

Data Structures

BTree Analysis

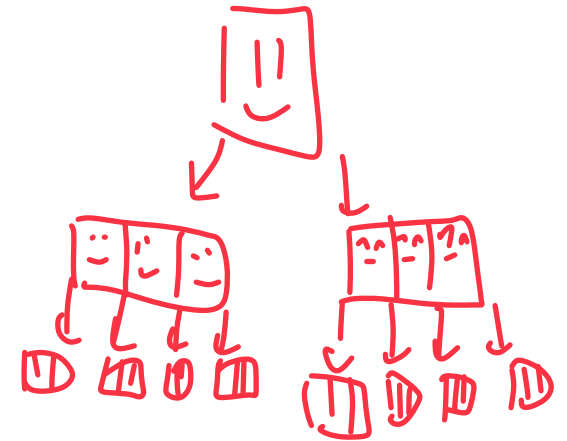
CS 225

October 9, 2024

Brad Solomon



UNIVERSITY OF
ILLINOIS
URBANA - CHAMPAIGN



Department of Computer Science

SIEBEL SCHOOL UNDERGRADUATE INFORMATIONAL SESSIONS

Research • Internships • Graduate School

LOOKING FOR A LITTLE TRICK TO UNLOCK YOUR
ACADEMIC FUTURE? WE'VE GOT THE TREATS FOR YOU!

RESEARCH 101

DIVE INTO THE MYSTERIES OF RESEARCH OPPORTUNITIES AT SIEBEL
SCHOOL AND DISCOVER HOW YOU CAN GET INVOLVED! PRESENTED BY
PROFESSOR BRAD SOLOMON W/ STUDENT Q & A PANEL.



October 10th, 1-2:30 PM, Siebel 2405

Sponsored by the Siebel School Undergraduate Programs Office

More questions? Contact

undergrad@siebelschool.illinois.edu

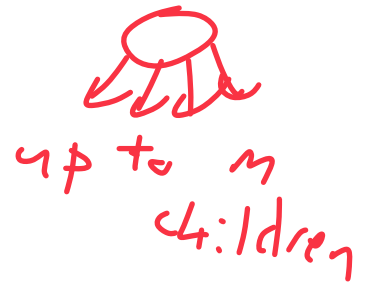


Learning Objectives → Finish implementation

Discuss the importance of M in a B Tree ←

Analyze the performance of the B Tree ↻

BTree Properties



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**
- All leaves in the tree are at the same level.

BTree Find

Base Case:

If root is empty, return

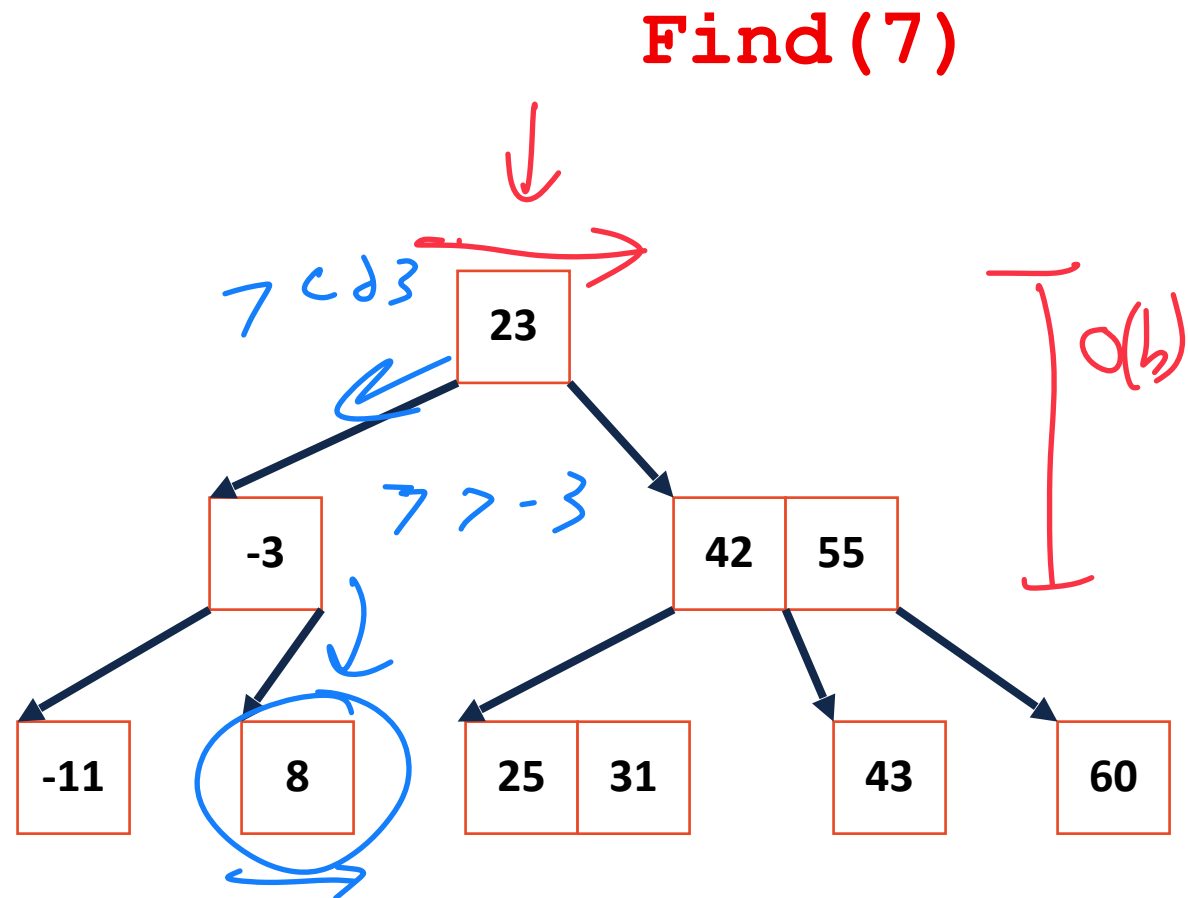
If leaf, do array find() and return

Recursive Step:

Array find() for match or first greater value

Recurse on appropriate child

Tip: Index of first greater value is index of child we want to visit!



BTree Insertion

sorted

M = 5

Given the appropriate BTreeNode, insert is array insert

Insert (1)

Insert (2)

Insert (3)

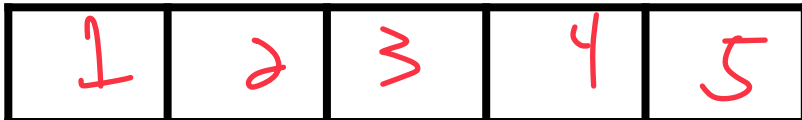
Insert (4)

Insert (5)

Insert (6)

Insert (7)

Insert (8)



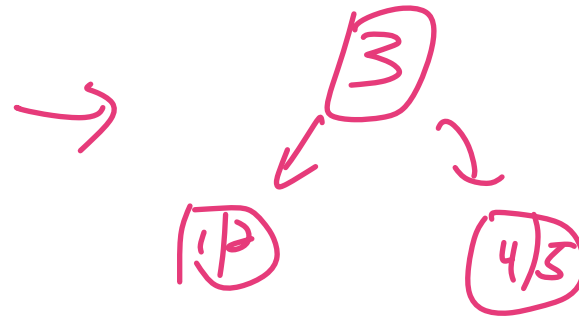
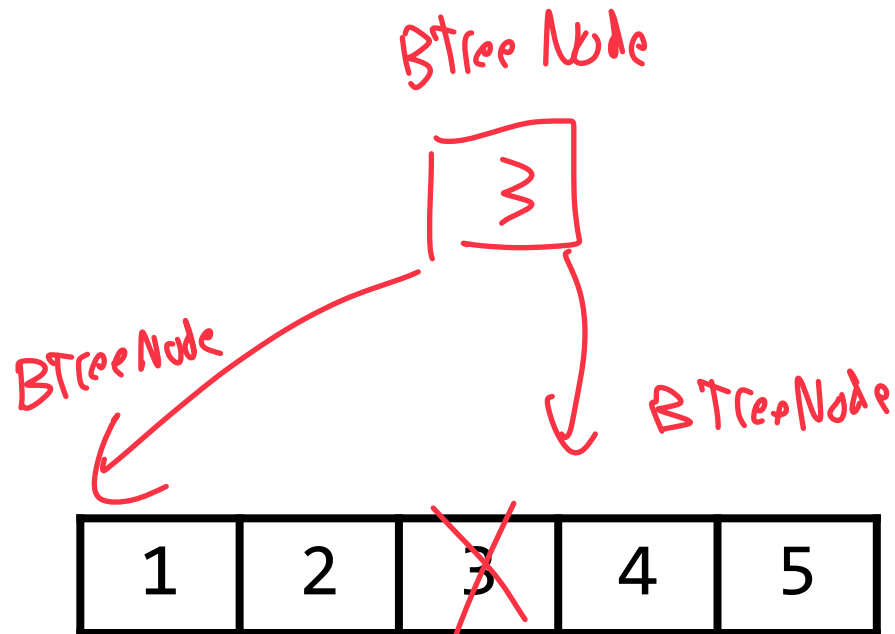
BTree Insertion

M = 5

When we hit **M** items, split into three nodes!

- 1) Find median
- 2) "Raise median up"

↳ Cut array in half
as 2 new BTree Nodes



Insert (1)

Insert (2)

Insert (3)

Insert (4)

Insert (5)

Insert (6)

Insert (7)

Insert (8)

M - 1 items
MAX

BTree Insertion

M = 5

“Given appropriate BTreeNode” == Find()

Insert (1)

Insert (2)

Insert (3)

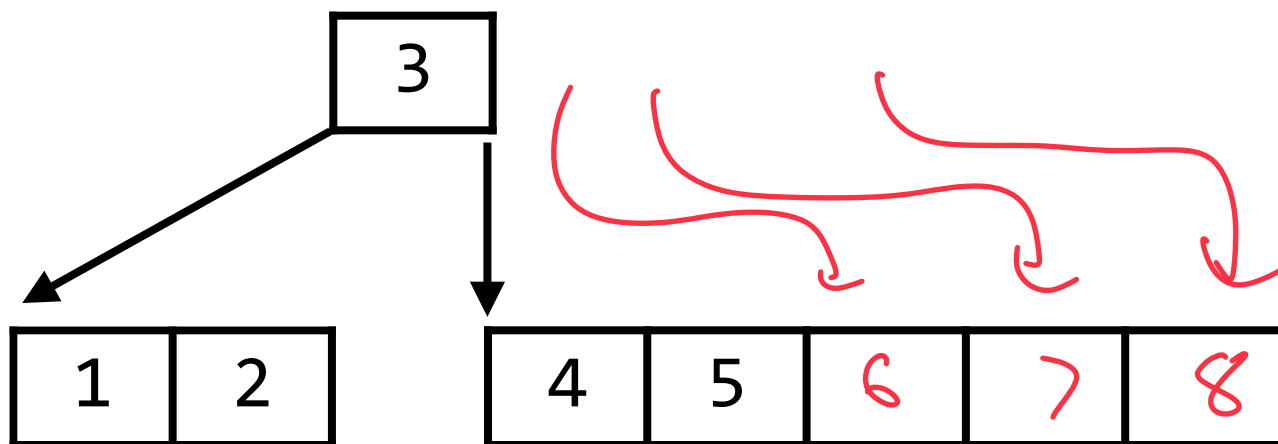
Insert (4)

Insert (5)

Insert (6)

Insert (7)

Insert (8)



BTree Insertion

M = 5

If parent node already exists, split adds new key.

Insert (1)

Insert (2)

Insert (3)

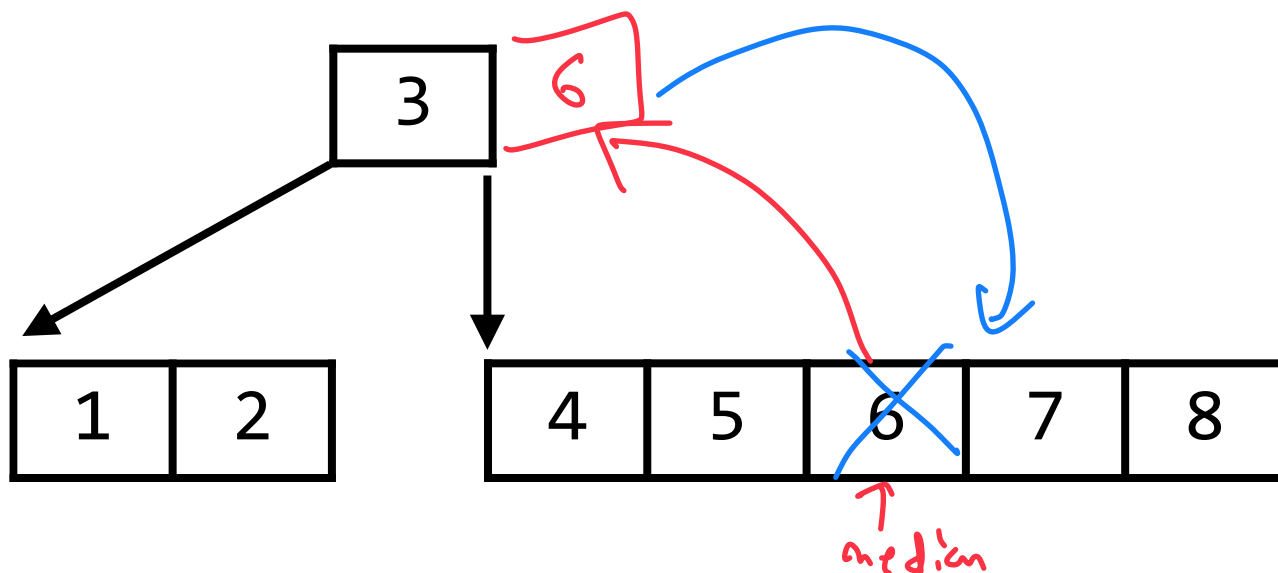
Insert (4)

Insert (5)

Insert (6)

Insert (7)

Insert (8)



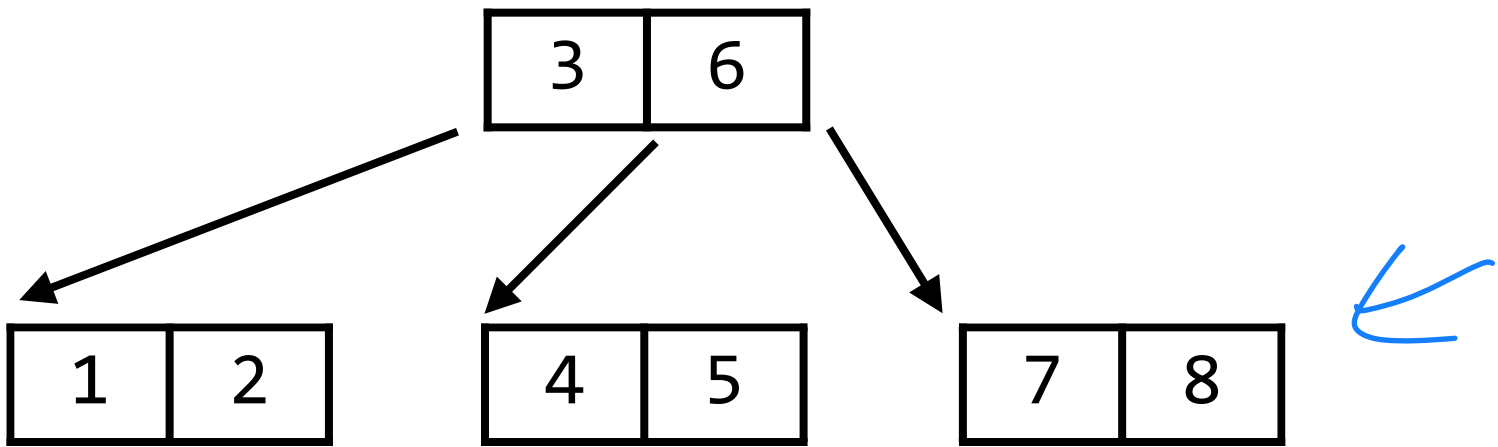
BTree Insertion

$$\text{Min \# Keys} = \lceil \frac{M}{2} \rceil$$

M = 5

If parent node already exists, split instead adds new key.

- Insert (1)
- Insert (2)
- Insert (3)
- Insert (4)
- Insert (5)
- Insert (6)
- Insert (7)
- Insert (8)



BTree Insertion

M = 5

Problem 3: I need to find median value AFTER inserting the **M**th value

10				
----	--	--	--	--

Insert (10)

5	10			
---	----	--	--	--

Insert (5)

...

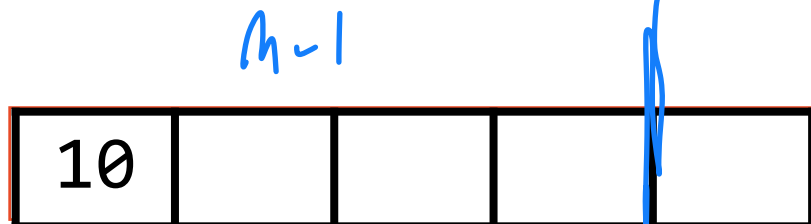
2	5	7	9	10
---	---	---	---	----

Insert (2)

BTree Insertion

M = 5

Problem 3: I need to find median value AFTER inserting the **M**th value



Insert (10)



Insert (5)

...



Insert (2)

Non-Optimal Solution: Pre-allocate **M** size arrays for every node!

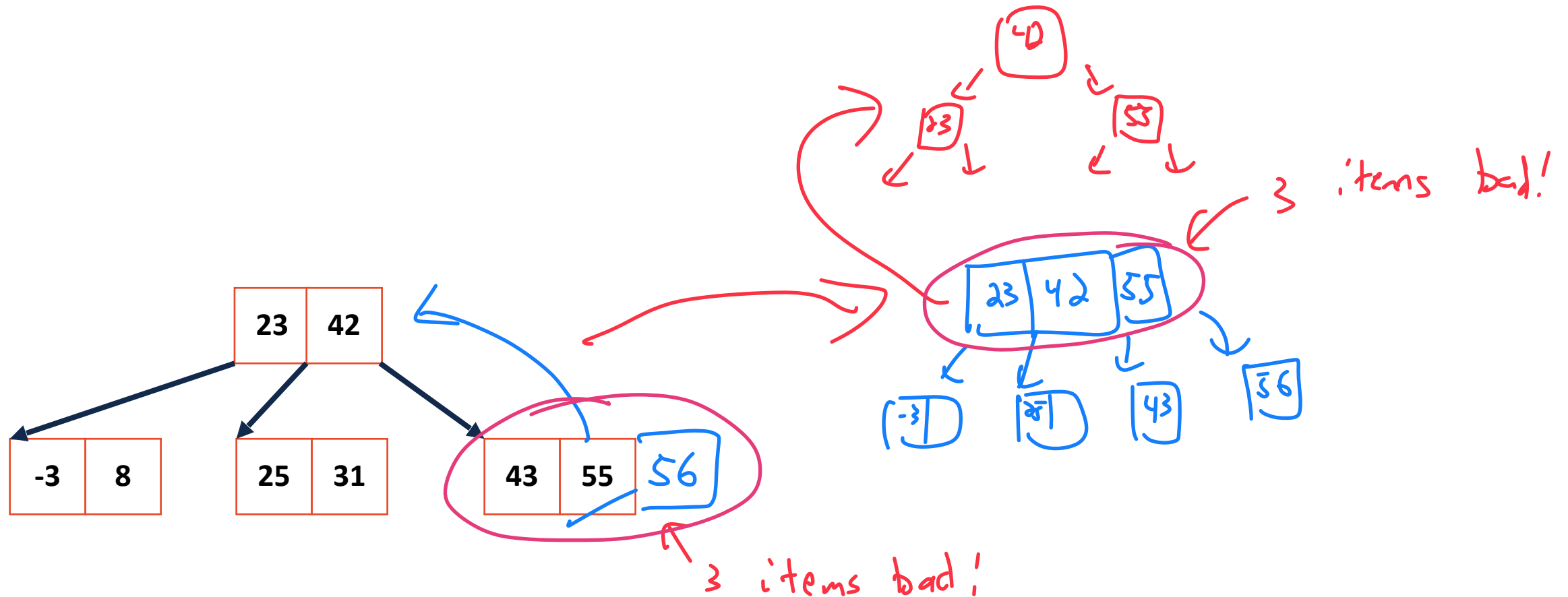
keys : n

BTree Recursive Insert

Insert (56), M = 3



Insert always starts at a leaf but can propagate up repeatedly.



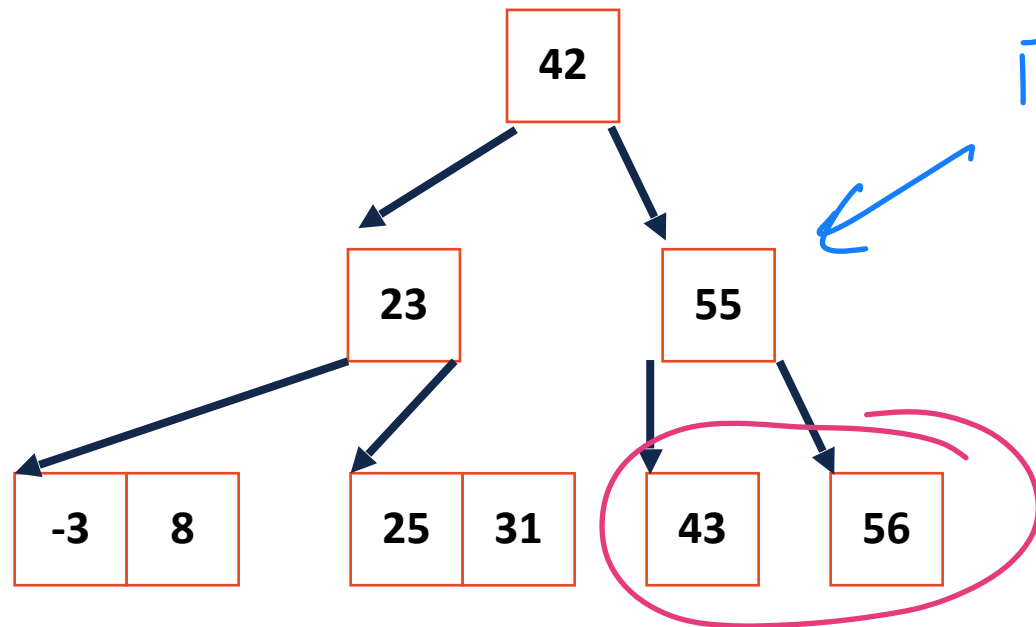
BTree Recursive Insert

Insert (56), M = 3



Insert always starts at a leaf but can propagate up repeatedly.

$\hookrightarrow O(h)$ times



$\lceil M \rceil$ children

was why this split up?

\hookrightarrow Enforce order

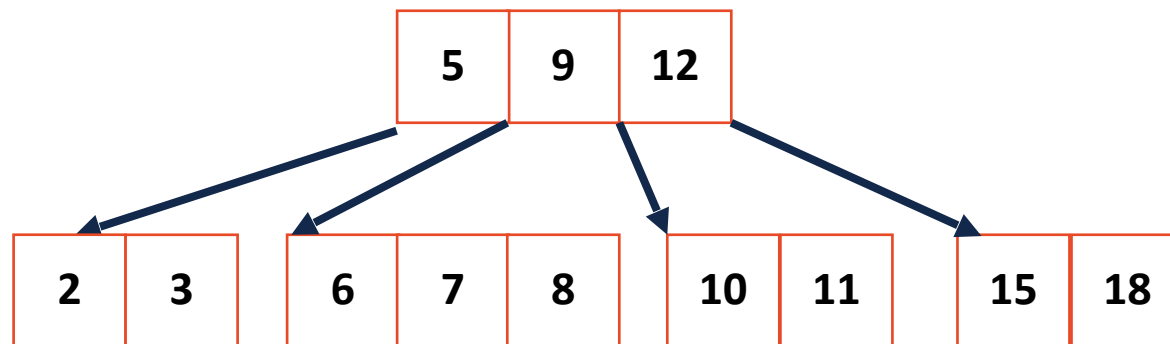
\hookrightarrow M tells us this is OK!

BTree Remove

BTree removal is complicated! **It won't be part of the lab.**

If we have time at the end of the day today we will discuss it

If —
If —
If —
If —



Boring?

BTree Node (of order m)

Network packet is ~1500 bytes
↳ Make sure most info is stored!

Brainstorm together: What value of **m** should we be using?

↳ We want efficient memory

↳ Load a node and have many (k,v) pairs

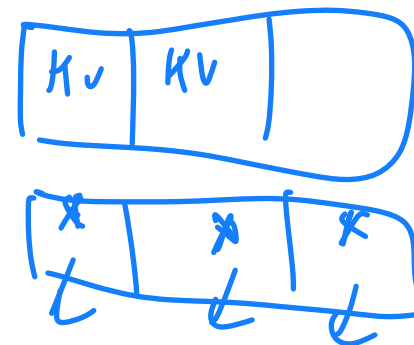
What is my memory size?

512 bytes in RAM

What is size of (k,v) pair

an int is 4 bytes

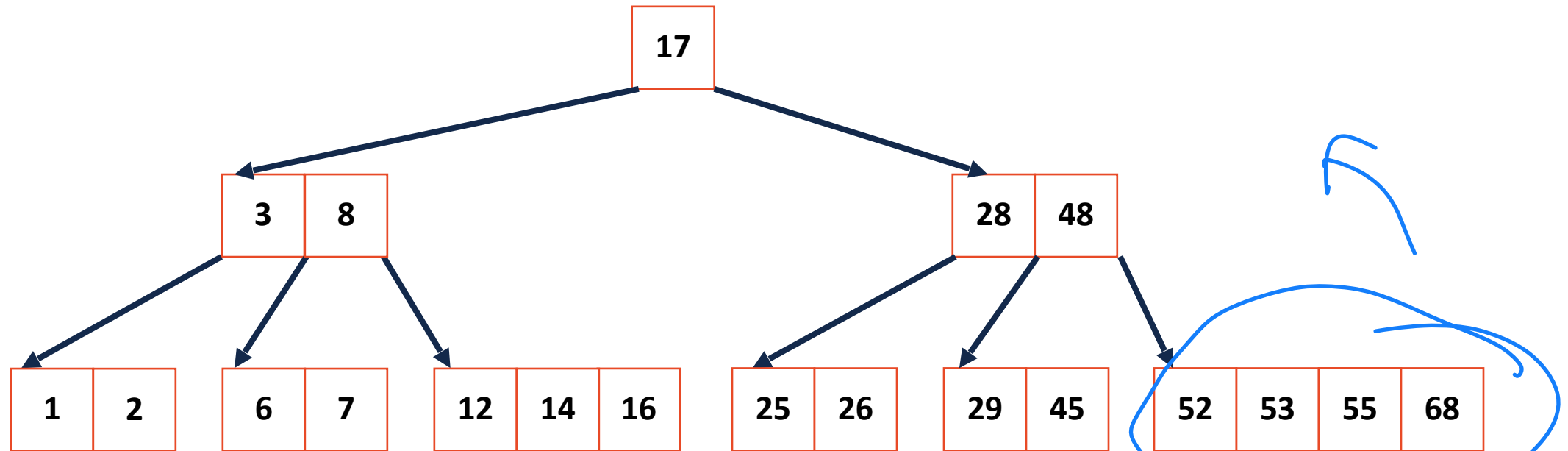
$512 / 4 = 128$ - pointer size is "ideal" M



BTree of Order M

If I tell you this is a valid BTree, what is the **lower bound** of M ?

5

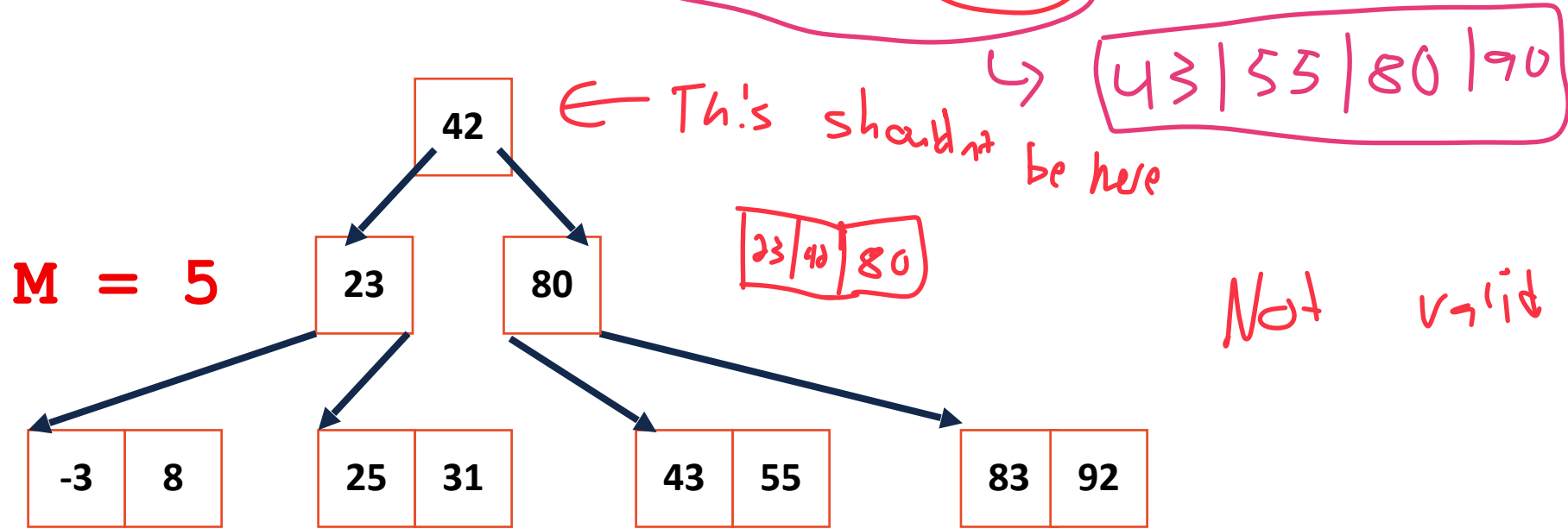
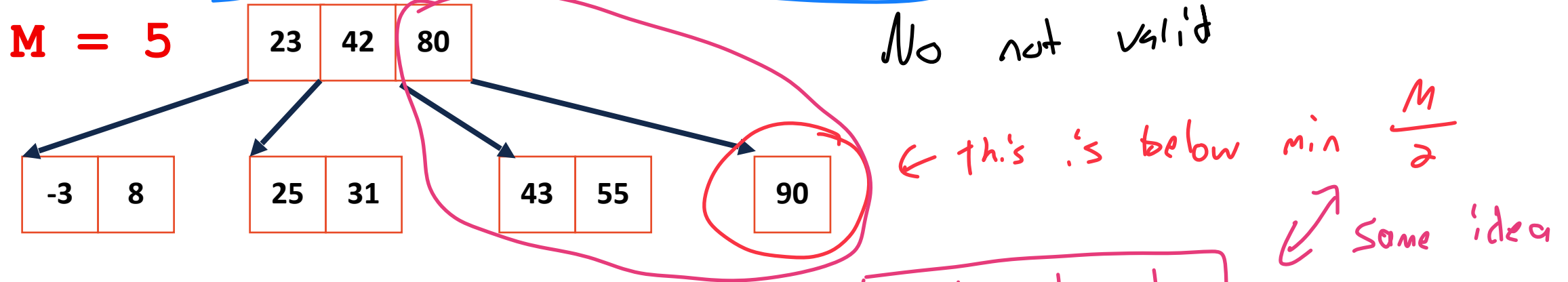


4 keys implies
 $M \leq 5$

BTree Size Restrictions

$m = \# \text{ children max}$
 $m-1$ is max keys

We have max on nodes, but do we have min? Are these trees valid?



BTree Properties

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**

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

$\rightarrow 0$ children

All non-root, internal nodes have $[\frac{m}{2}, m]$ children.

If $\frac{\text{int}(\frac{m}{2}) + 1$ is keys
is children

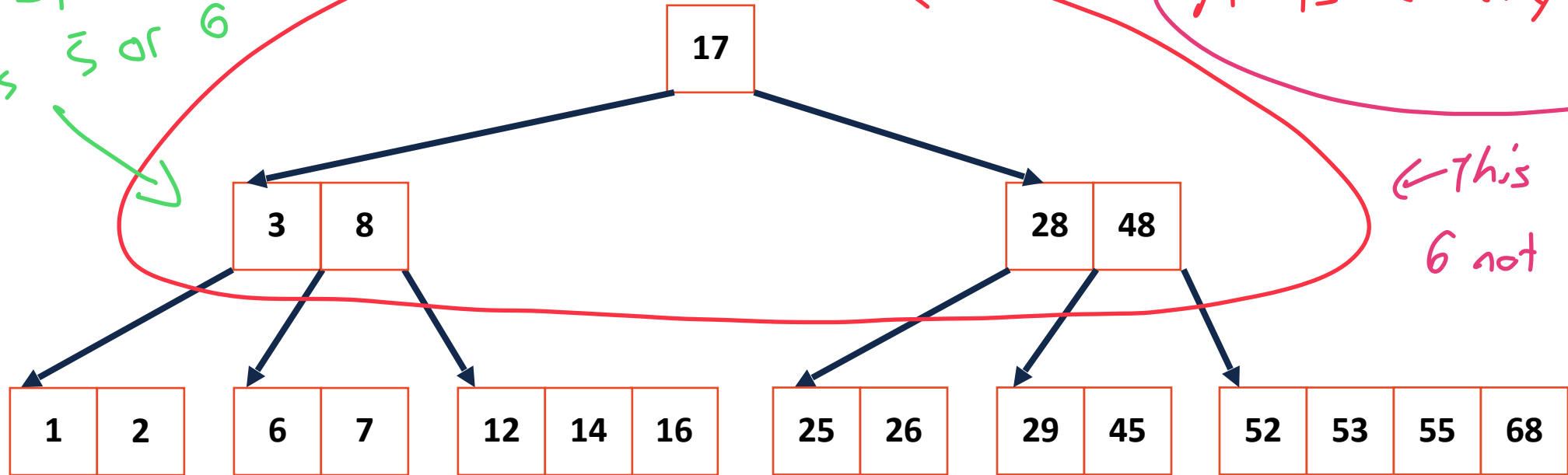
All leaves in the tree are at the same level.

BTree

$M=5$

If I tell you this is a valid BTree, what is the **precise value** of m ?

$\lceil M \rceil - 1$ tells us 5 or 6



M is exactly 5

← This says 6 not OK

If $M=6$, root is $[3 | 8 | 17 | 28 | 48]$

$m \leq 5$

BTree Analysis

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**).



BTree Analysis

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.

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

All internal nodes have $t = \lceil \frac{m}{2} \rceil$ children

Minimum number of **nodes** for a BTree of order m **at each level:**

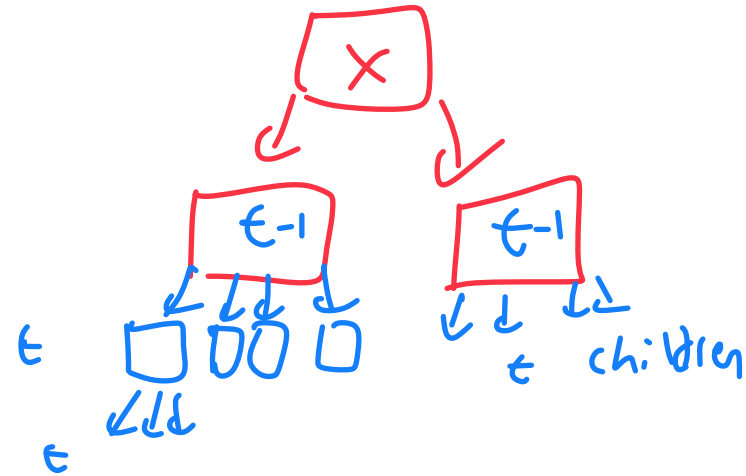
Root: 1

Level 1: 2

Level 2: $2t$

Level 3: $2t^2$

Level h: $2t^{h-1}$



BTree Analysis

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

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

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

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

Summation identity

BTree Analysis

The **min total number of nodes:**

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

Handwritten annotations: "root" points to the 1; "internal & leaf nodes" is written above the fraction; $t = \lceil \frac{m}{2} \rceil$ is written to the right.

The **min total number of keys:**

Root: 1 key / 1 node

Min # keys in internal: $\lceil \frac{m}{2} \rceil - 1 = t - 1$

keys in a leaf: $\lceil \frac{m}{2} \rceil - 1 = t - 1$

every internal & every leaf have min $t - 1$

BTree Analysis

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

The **min total number of nodes:**

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

The **min total number of keys:**

Root has how many keys? **1**

Internal nodes? $\left\lceil \frac{m}{2} \right\rceil - 1 = t - 1$

Leaf nodes? $\left\lceil \frac{m}{2} \right\rceil - 1 = t - 1$

$$= 1 + 2 \frac{t^h - 1}{t - 1} * (t - 1)$$

$$= 2t^h - 1$$

So we can multiply the fraction by $t - 1$

BTree Analysis

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

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

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


$$n \geq 2t^h - 1$$

$$n + 1 \geq 2t^h$$

$$\log_m(n + 1) \geq \log_m \left(2 \left\lceil \frac{m}{2} \right\rceil \right)^h$$

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

BTree Analysis

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


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

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

$$n \geq 2t^h - 1$$

$$n + 1 \geq 2t^h$$

Ignore ceil & drop constants

$$\log_m (n + 1) \geq \log_m \left(2 \left\lceil \frac{m}{2} \right\rceil^h \right) = \log_m (m^h) = h$$

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

$$h = O(\log_m n)$$

BTree Analysis

This is very powerful!

As long as I am *at least* minimally sized, we are $O(\log_m n)$!

BTree Analysis

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

Minimum Keys:

Maximum Keys:

BTree

The BTree is still used heavily today!

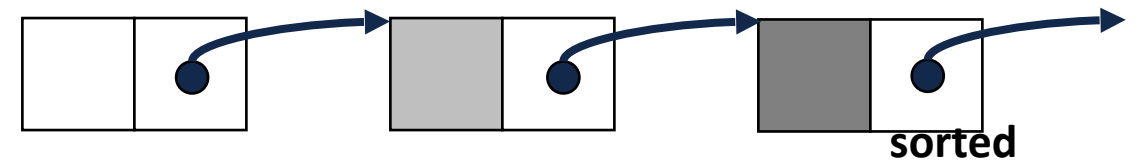
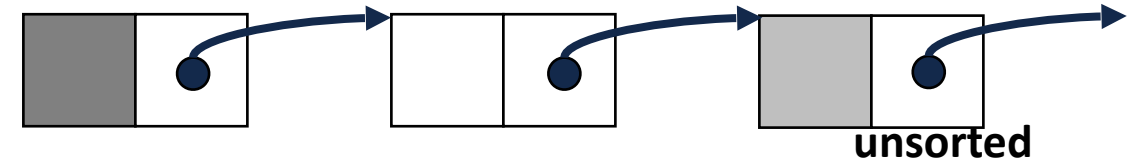
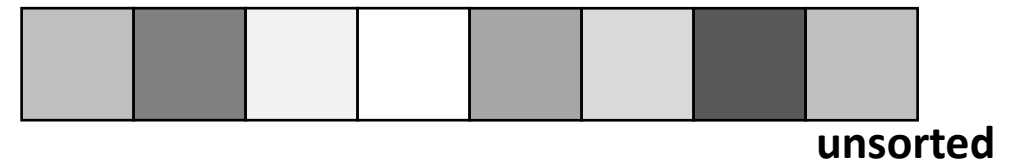
Improvements such as B+Tree and B*Tree exist far outside class scope

Thinking conceptually: Sorting a queue

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

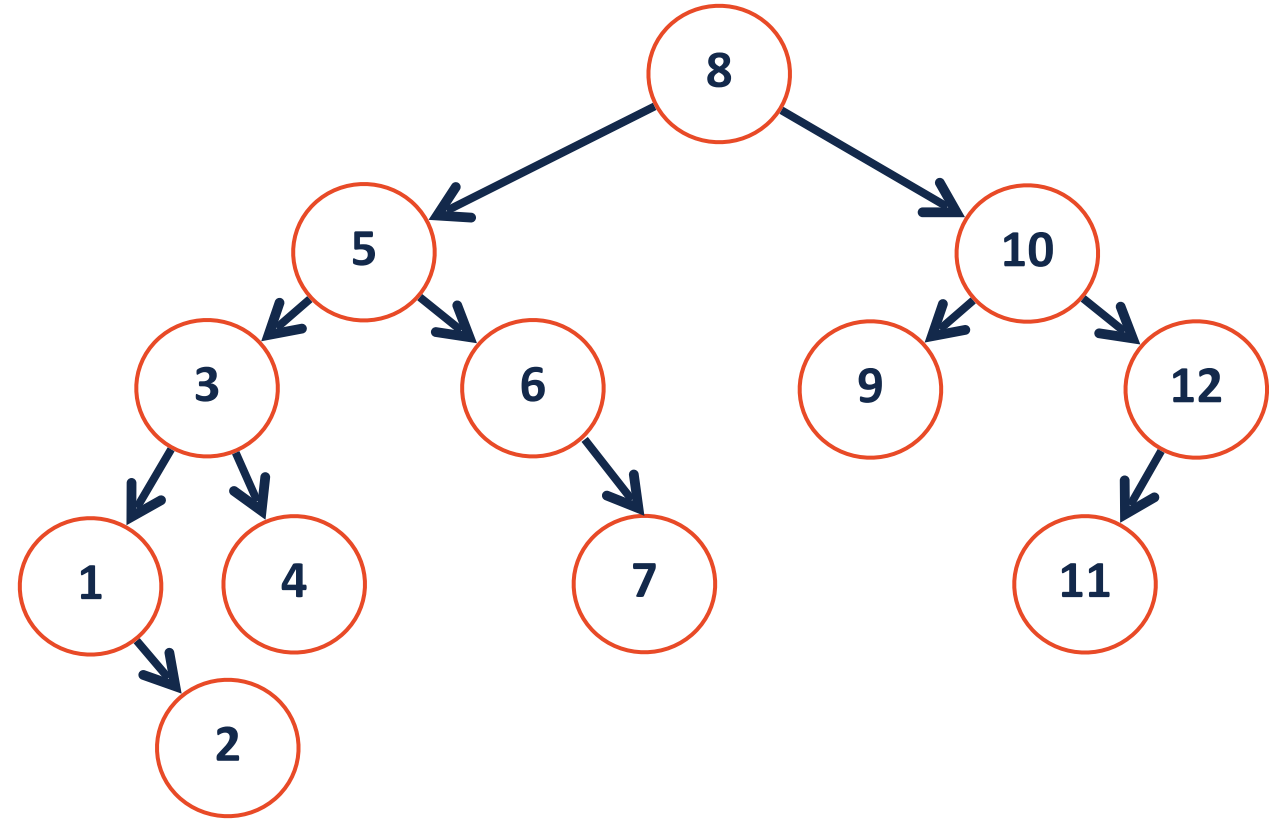
Priority Queue Implementation

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



Priority Queue Implementation

insert	removeMin



Thinking conceptually: A tree without pointers

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