

# Data Structures

## BTree

CS 225

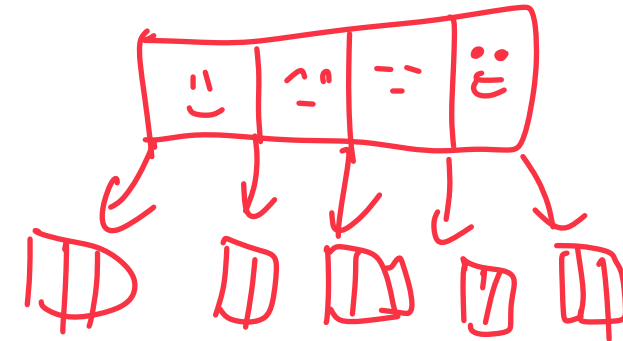
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# Classify: New & Improved Course Explorer

## Key Features:

- Average GPA for each course
- Professor on a class page links to Rate My Professor
- Class locations on a class page linked to Google Maps
- Page that ranks Gen-Eds in a category by average GPA
- UI Improvements over old course explorer
- More features in development

## Find Us:

- @ClassifyUIUC on Twitter & Instagram
- Visit: <https://classify-x.vercel.app/>

# Feedback Survey EC

MP\_stickers: ~74% participation (Great work!) <sup>+ 2</sup>

MP\_lists: ~48% participation (Still time to get those points)

IEF: ~55% participation (Oh no! Deadline 10/14!) <sup>← \*</sup>

**Surveys are important! Please do them and get points!**

→ + 8 points

# Exam FRQ Regrade Requests

For now: Email [cs225admin@lists.cs.illinois.edu](mailto:cs225admin@lists.cs.illinois.edu)

Include 'Regrade Request' and Exam number in subject

Write a clear explanation for why you disagree with grade

Exam 1 regrade request deadline: 10/21/24

Exam 2 regrade request deadline: TBD



# Learning Objectives

Remind ourselves one (engineering) issue with trees

Introduce (and implement) the B Tree!



# Summary of Balanced BST

## Pros:

$O(\log N)$  for insert, find, remove

Optimal range queries in 1D

↳ Nearest neighbor (KD tree)

## Cons:














$O(\log N)$  isn't that great

**Large in-memory requirement**

↳

# Engineering vs Theory Efficiency

Fast  
Small  
Memory

	Time x1 billion	Like
L1 cache reference	0.5 seconds	Heartbeat 
Branch mispredict	5 seconds	Yawn 
L2 cache reference	7 seconds	Long yawn   
Mutex lock/unlock	25 seconds	Make coffee 
Main memory reference	100 seconds	Brush teeth
Compress 1K bytes	50 minutes	TV show 
Send 2K bytes over 1 Gbps network	5.5 hours	(Brief) Night's sleep 
SSD random read	1.7 days	Weekend
Read 1 MB sequentially from memory	2.9 days	Long weekend
Read 1 MB sequentially from SSD	11.6 days	2 weeks for delivery 
Disk seek	16.5 weeks	Semester
Read 1 MB sequentially from disk	7.8 months	Human gestation 
Above two together	1 year	 
Send packet CA->Netherlands->CA	4.8 years	Ph.D. 

Slow  
Large  
Memory

(Care of <https://gist.github.com/hellerbarde/2843375>)

# Engineering vs Theory Efficiency

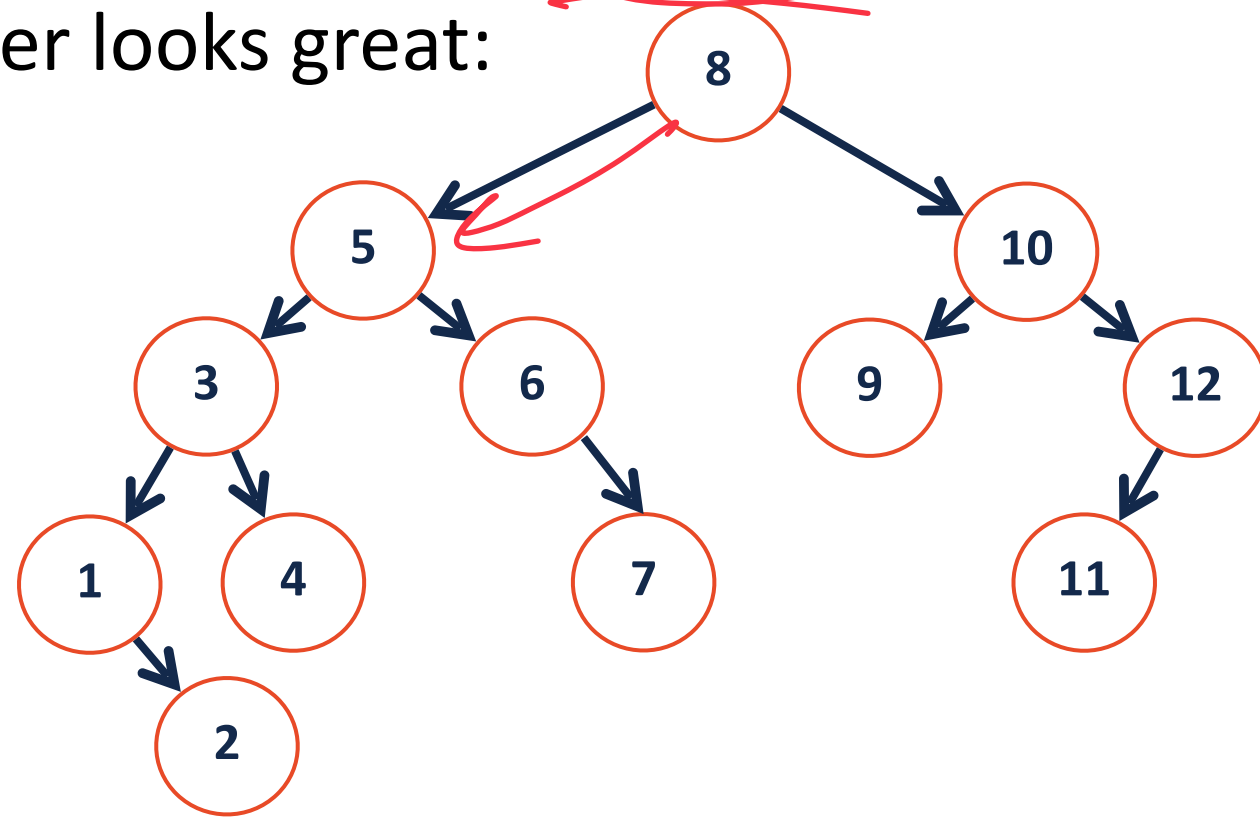
In Big-O we have assumed uniform time for all operations, but this isn't always true.

Ex: 512/4 ints in one key ↓

Cache: 0.0001 ms ↻

However, seeking data from the cloud may take 40ms+.

...an  $O(\lg(n))$  AVL tree no longer looks great:





# Considering hardware limitations

Can we always fit our data in main memory? → RAM

↳ No!

Where else can we keep our data?

↳ swap space available ↖

↳ External hard drive ↗

↳ file cloud ↖

↳ on disk ↖

↳ Many places

Very Bad

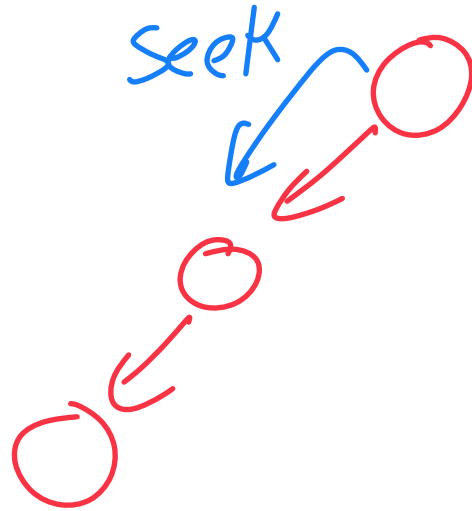
Does this match our assumption that all memory lookups are  $O(1)$ ?

↳ No!

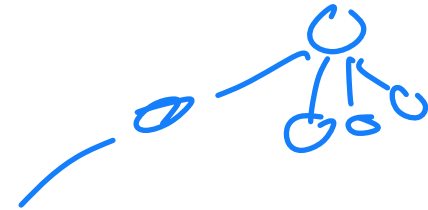
# BTree Design Motivations

When large seek times become an issue, we address this by:

1) Keep the number of seeks low



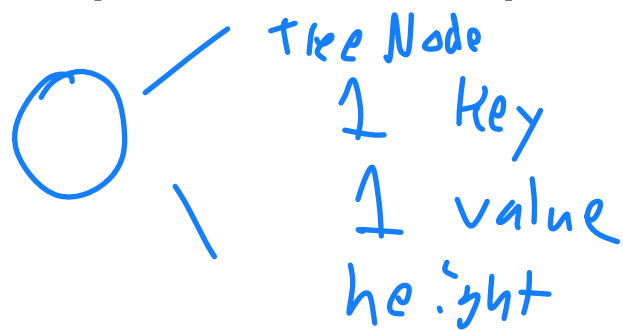
↳ Keep height low



# BTree Design Motivations

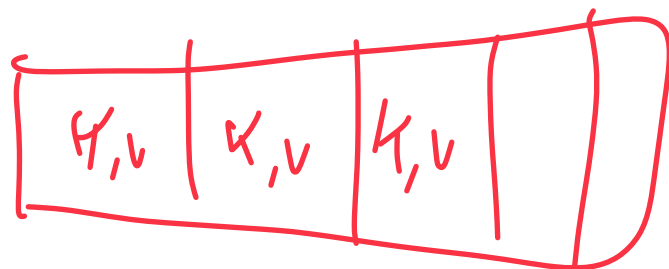
When large seek times become an issue, we address this by:

2) When possible keep data stored locally



left & right

why not multiple  
K, V pairs?



☺

# BTree Design Motivations

When large seek times become an issue, we address this by:

3) Make sure the data we look up is relevant!

↳ sorted or had some order

# BTree Design Motivations



When large seek times become an issue, we address this by:

- 1) Keep the number of seeks low
- 2) When possible keep data stored locally
- 3) Make sure the data we look up is relevant!

# BTree Design Motivations

1) Keep the number of seeks low

Make a tree that is wide and short by... *having more than 2 children*

2) When possible keep data stored locally

Store more than one key in each node 

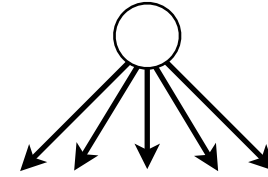
3) Make sure the data we look up is relevant!

Make sure our tree is still ordered 

# BTree

A BTree (of order  $m$ ) is a  $m$ -ary tree

each node have  
up to  $m$   
children



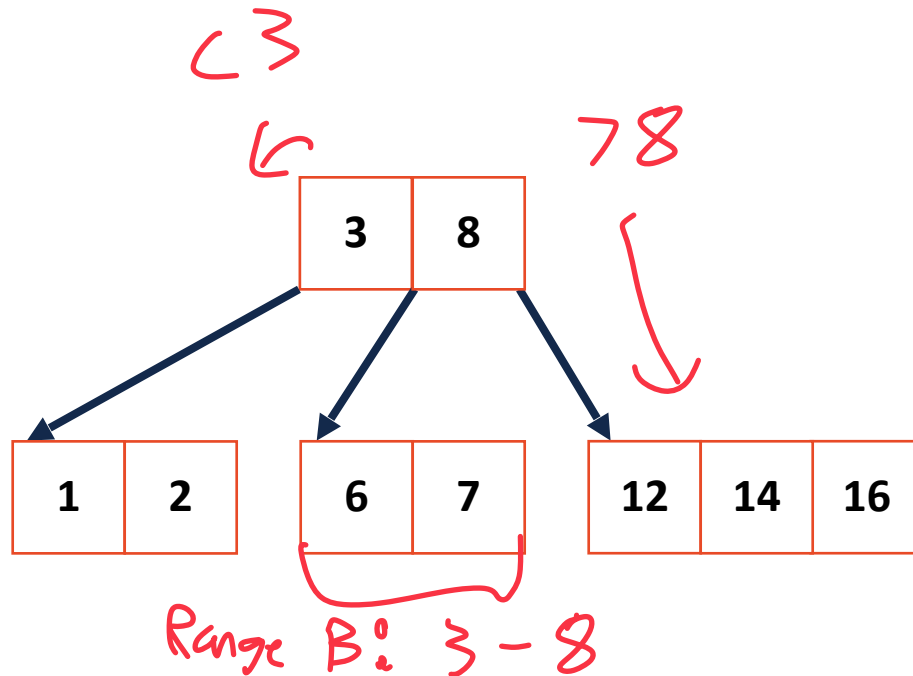
# BTree

A BTree (of order  $m$ ) is a  $m$ -ary tree

Nodes contain up to  $m-1$  keys

An internal node of  $k$  keys has  $k+1$  children

up to  
( $m$ )



$m = 5$

↳ implies up to 5 children



# BTree

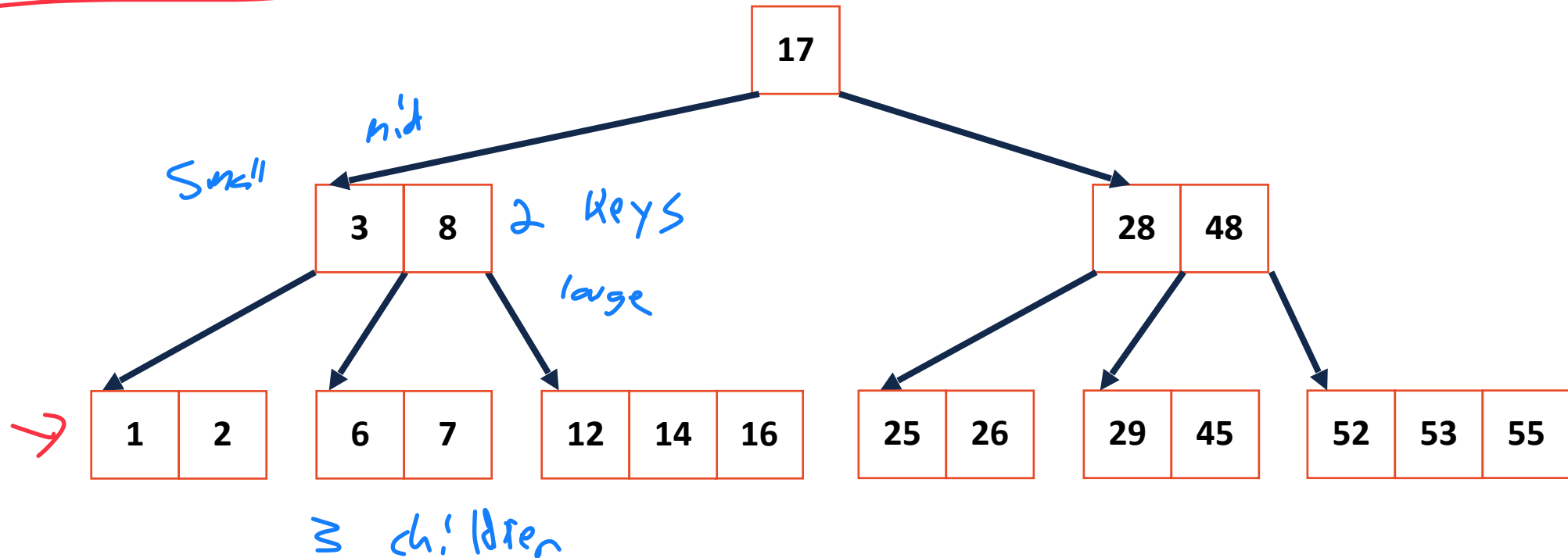
$m = \# \text{ of children}$



A BTree (of order  $m$ ) is a  $m$ -ary tree

Nodes are ordered with up to  $m-1$  keys and  $|\mathbf{keys}|+1$  children

All leaves in a BTree are on the same level



# BTree ADT

Constructor

Insert

Find

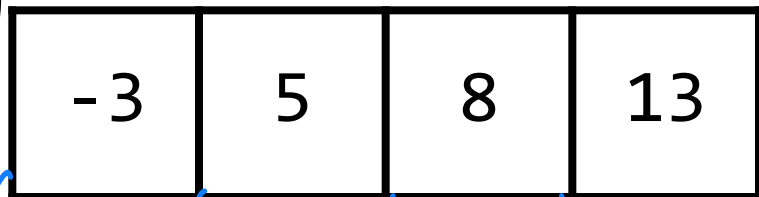
Delete

how does it work?

# BTree Node (of order m)

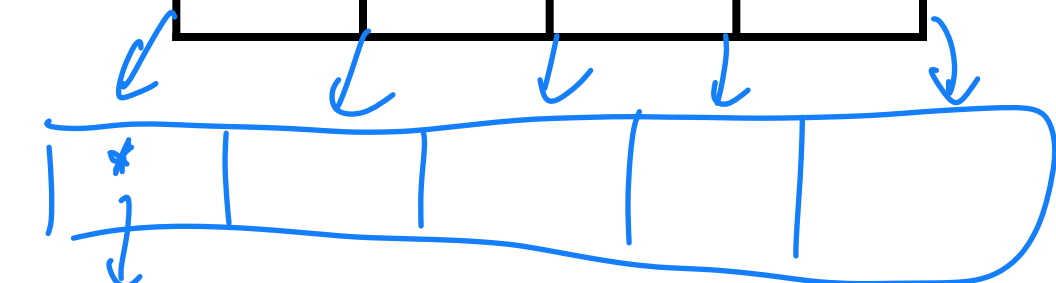
$M \geq 5$

elements (MP to  $M-1$ )



```
1 struct BTreeNode {  
2     std::vector<DataPair> elements;  
3     std::vector<BTreeNode*> children;  
4 };
```

$K, V$



children (up to  $M$ )

Tree Node pointers



These are pointers

Is  $m=5$  blk array has 5 spaces?

$M-1$  keys,  $M$  children

# BTree Find

Find(12)

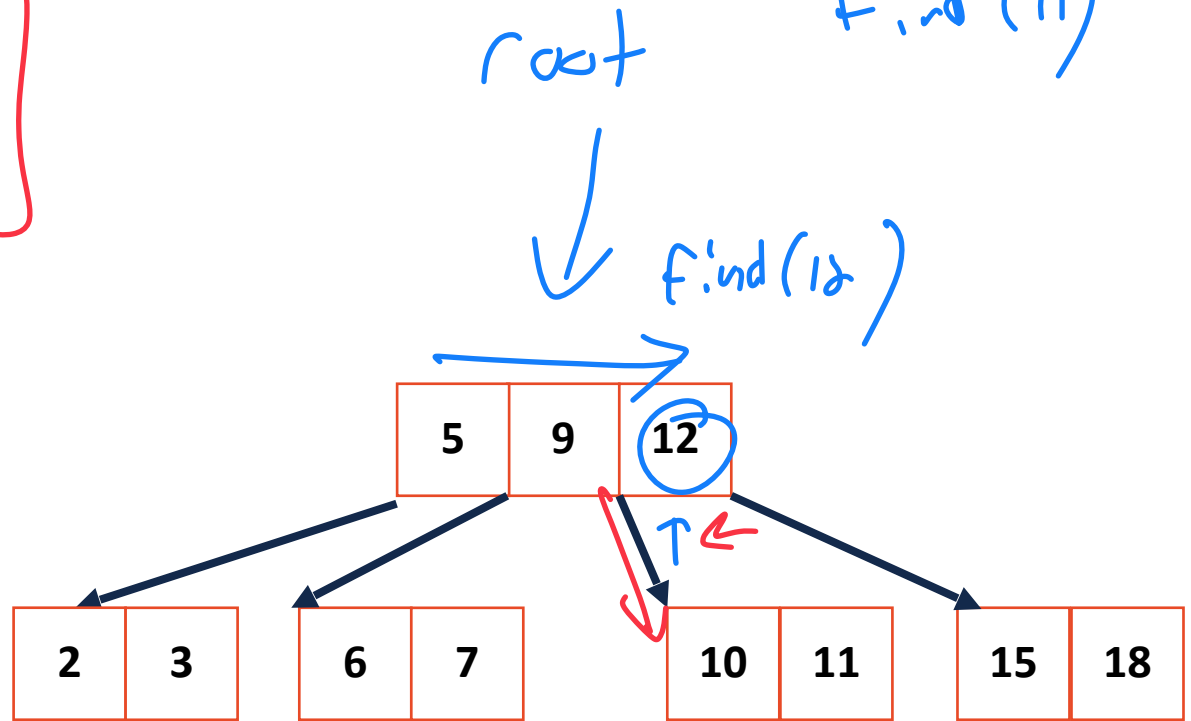
Find(11)

- 1) Use array find() [stop at first larger item]
  - ↳ If match, done!
  - ↳ If not

↳ Reuse to appropriate child

What is index of first larger?

What is index of child I visit?



2 ↘ Next trick!

# BTree Find

Find(7)

Base Case:

If root is empty, return

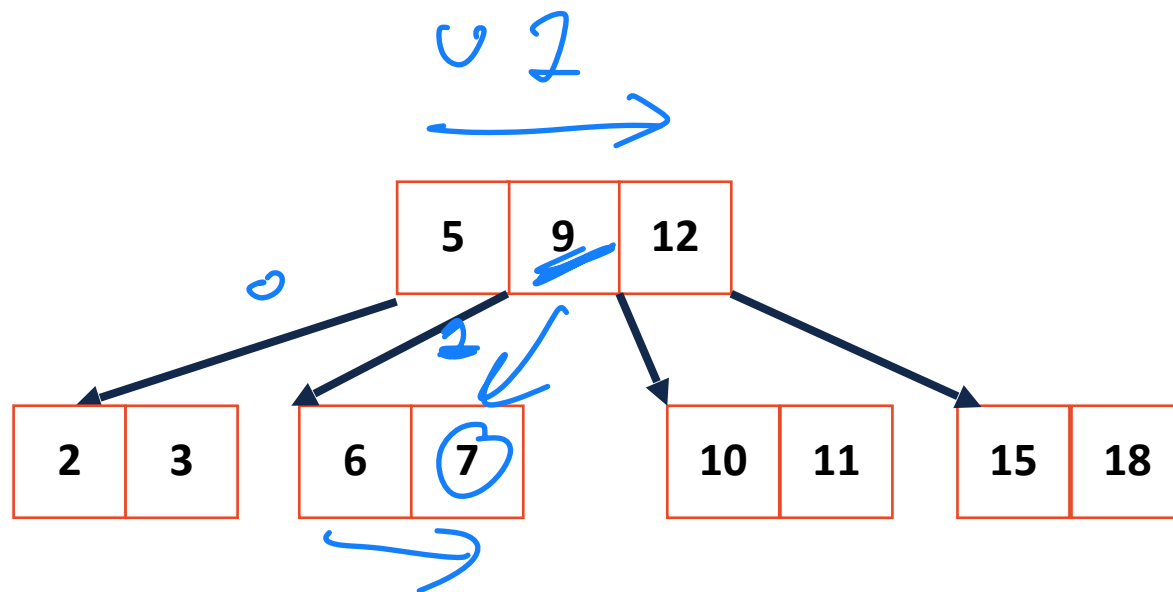
If leaf, do array find() and return

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 Find

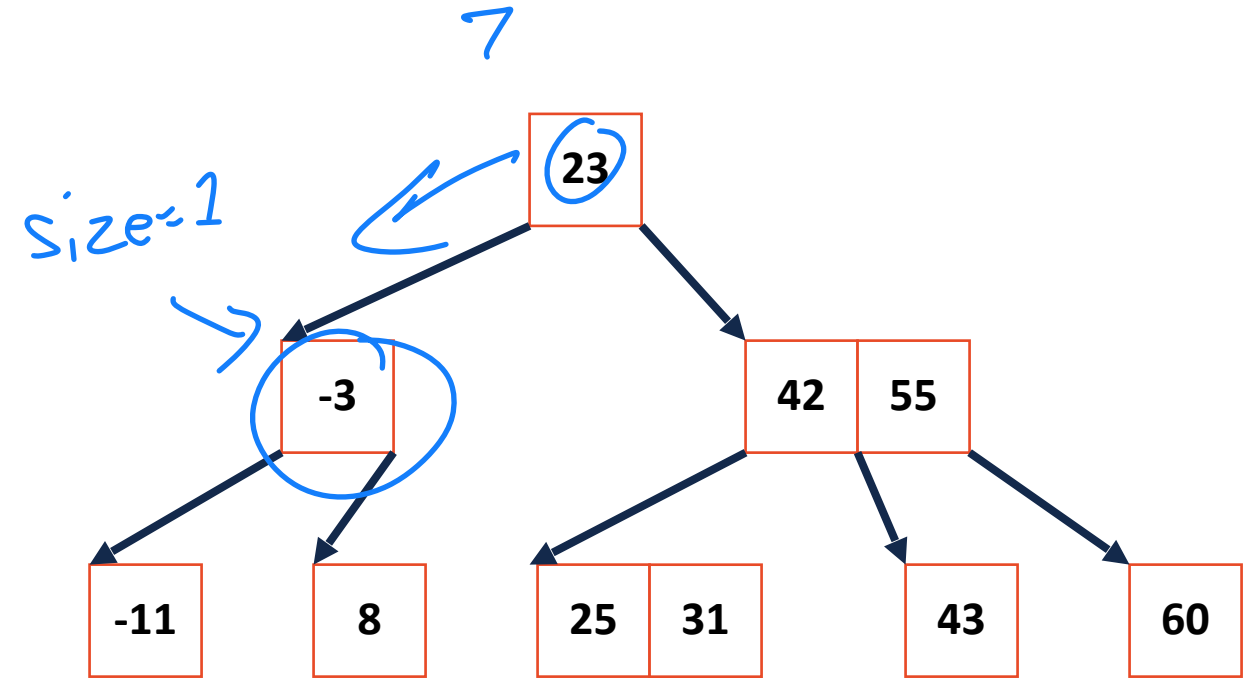
Note edge case! NO larger value **Find(7)**



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 \*

$O(m) \times \text{Nodes}$   
this is constant!  $\rightarrow O(\log n)$   
B's 0?

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

# BTree Insertion

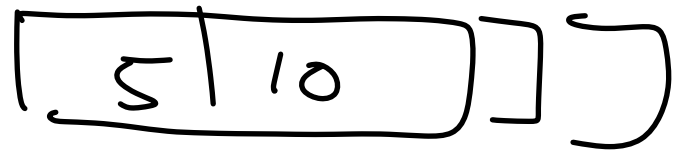
M = 5

Given an empty BTree, we make a new root node which has...

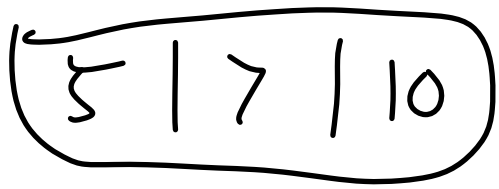


**Insert (10)**

↳ an empty vector



Insert (5)



Insert (7)

o d o

# BTree Insertion

M = 5

Chain insertions fill our array in sorted order

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

Insert (10)

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

Insert (5)

5	7	10		
---	---	----	--	--

Insert (7)

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

Insert (9)

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

Insert (2)



# BTree Insertion

M = 5

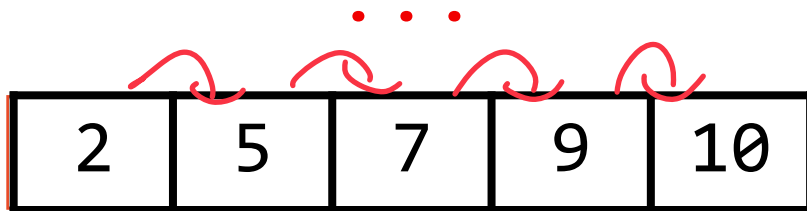
**Problem 1:** Sorted array insert is slow!



Insert (10)



Insert (5)



Insert (2)

# BTree Insertion

M = 5

**Problem 1:** Sorted array insert is slow!



Insert (10)



Insert (5)

...



Insert (2)

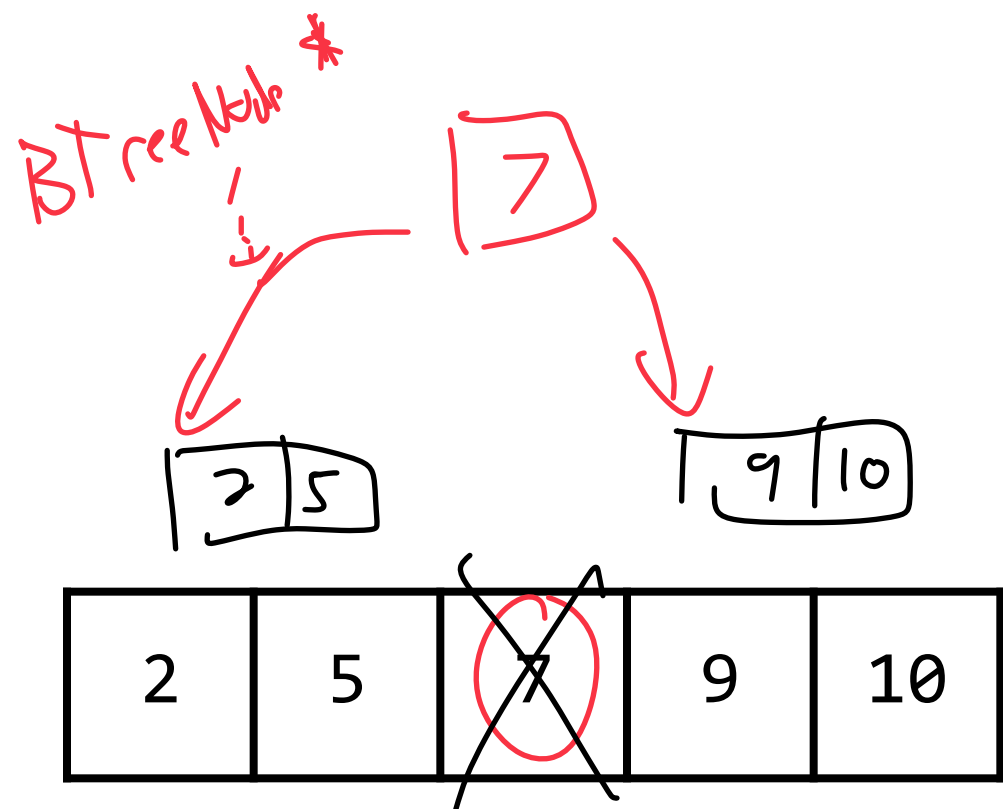
**Solution:** M is a constant! (So no its not)

# BTree Insertion

M = 5

**Problem 2:** A BTree of order **M** can only store **M-1** keys!

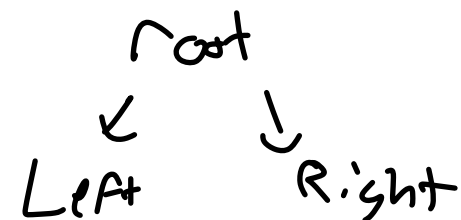
When a BTree node reaches **M** keys, what do we do?



1) Find median value

2) Pop median ↑

↳ Turn one node into 3

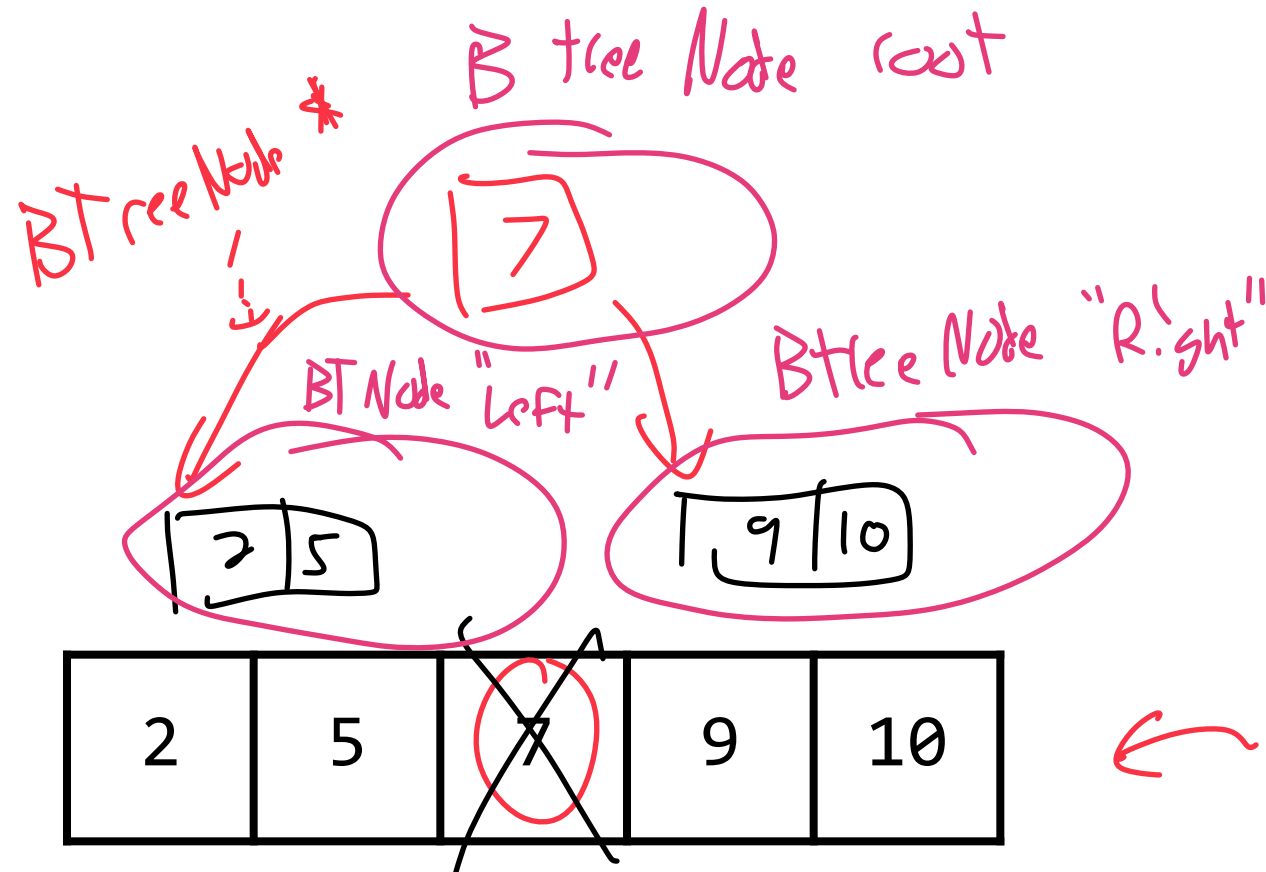


# BTree Insertion

M = 5

**Problem 2:** A BTree of order **M** can only store **M-1** keys!

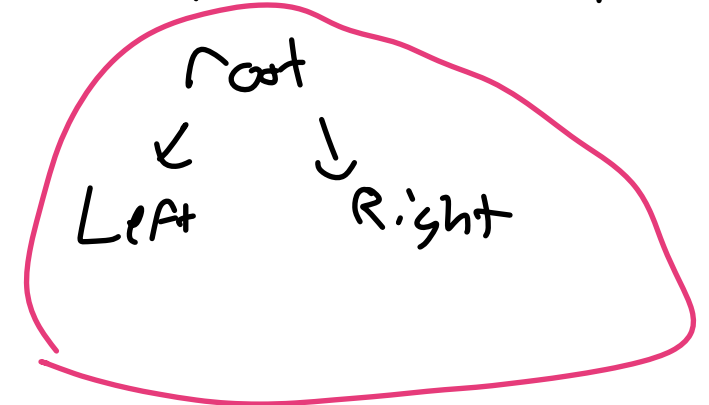
When a BTree node reaches **M** keys, what do we do?



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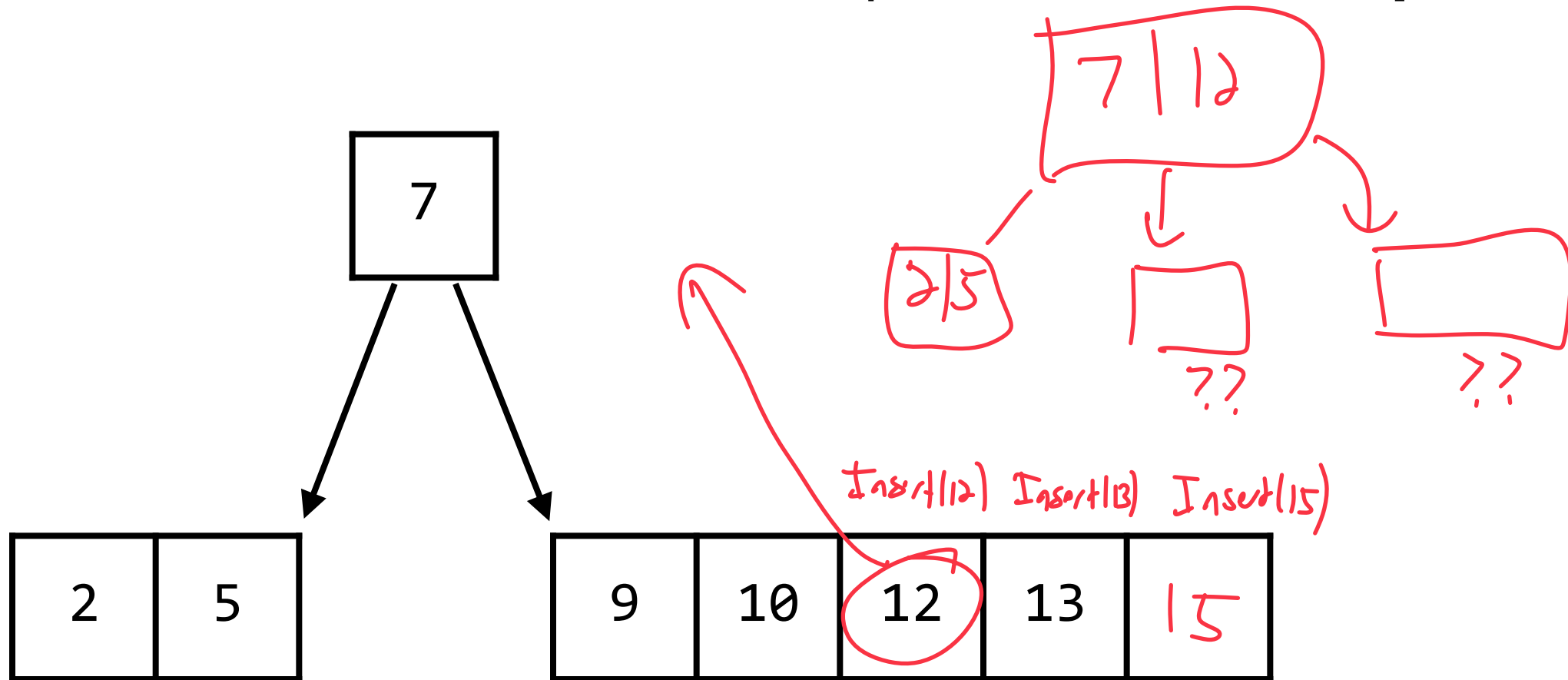


# BTree Insertion

**M = 5**

**Problem 2:** A BTree of order **M** can only store **M-1** keys!

**Solution:** When we hit **M** items, split and make a new **parent node**!

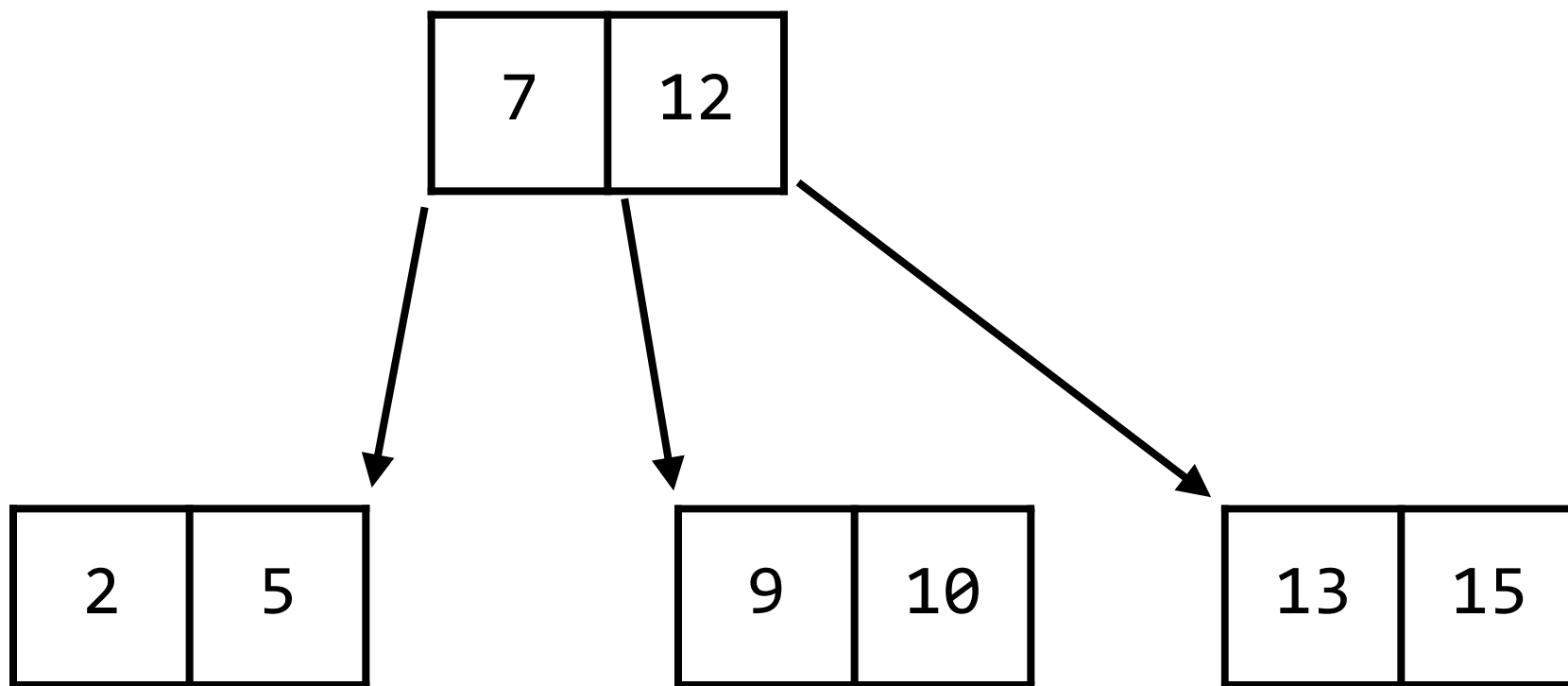


# BTree Insertion

**M = 5**

**Problem 2:** A BTree of order **M** can only store **M-1** keys!

**Solution:** When we hit **M** items, split and make a new **parent node**!



# BTree Insertion

**M = 5**

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



**Insert (10)**



**Insert (5)**

...



**Insert (2)**

# 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)**

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

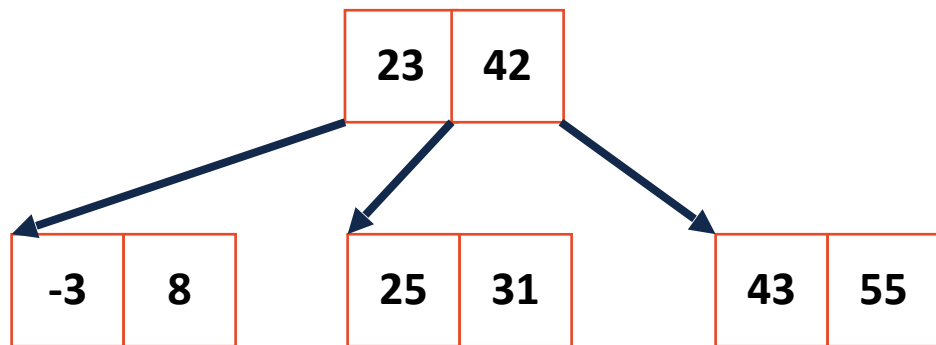


# BTree Recursive Insert

Insert (56) , M = 3



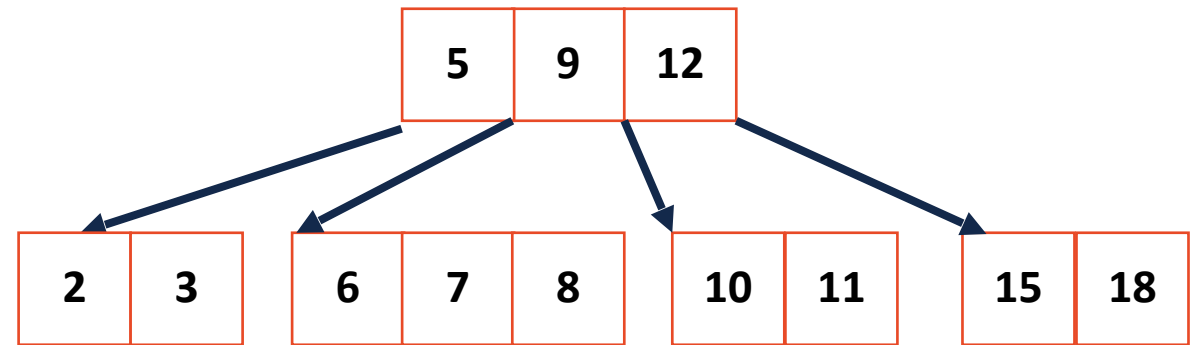
Insert always starts at a leaf but can propagate up repeatedly.



# BTree Remove

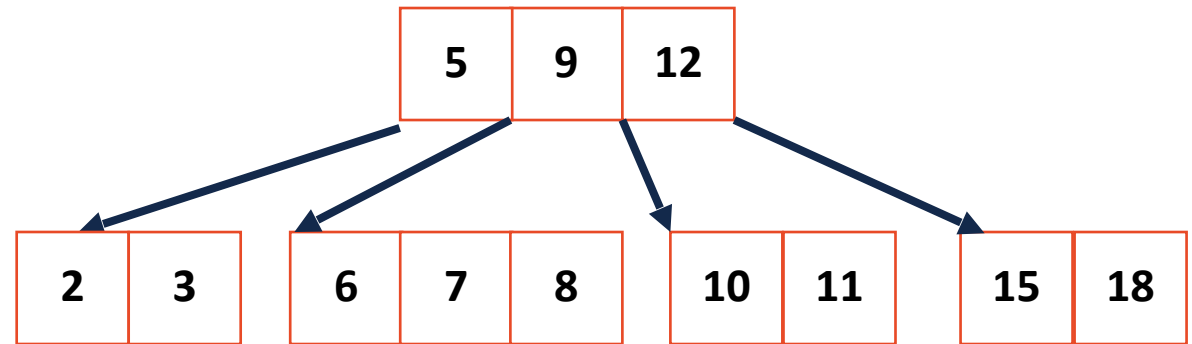
BTree removal is complicated! **It won't be part of the lab.**

However lets consider how we would handle the following cases...



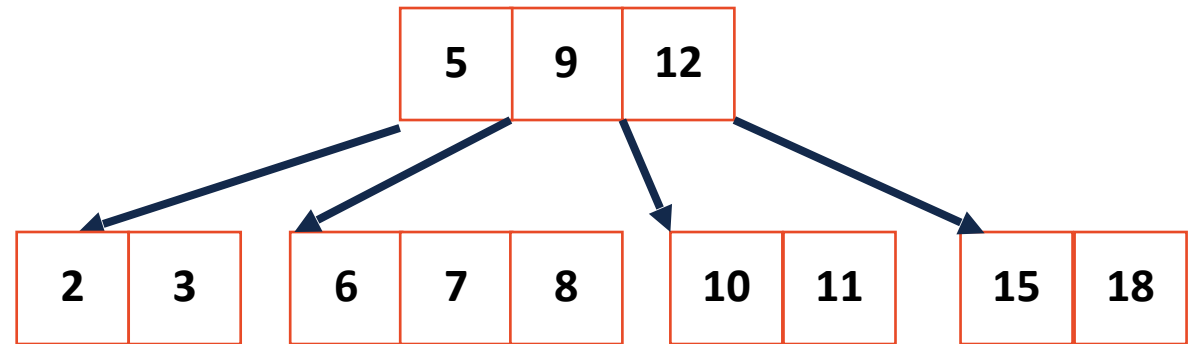
# BTree Remove

Remove (8)



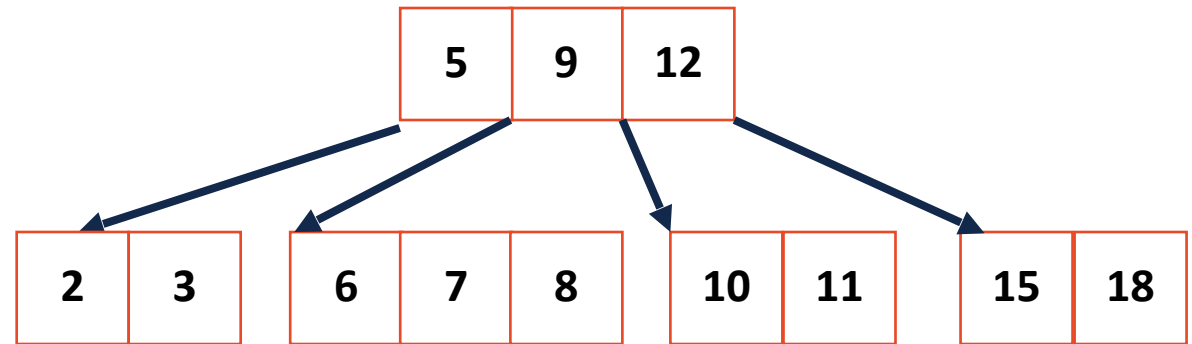
# BTree Remove

Remove (2)



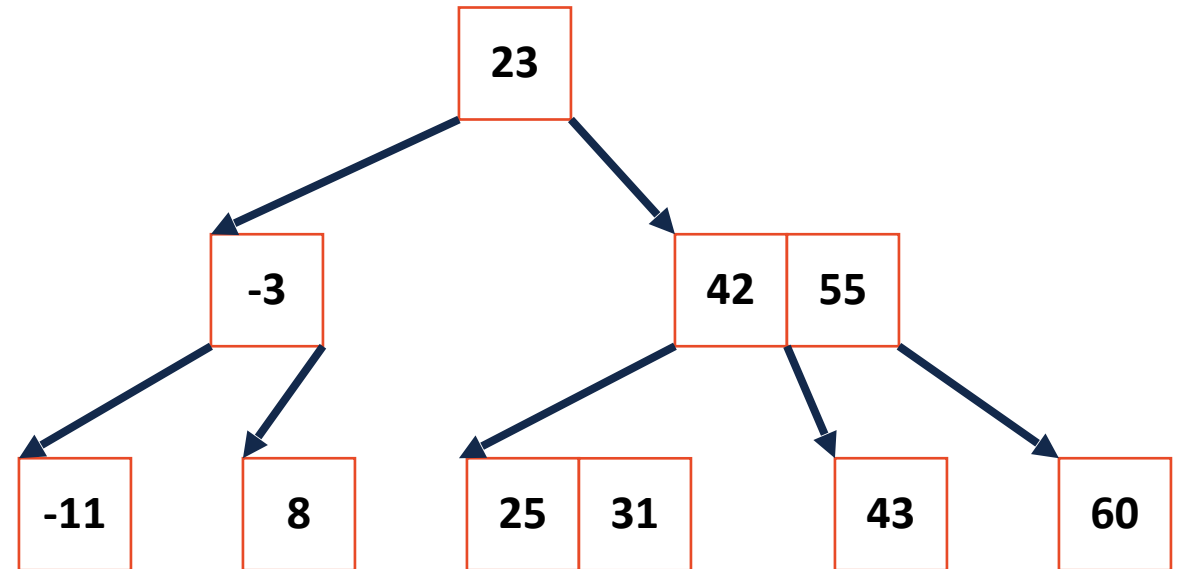
# BTree Remove

Remove (15)



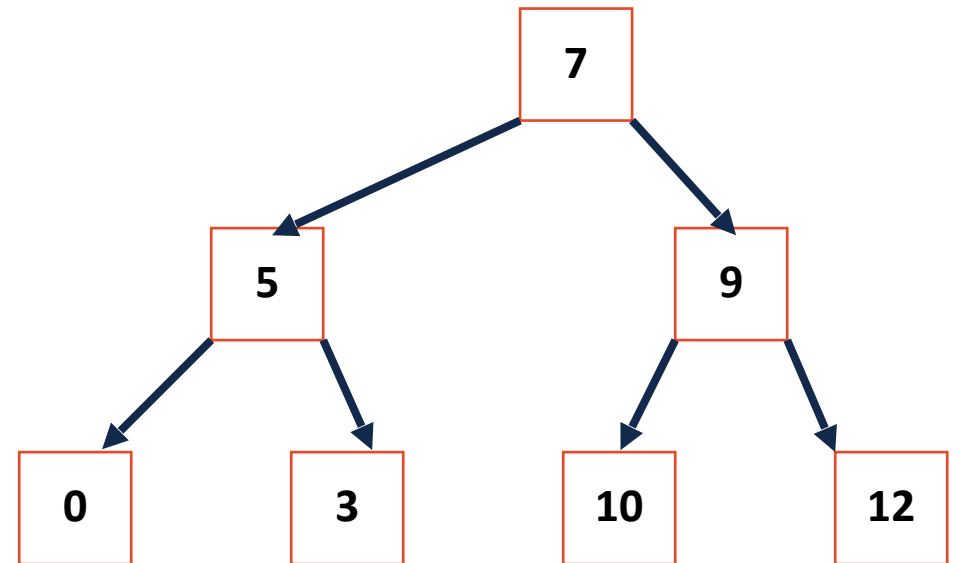
# BTree Remove

Remove (42)



# BTree Remove

Remove (5)



# BTree Visualization/Tool

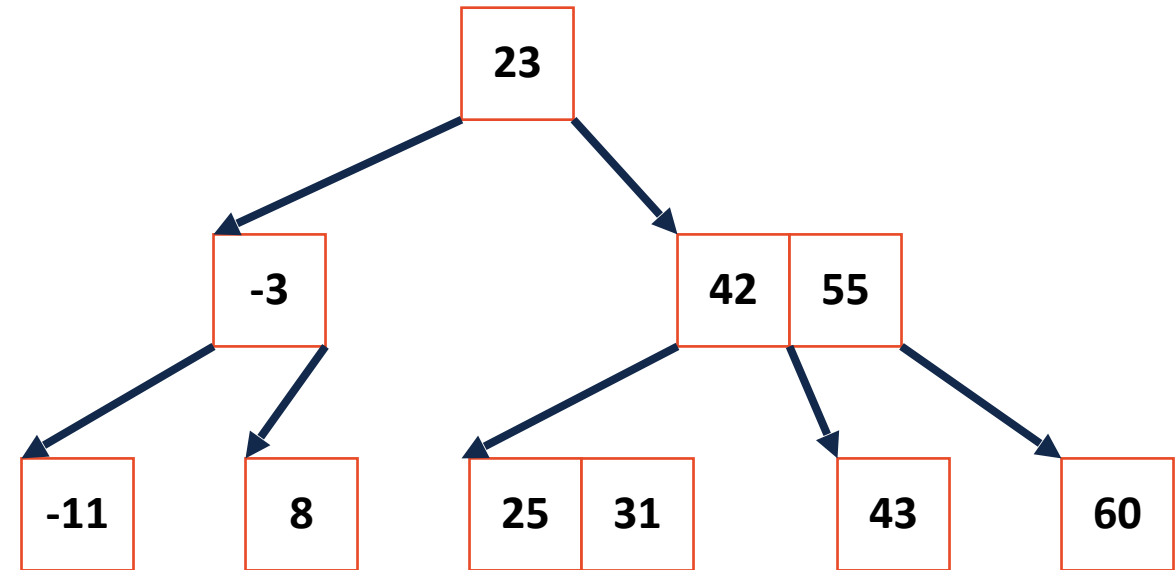
<https://www.cs.usfca.edu/~galles/visualization/BTree.html>



# For next time: BTree Analysis

We've seen the ADT

What is the runtime for our BTree operations?

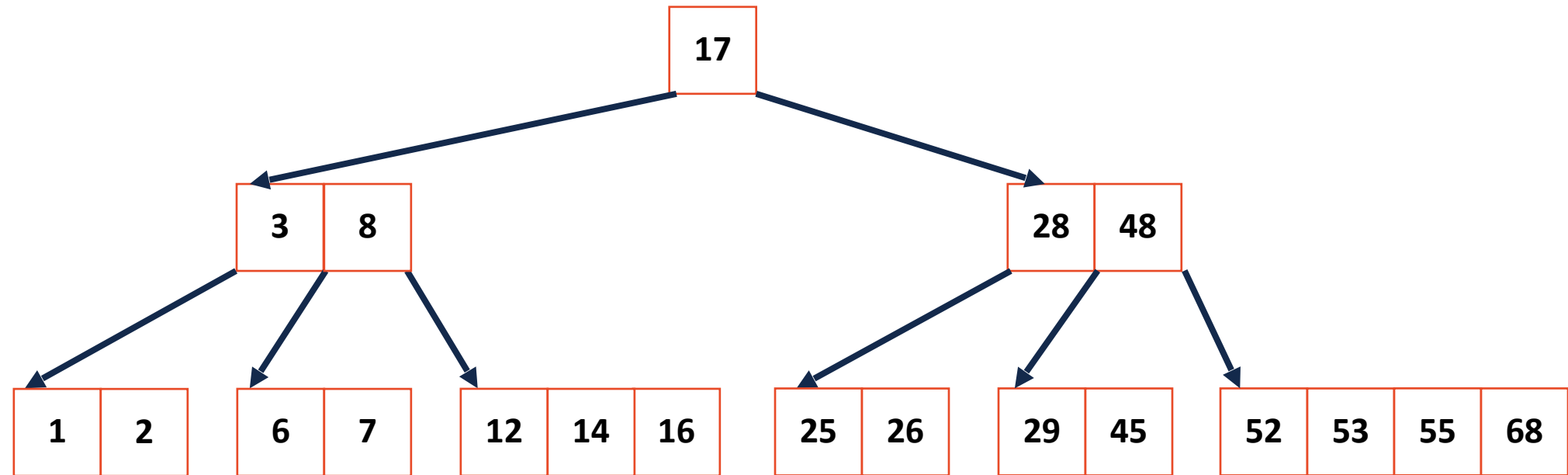


# BTree Node (of order $m$ )

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

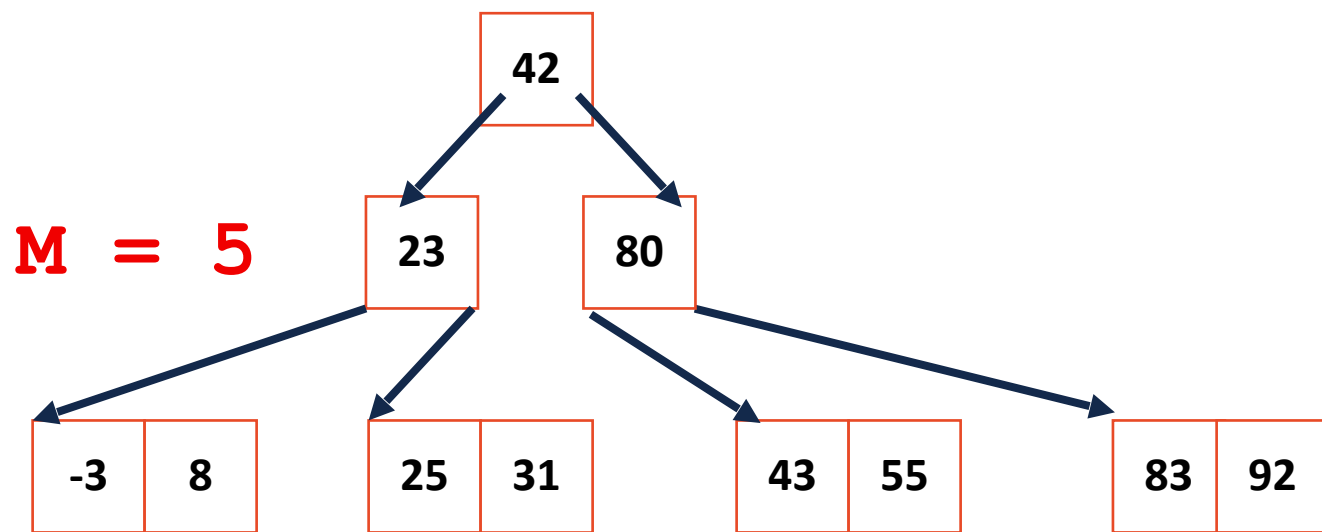
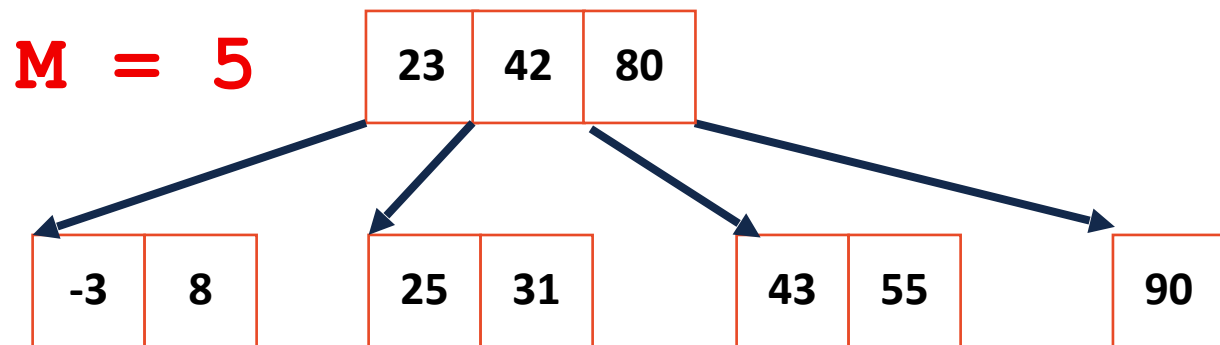
# BTree

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



# BTree Size Restrictions

By definition we have max, 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 leaves 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 \_\_\_\_\_ children.

All non-root, internal nodes have \_\_\_\_\_ children.

All leaves in the tree are at the same level.