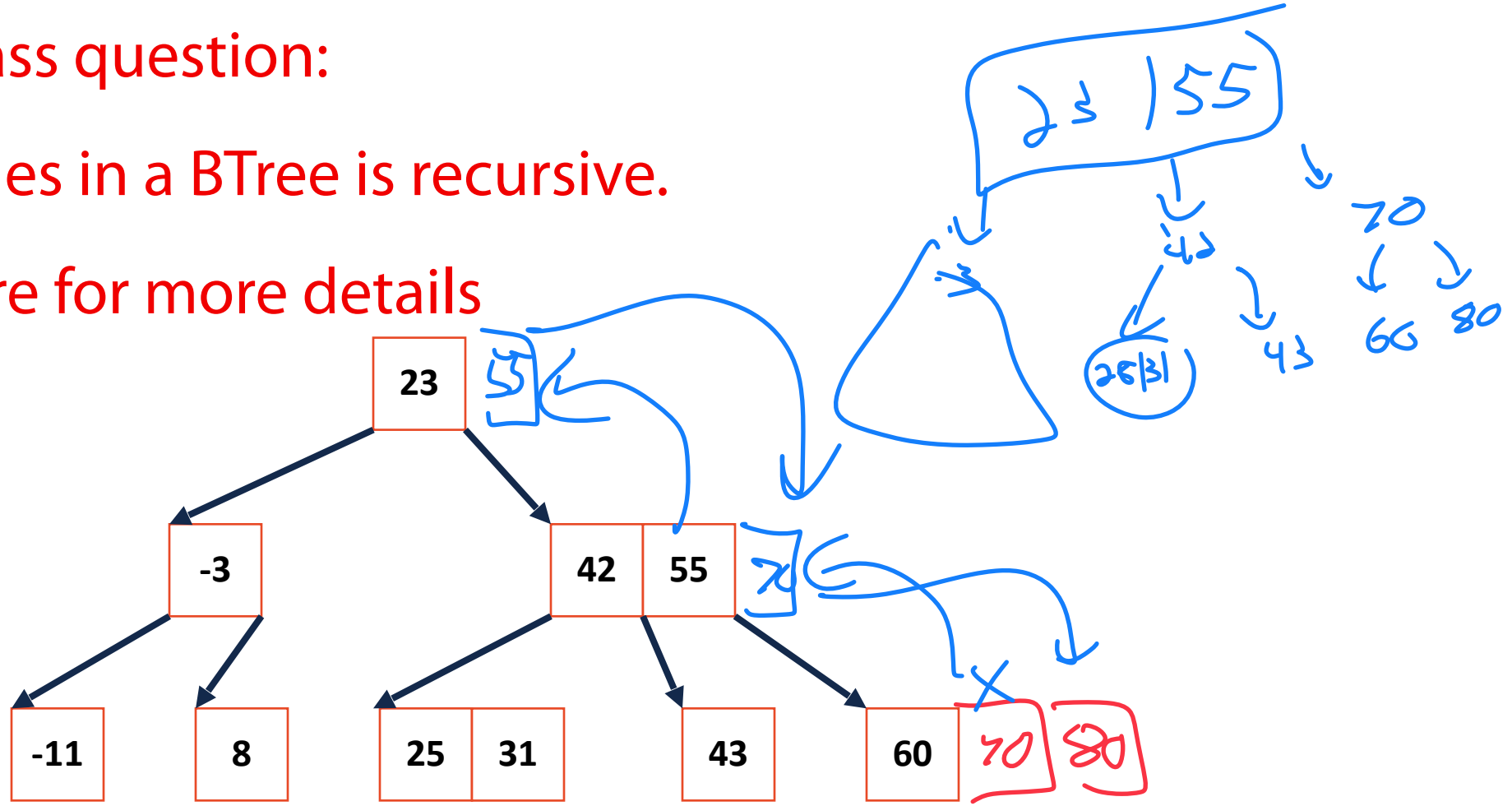
Improvements such as B+Tree and B*Tree exist ~~far~~ outside class scope

↳ Not be a final project!

Answer to in-class question:

Pushing up values in a BTree is recursive.

See insert lecture for more details



Thinking conceptually: Sorting a queue

How might we build a 'queue' in which our front element is the min?

After list we saw stack & queue \rightarrow special case list!
 \hookrightarrow Tradeoff for speed
Lose random access

Build up) unsorted list!

\hookrightarrow Insert by append to end of list $O(n^2)$ or $O(n)$

\hookrightarrow Remove I have to find my next min and swap w/ front $\hookrightarrow O(n)$

BTree / AVL tree (Sorted tree - ~~BT~~)

\hookrightarrow Insert in $\log n$
Find in $O(\log n)$

\hookrightarrow Remove in $\log n$:)

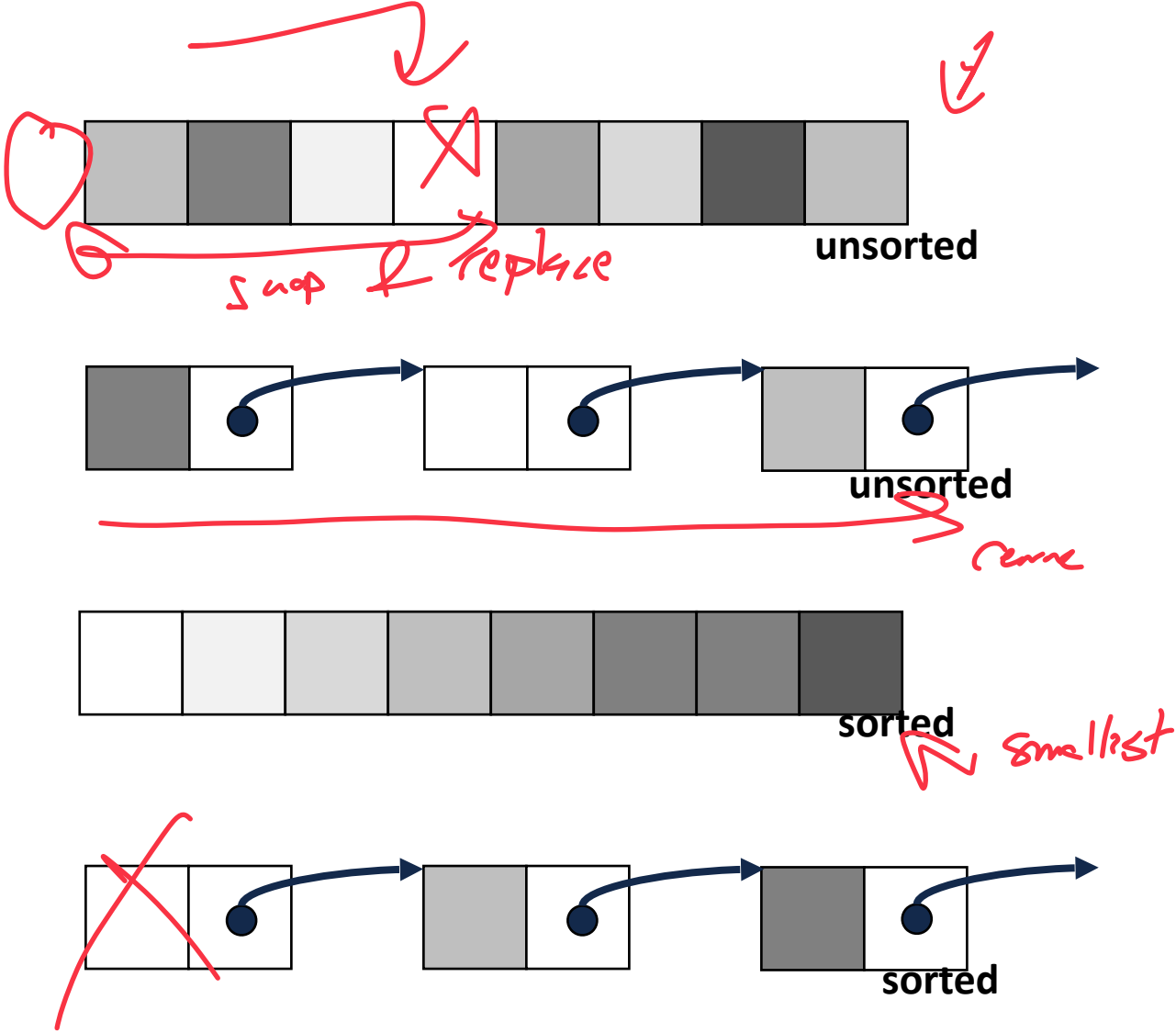


Priority Queue Implementation

insert	removeMin
$O(n)^*$	$O(n)$
$O(1)$	$O(n)$
$O(n)$	$O(1)$
$O(n)$	$O(1)$

slow

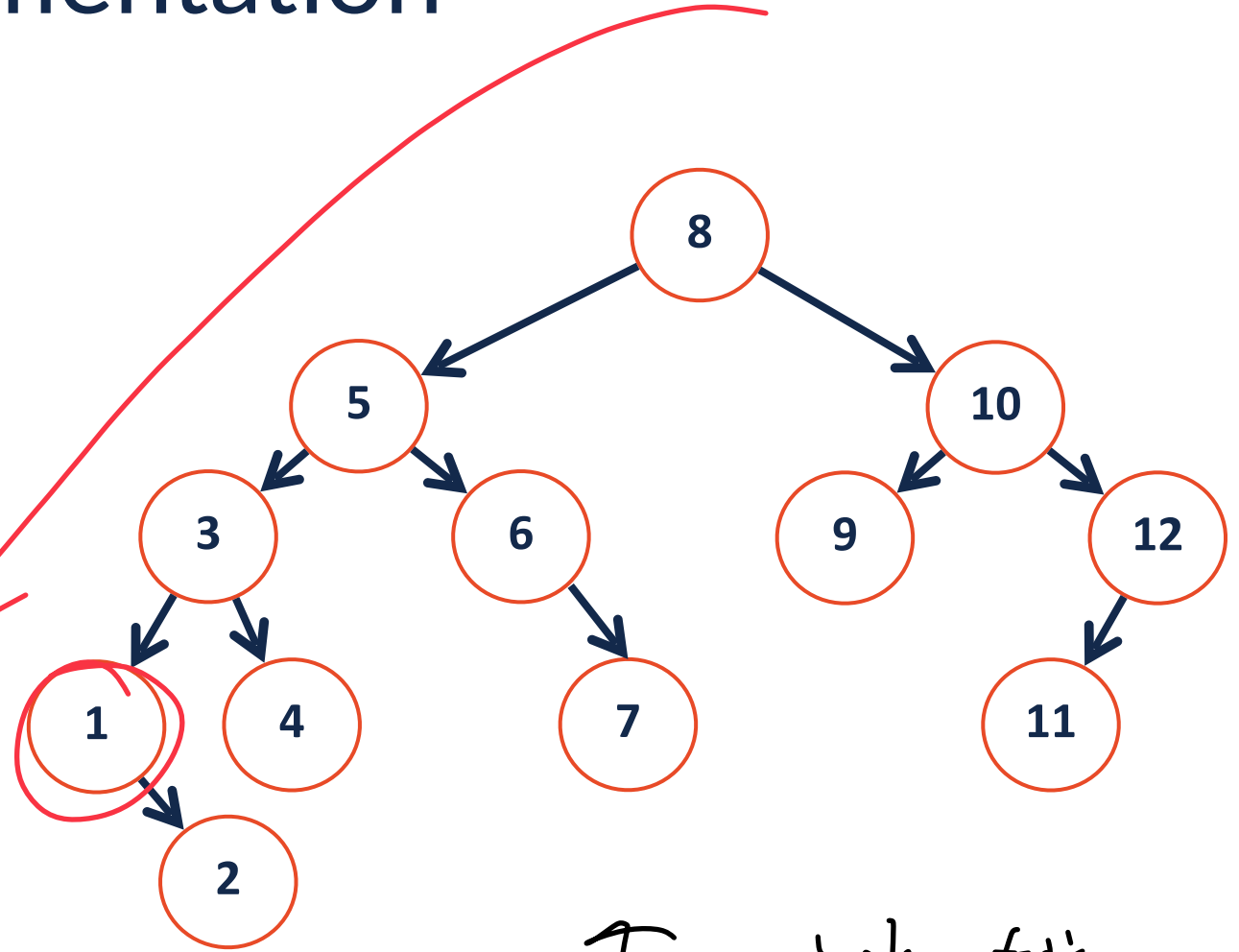
fast



Priority Queue Implementation

insert	removeMin
$O(\log n)$	$O(\log n)$

- 1) Tree size in storage !!!
- 2) I hate pointers



I say this object is a queue
↳ You (the user) can only insert / remove "front"

Our implementation
can be a tree

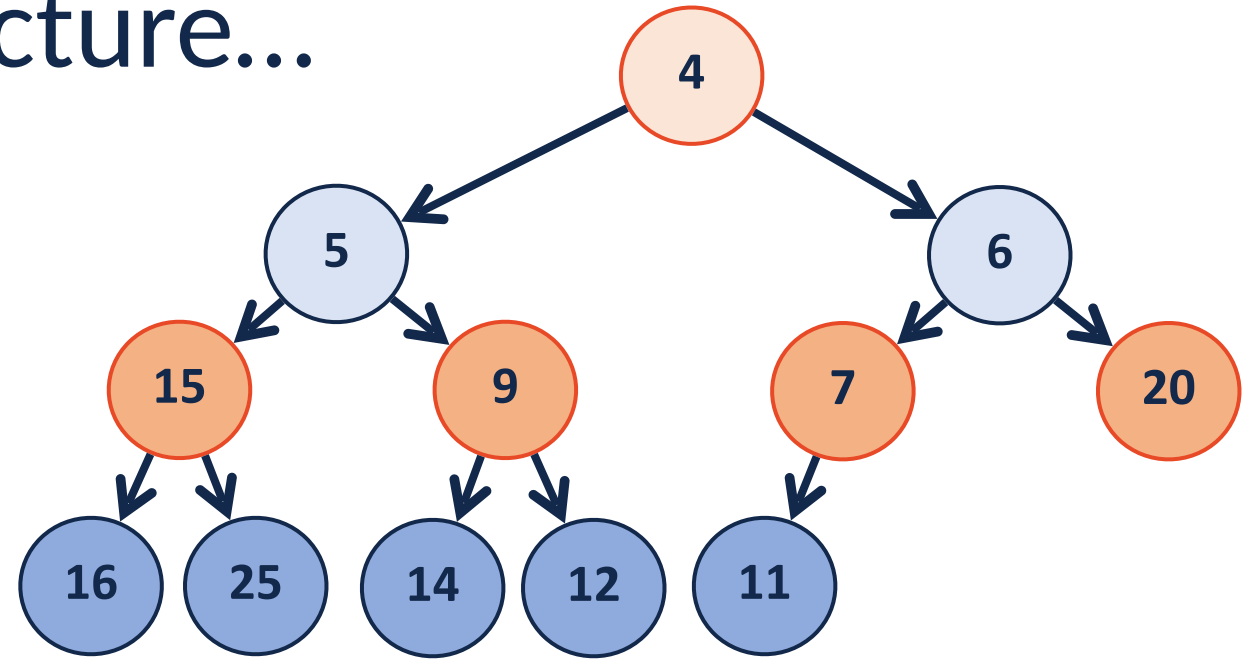
removeMin

Thinking conceptually: A tree without pointers

What class of (non-trivial) trees can we describe without pointers?



Another possibly structure...



(min)Heap

A complete binary tree T is a min-heap if:

- $T = \{\}$ or
- $T = \{r, T_L, T_R\}$, where r is less than the roots of $\{T_L, T_R\}$ and $\{T_L, T_R\}$ are min-heaps.

