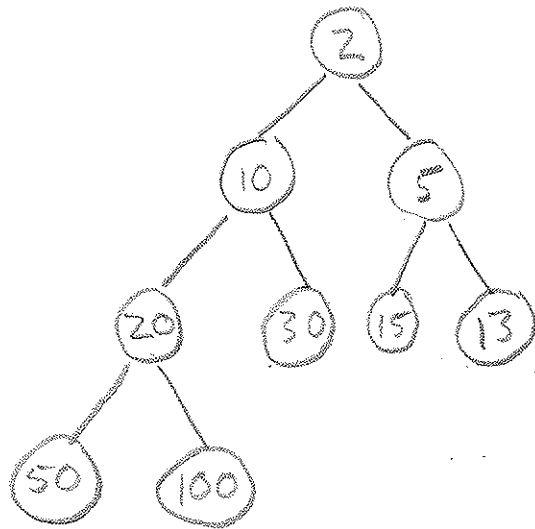


Tree Data Structures: Heaps (Review)

A heap is a Binary Tree with the following properties:

- Every node has a Key that is smaller than both its children (min-heap)
- It is full: all nodes are present at every level, except possibly the last (deepest)
- At the last level it is full-to-the-left



properties

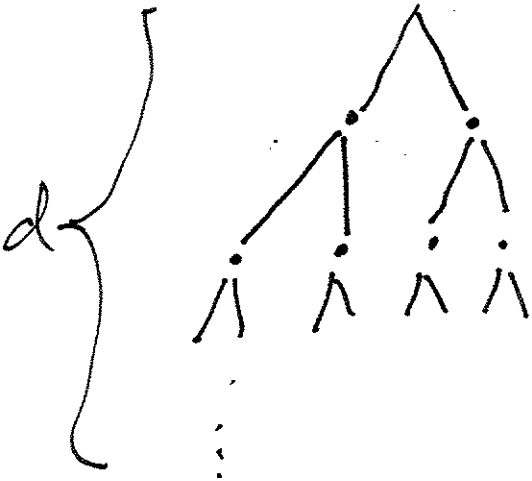
① the minimum element is always at the root

② what is the depth of a heap with n nodes?

$$n = 9 \quad \text{depth} = 3$$

$$n = 2^{d+1} - 1$$

$$\log_2(n+1) - 1 = d \in \Theta(\log(n))$$



| depth | number of nodes |
|-------|-----------------|
| 0 | 1 |
| 1 | 2 |
| 2 | 4 |
| 3 | 8 |
| ⋮ | ⋮ |
| d | 2^d |

$$\sum_{i=0}^d 2^i = 2^{d+1} - 1$$

Basic Operations:

1) get-and-remove minimum

2) insert an element

1) save off the root $O(1)$

2) replace the root with $O(1)$

the "last" key

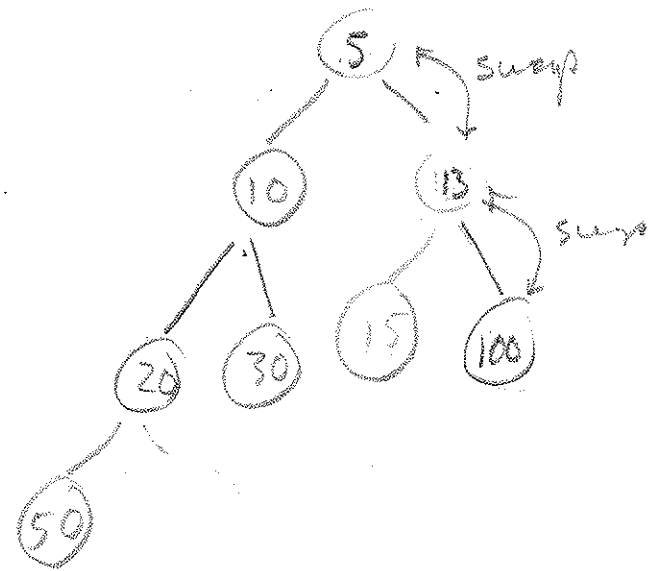
3) fix the heap:

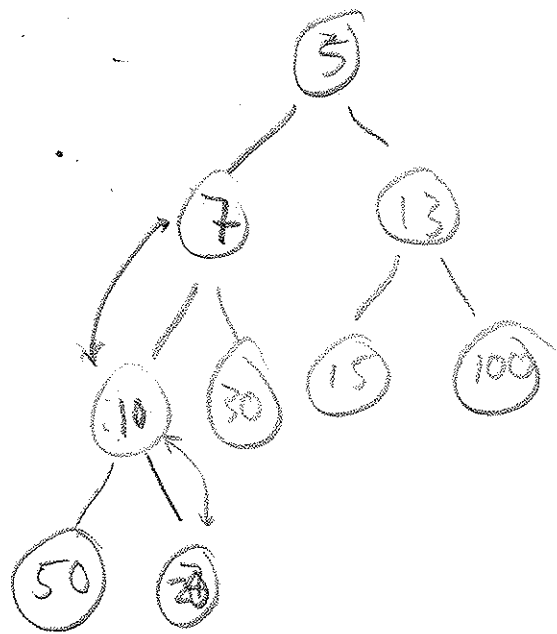
exchange the swapped element with $O(d)$

the min. of its children until: $= O(\log(n))$

- heap prop. is satisfied or \nmid

- it becomes a leaf



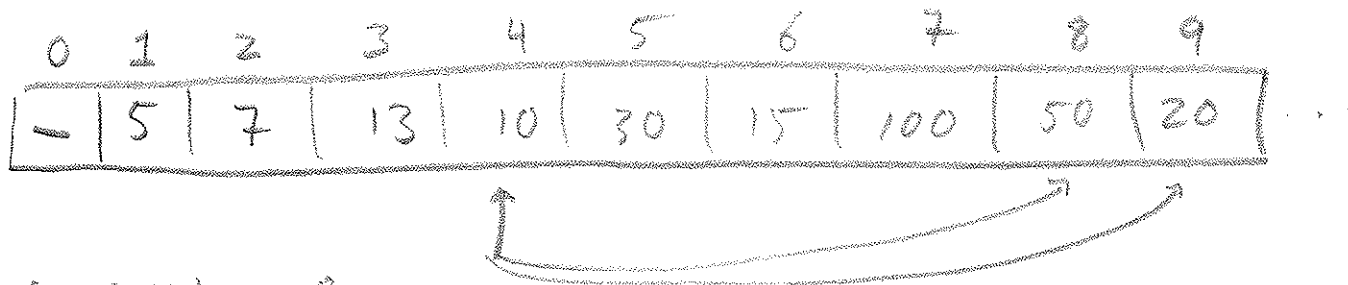


insert 7:

① insert at the "end" of the heap $O(1)$

② fix the heap: "heapify"
 $O(d) = O(\log n)$

implementation: Array



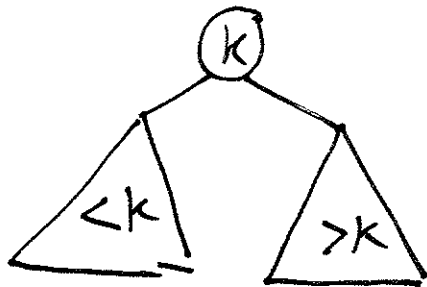
i : left child: $2i$

right child: $2i + 1$

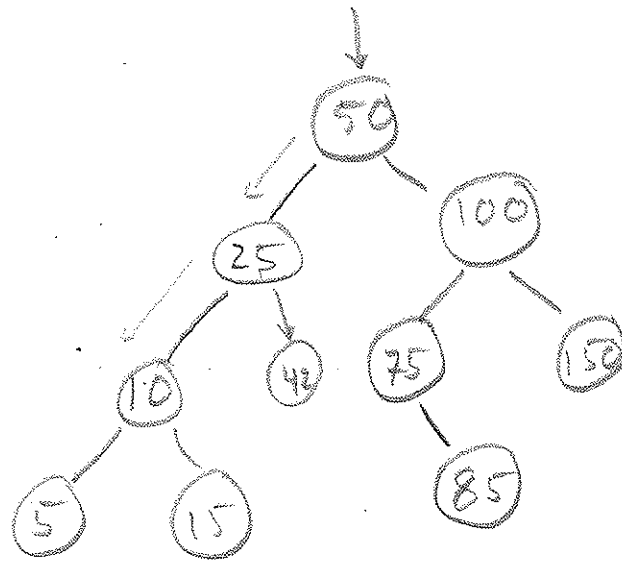
parent: $\frac{i}{2}$

Binary Search Trees:

- Binary Trees
- Every node's key k is such that:
 - every node in k 's left-sub-tree $< k$
 - every node in k 's right sub tree $> k$



- insertion
- retrieval
- deletion.



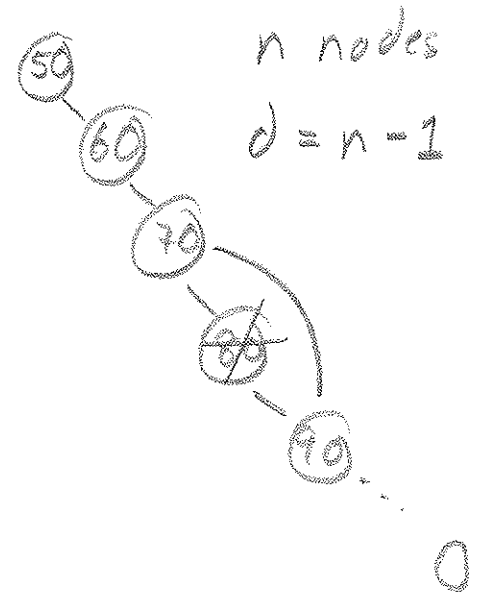
retrieval: search for 10, 42

- Start at the root

- traverse left/right until:

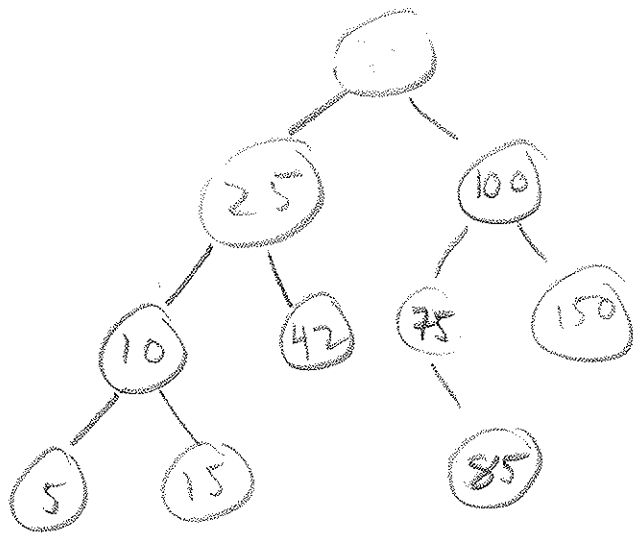
- you find a match or

- you reach the end of the tree



insert 42: search, insert
as a new leaf.

$$\left. \begin{array}{l} \text{you find a match or} \\ \text{you reach the end of the tree} \end{array} \right\} \underline{O(d)} \neq O(\log n)$$



delete: 85, 25, 50

① find it (search) $O(d)$

if it is a leaf: delete it

if it has 1 child:

"promote" the single child

if it has 2 children

replace the node with

the max. value in the
left subtree or

the min. value in the

right subtree



not possible

Binary Search trees may not be balanced.

- $d = O(n)$

- Goal: add more structure to BSTs to

guarantee $d = O(\log n)$

- Balanced BSTs

AVL trees

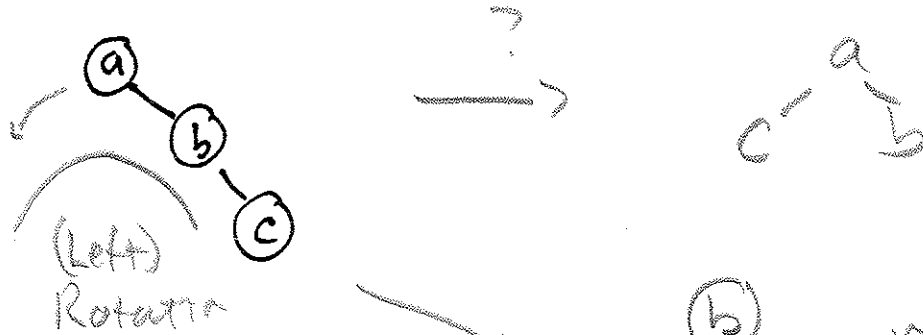
B-trees (2, 3)

Red-Black trees

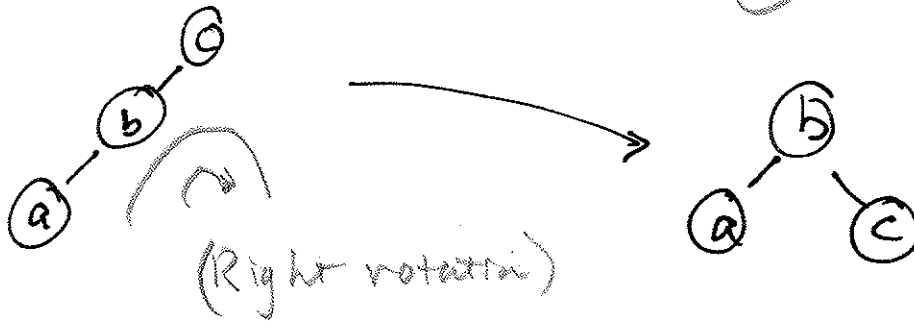
treaps?

etc.

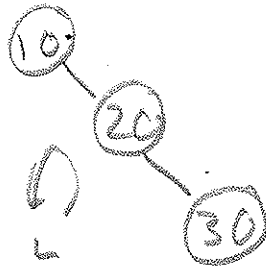
$a < b < c$



rebalanced



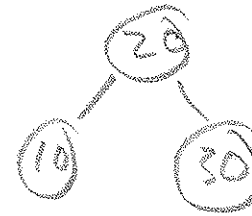
10, 20, 30



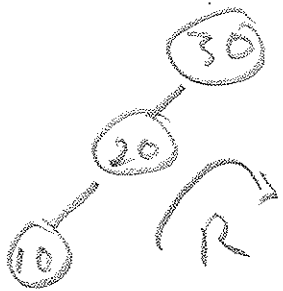
10 30 20



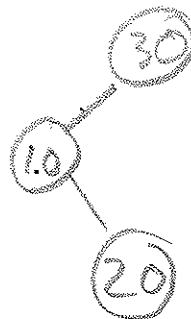
20 10 30



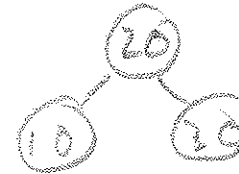
30 20 10

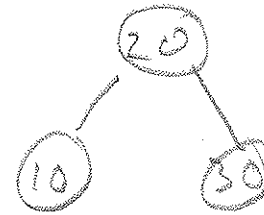
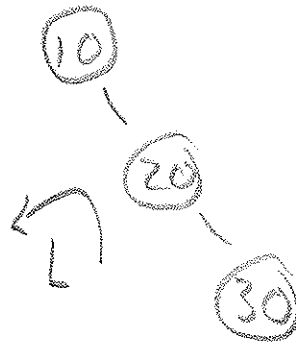
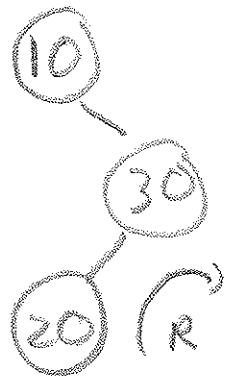


30 10 20

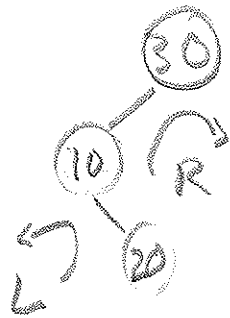


20 30 10

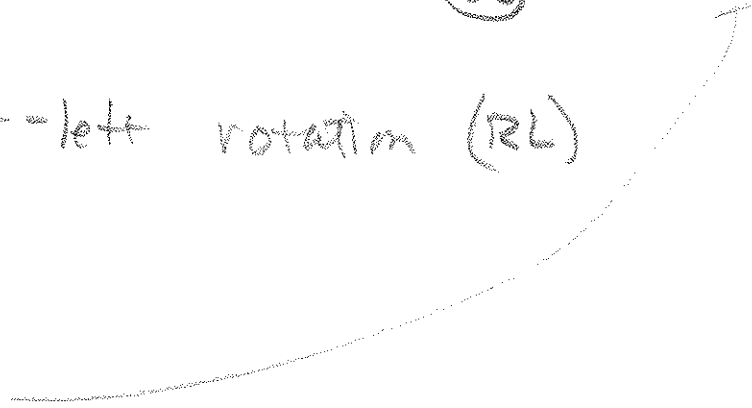




Right-left rotation (RL)



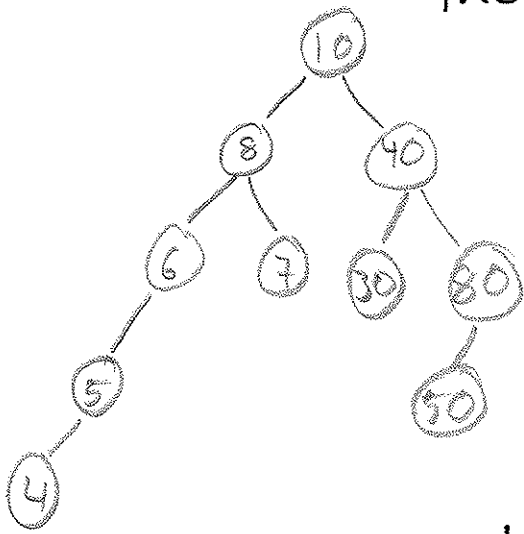
Left-right rotation (LR)



Defn

- The height of a node u in a Binary Tree is the length of the longest path from u to any descendant leaf

Tree height:
4



| <u>node</u> | <u>height</u> |
|-------------|---------------|
| 10 | 4 |
| 30 | 0 |
| 40 | 2 |
| 80 | 1 |

(leaves: height = zero)

- The height of a ^(sub)tree is the max. height of any of its nodes i.e. the height of the root

Defn

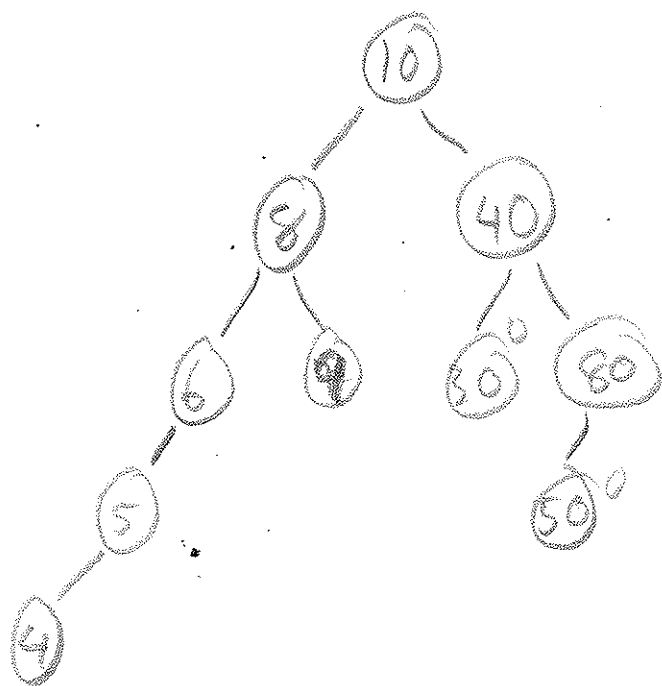
the balance factor (bf) of a ~~tree~~ node ^u is

$$bf(u) = \text{height}(T_L) - \text{height}(T_R)$$

T_L T_R are the left / right subtrees
of u

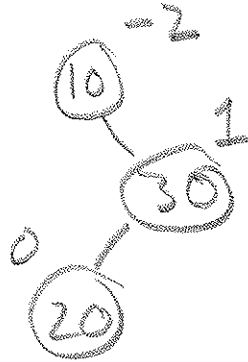
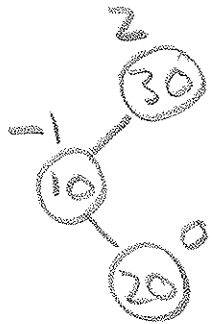
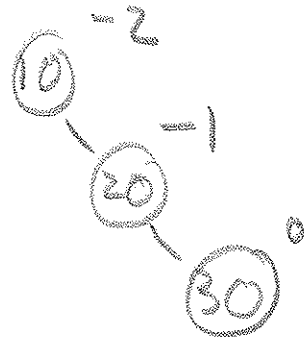
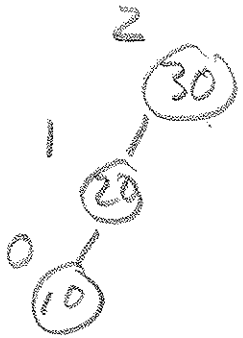
⑤ single node tree has height 0

- empty tree has height -1



| <u>node</u> | <u>balance factor</u> |
|-------------|-----------------------|
| 10 | $3 - 2 = 1$ |
| 8 | $2 - 0 = 2$ |
| 9 | $-1 - (-1) = 0$ |
| 6 | $1 - (-1) = 2$ |
| 30 | 0 |
| 50 | 0 |
| 4 | 0 |
| 5 | $0 - (-1) = 1$ |
| 80 | $0 - (-1) = 1$ |
| 40 | $0 - 1 = -1$ |

leaves: bf=0



balance factor :

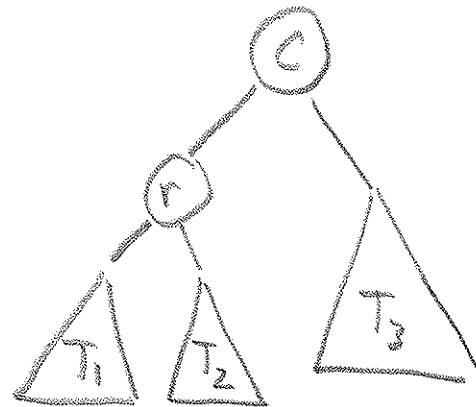
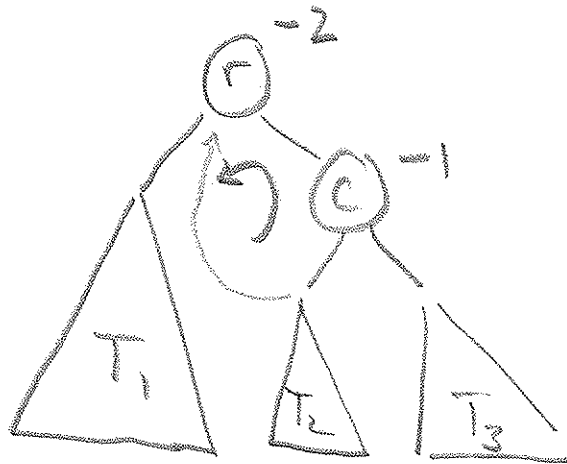
positive \rightarrow skewed to the

left \rightarrow Right rotation

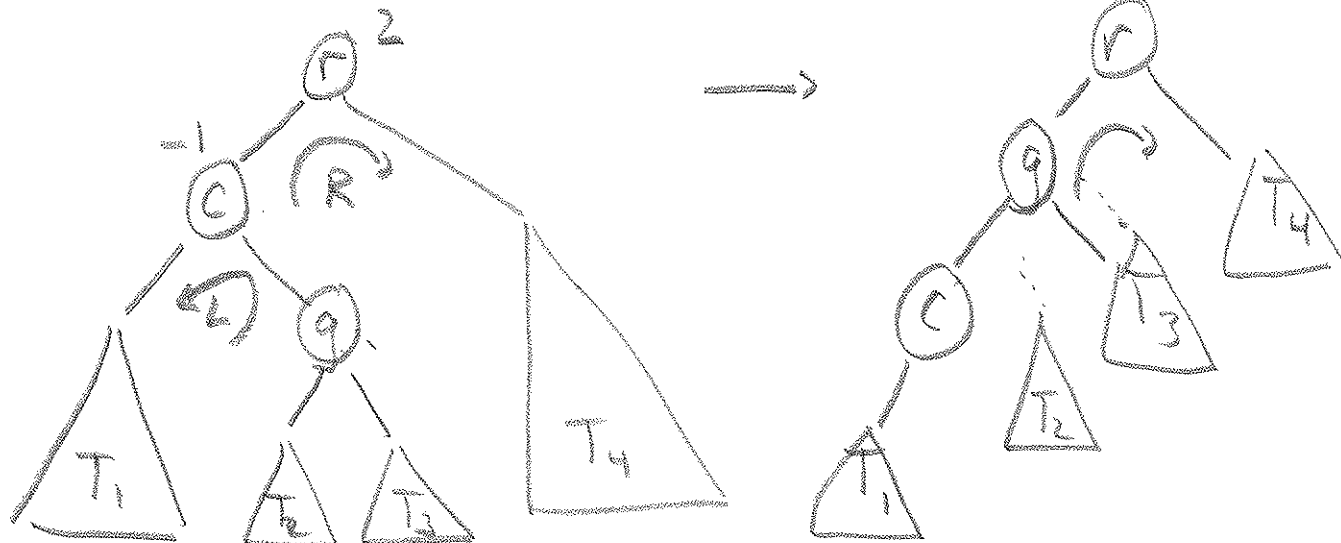
negative \rightarrow skewed to the

right \Rightarrow left rotation

General Left rotation

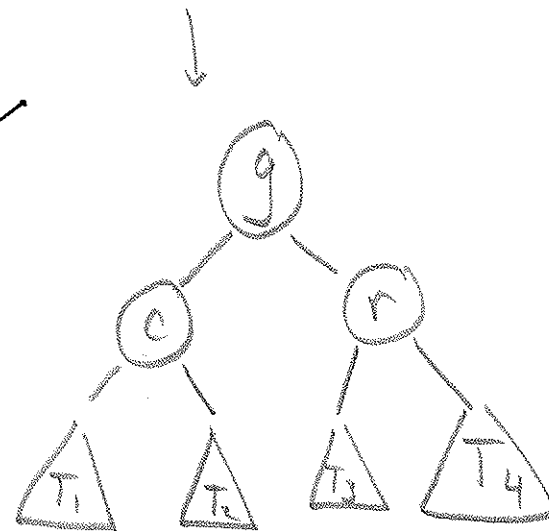


Generalized LR



$r < T_4 \quad \checkmark$
 $g < T_3 \quad \checkmark$
 $T_2 < g \quad \checkmark$
 $T_1 < c \quad \checkmark$

$c < g < r \quad \checkmark$



Search: exactly the same

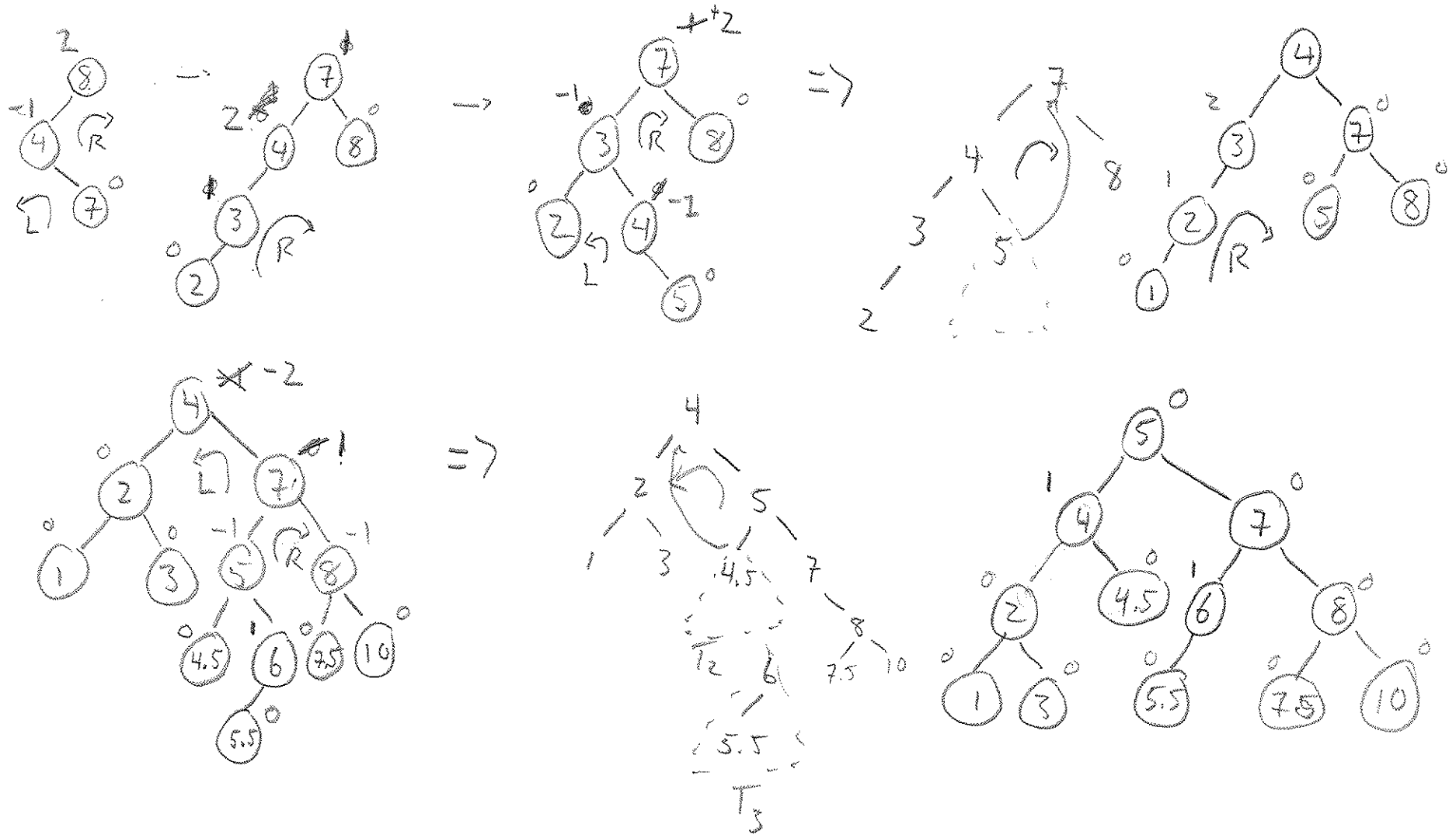
insertion: same: insert as a leaf

additionally: rebalance if necessary

deletion:

AVL Tree Example

Insert: 8, 4, 7, 3, 2, 5, 1, 10, 6



~~AE~~ AVL:

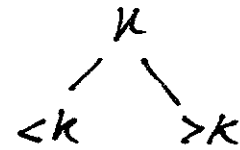
- height is bounded:

$$\lfloor \log(n) \rfloor \leq h \leq 1.4405 \cdot \log_2(n+2) - 0.3277$$

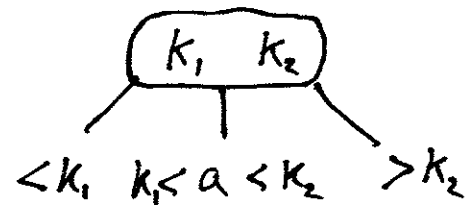
- $h \in \Theta(\log(n))$
- All operations are $O(\log(n))$

2-3 Trees

- Every node has at most 3 children (2 or 3 children)
- Zero children: a leaf
- 1 child: DNE = Does not exist
- 2-nodes: 1 key 2 children



- 3 node: 2 keys K_1, K_2 , $K_1 < K_2$
3 children



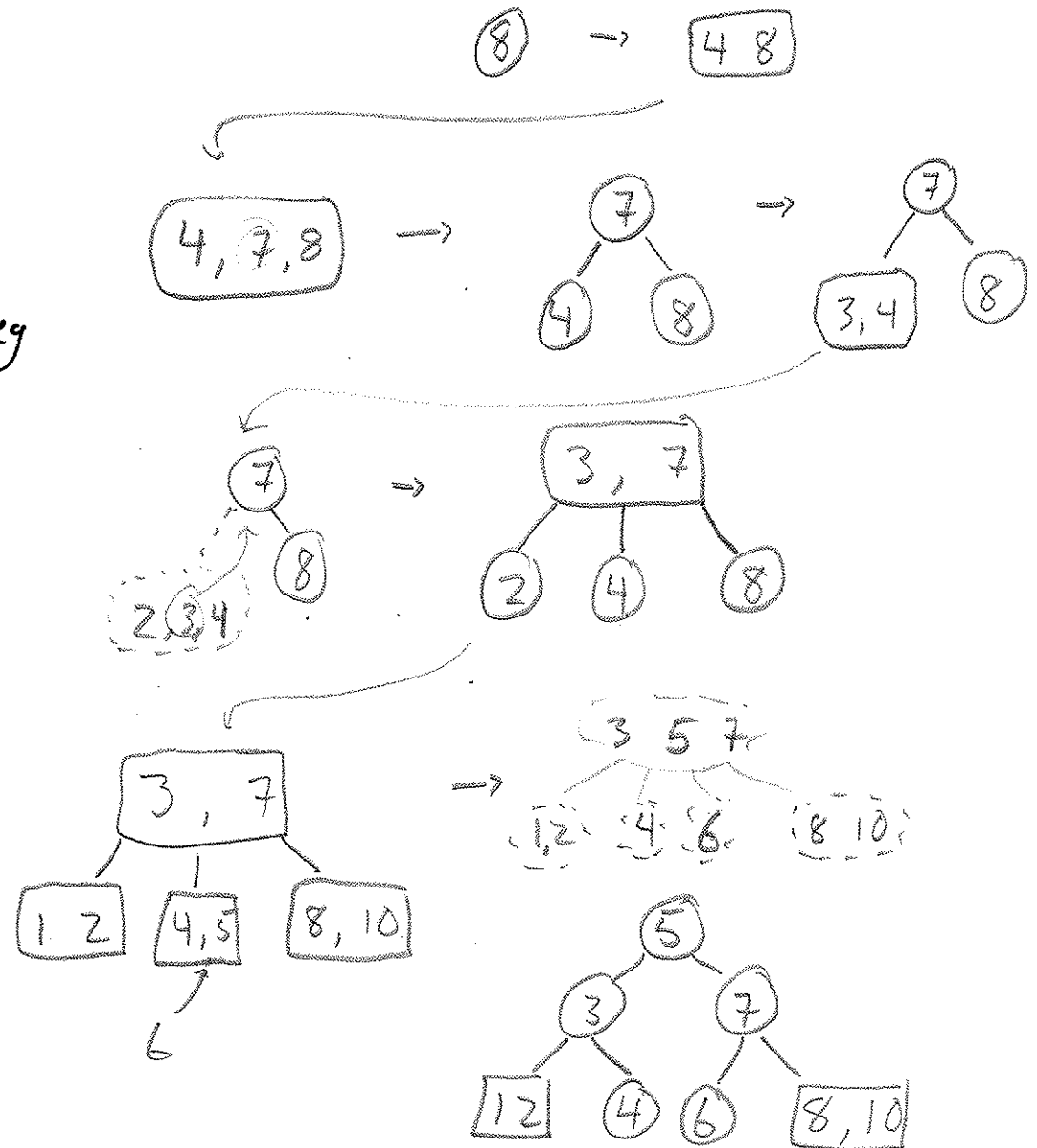
- ~~All nodes~~ The tree is "full":

all leaves are at the same level.

Insertion:

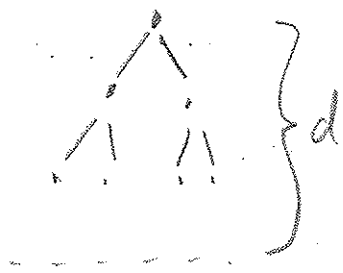
- always done in a leaf
- if inserted into a 2 node:
it becomes a 3 node
- if inserted into a 3 node:
middle element is promoted
and the other 2 ~~nodes~~ ^{keys}
Split into 2-nodes

8 4 7 3 2 5 1 10 6



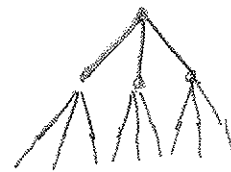
min size⁽ⁿ⁾ of a 2-3 of depth d : $2^{d+1} - 1$

max sized " " " " " "



$$\sum_{i=0}^d 2^i = 2^{d+1} - 1$$

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



| # nodes | # keys |
|----------|---------------|
| 1 | 2 |
| 3 | 6 |
| 9 | 18 |
| \vdots | |
| 3^d | $2 \cdot 3^d$ |

$$2 \sum_{i=0}^d 3^i = 2 \left[\frac{3^{d+1} - 1}{2} \right]$$

$$= 3^{d+1} - 1$$

$$2^{d+1} - 1 \leq n \leq 2[3^{d+1} - 1]$$

of leaf
depth

$$2^{d+1} - 1 \leq n \rightarrow d \leq \log_2(n+1) - 1$$

$$n \leq 2[3^{d+1} - 1] \rightarrow \log_3\left(\frac{n}{2} + 1\right) - 1 \leq d$$

$$\log_3\left(\frac{n}{2} + 1\right) - 1 \leq d \leq \log_2(n+1) - 1$$

$$\therefore d \in \Theta(\log(n))$$

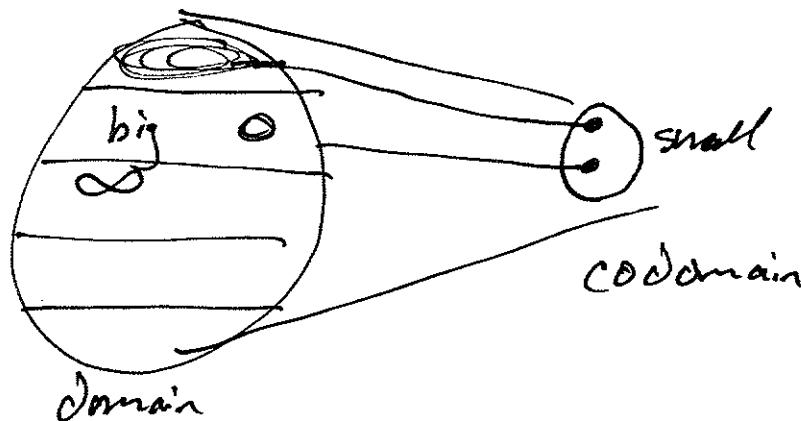
Java: TreeSet <T> (Interface: SortedSet <T>)
↓
Red-Black Tree

Python: ?

hash-based data structures

Hash Tables

- amortized constant-time $O(1)$ operations
- Elements are stored in a regular old array
- Element's location ~~is~~ (index) is determined by a hash function
- A hash function maps a large domain to a small codomain



$$h(x) = x \bmod 7$$

% (remainder)

$$h(17) = 3$$

$$h(23) = 2$$

$$h(28) = 0$$

$$h(29) = 1$$

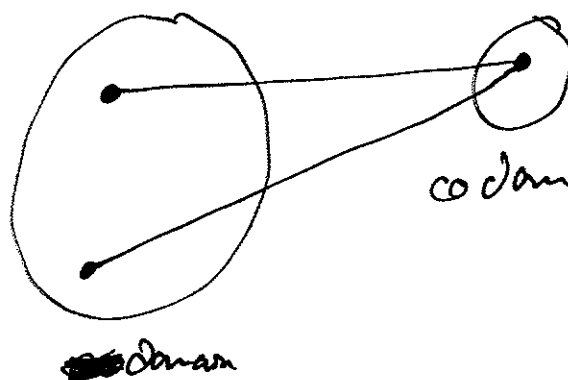
$$h(27) = 6$$

⋮

$$h(24) = 3$$

$$h(17) = h(24) = 3$$

but $17 \neq 24$



• hash functions are not 1-1

• different values may map to

the same value

• collision

$$h: \mathbb{Z} \rightarrow \{0, 1, \dots, 6\} = \mathbb{Z}_7$$

↑
 $\mathbb{Z} \bmod 7$

$$\mathbb{Z}_m = \{0, 1, 2, \dots, m-1\}$$

Hash Table: hold objects

- WLOG: map objects $\rightarrow \mathbb{Z}$

(int) .hashCode()

- python: (?) `-- hash -- (self)`
↗↗

`-- str -- (self)`

`-- construct --`

magic
methods
..

$$h: \mathbb{Z} \rightarrow \mathbb{Z}_m = \{0, 1, 2, \dots, m-1\}$$

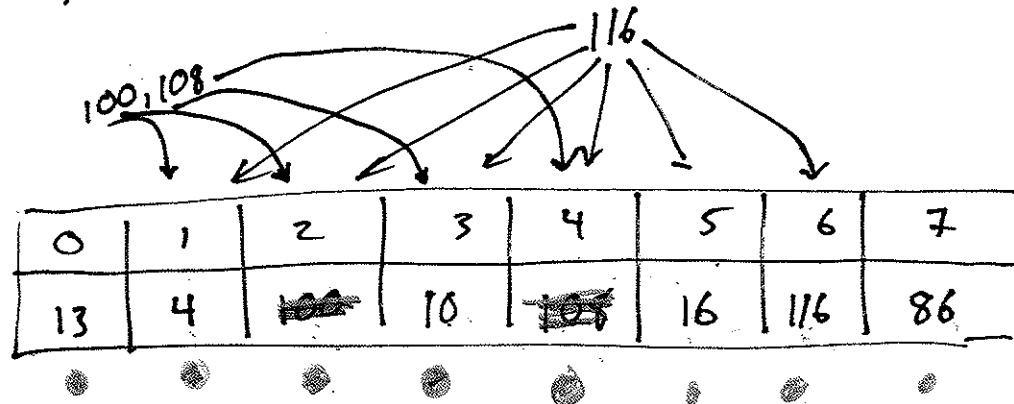
Object \rightarrow int \rightarrow int (0...n-1)
 ↑
 indices of a regular old array.

hashing : finding the location of an object
is potentially $O(1)$

hashed object : used as a key to map to a value.

Hash Map $\langle K, V \rangle$

$$h(k) = 7k + 13 \mod 8$$



Dirty bits

10, 16, 4, 13, 86

$$h(10) = 7 \cdot 10 + 13 \mod 8$$

$$= 3$$

$$h(16) = 7 \cdot 16 + 13 \mod 8$$

$$h(4) = 1$$

$$h(13) = 7 \cdot 13 + 13 \mod 8$$

$$= 0$$

$$h(86) = 7 \cdot 86 + 13 \mod 8$$

$$h(100) = 7 \cdot 13 \mod 8$$

$$= 1 \quad \text{collision}$$

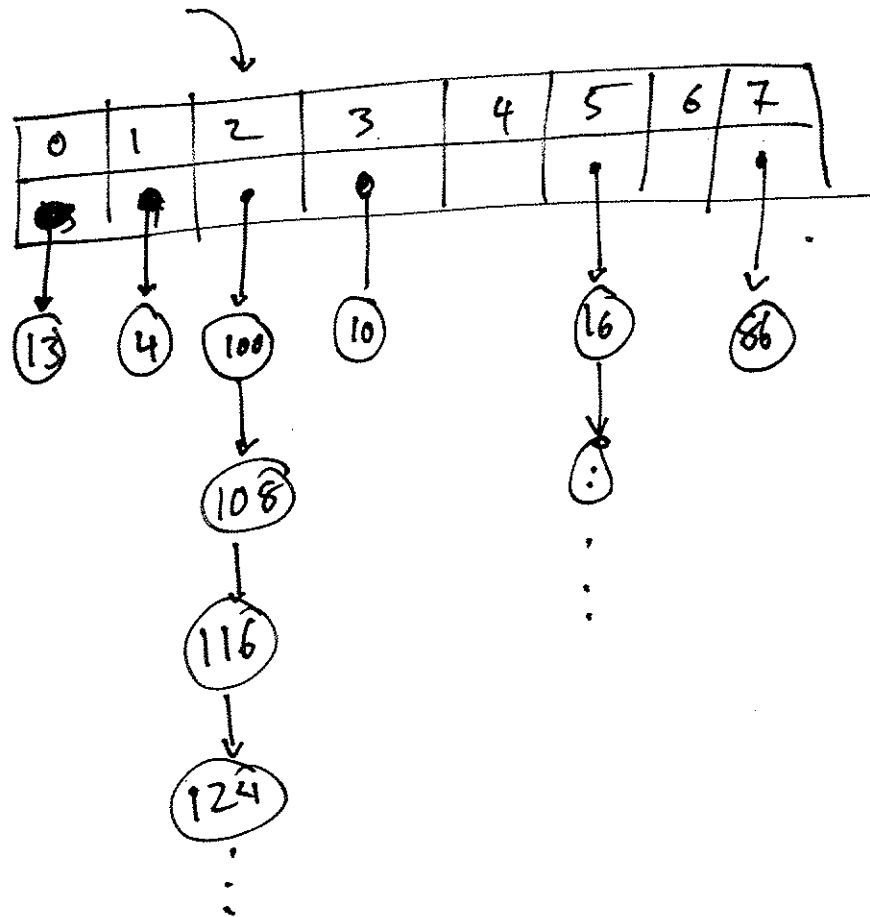
$$h(108) = 7 \cdot 108 + 13 \mod 8$$

$$= 1$$

$$h(\text{116})$$

Collision Resolution:

- Linear probing: if a cell is occupied, go to the next cell until you find an ~~the~~ unoccupied cell
- linear function probe: $h'(k) = h(k) + i \mod m$
- quadratic probing
$$h(k, i) = h(k) + c_1 i + c_2 i^2 \mod m$$
- Chaining: cells can be other data structures instead of 1 object



Linked List $O(n)$

BST

~~Hash Table~~ (2)

- A load factor :

$$\alpha = \frac{n}{m} = \frac{\text{number of elements in the hashtable}}{\text{size of the hashtable}}$$

$$0 \leq \alpha \leq 1$$

α : % of "fullness"

1 = 100% full

0 = empty

.5 = 50% full

.75 = 75% full


- when the hash table hits a predetermined load factor
 ↓
 rehashed. increase m
- created a new larger array, rehash every element.
- $O(n)$ operation
 but infrequent operation



Average or
Amortized cost
 $\sim O(1)$

4. high balance factor = poor performance, low mem

low balance factor = less chance of collision,

 = better performance
= more memory

Time / space trade off data structure.