

## Weight Balance:

- Given a set of **keys**

$$X = \{x_0, \dots, x_{n-1}\}$$

- and **values**

$$V = \{v_0, \dots, v_{n-1}\}$$

- and **weights**

$$W = \{w_0, \dots, w_{n-1}\}$$

- Assume:

$$x_0 < x_1 < \dots < x_{n-1} \text{ sorted}$$

$$w_i > 0 \text{ positivity}$$

## Pseudo-Probability:

- Let:  $\bar{W} = \sum_{i=0}^{n-1} w_i$  **total weight**

- Let:  $p_i = w_i / \bar{W}$  **pseudo-prob**

- Obs:  $0 < p_i \leq 1$   
 $\sum_i p_i = 1$  }  $\Rightarrow$  discrete prob. distribution

**Shannon's Theorem:** If  $p_i$  is the prob. of accessing  $x_i$ , any BST has expected search at least  $\sum_i p_i \lg(1/p_i) \leftarrow$  (called the **entropy** of distrib)



## Overview:

- Splay trees - **Static**

### Optimality

- More frequently accessed keys closer to root

$\Rightarrow$  **Weight-balanced trees**

Weight-Balanced Trees I



## How to (Nearly) Achieve Shannon's bound

$\rightarrow$  Weight-balanced tree

$\rightarrow$  For each node  $p$ :

**wt(p)** = total weight of keys in  $p$ 's subtree

$$\text{balance}(p) = \frac{\max(\text{wt}(p.\text{left}), \text{wt}(p.\text{right}))}{\text{wt}(p)}$$

## Implementation: (as extended BST)

### Internal node: Stores:

Key key  $\rightarrow$  splitter  
float wt  $\rightarrow$  total weight of entries in subtree  
left, right



### External Node:

Key key,  $\leftarrow x_i$   
Value value  
float wt  $\leftarrow w_i$



$\Rightarrow$  Given  $1/2 \leq \alpha \leq 1$ , a BST is  **$\alpha$ -balanced** if for all internal nodes  $p$ ,  $\text{balance}(p) \leq \alpha$

$\alpha = 1/2$ : Perfectly balanced  
 $= 1$ : Arbitrarily bad

$\alpha = 2/3$ : A reasonable compromise

## Balance by Rebuilding:

Given an array  $A[0..k-1]$  of external nodes:

$A[i].key, A[i].value,$   
 $A[i].wt$

- Assume keys are sorted
- Assume weights  $> 0$



## Weight-based median:

- Select splitter to minimize left-right weight difference

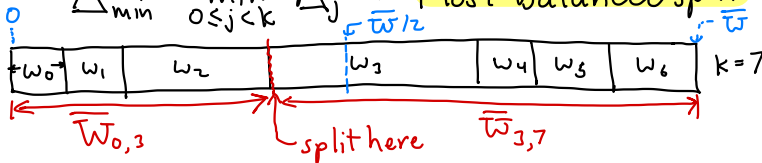
- Let  $\bar{W} = \sum_{i=0}^{k-1} A[i].wt \leftarrow \text{Total wt}$

- Let  $\bar{W}_{i,j} = \sum_{m=i}^{j-1} A[m].wt \leftarrow \text{Total wt of } A[i..j-1]$

- Let  $\Delta_j = |\bar{W}_{0,j} - \bar{W}_{j,k}| \leftarrow \text{Absolute diff if we split } A[0..j-1] \{A[j..k-1]$

- **Goal:** Split at  $0 \leq j < k$  that minimizes:

$\Delta_{\min} = \min_{0 \leq j < k} \Delta_j \leftarrow \text{Most balanced split}$

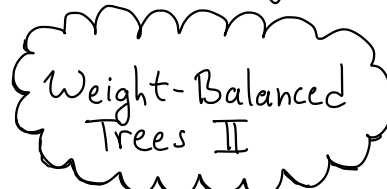


## How to maintain balance?

Options:

- **Rotations:** Similar to AVL trees (single + double)  
...  $\rightarrow$  **BB[x] trees**

- **Rebuild subtrees:** Similar to scapegoat



## buildTree( $A[0..k-1]$ )

if ( $k == 1$ ) return  $A[0]$  /\* base case \*/

$\bar{W} = \sum_{i=0}^{k-1} A[i].wt$  /\* total weight \*/

Init:  $b = 0; Lwt = 0; Rwt = \bar{W}; \Delta_{\min} = \bar{W}$

for ( $i = 0 \dots k-1$ )

$Lwt += A[i].wt; Rwt -= A[i].wt$

$\Delta = |Rwt - Lwt|$  /\* weight difference \*/

if ( $\Delta < \Delta_{\min}$ ) {  $b = i+1; \Delta_{\min} = \Delta$  }

$L = \text{buildTree}(A[0..b-1])$

$R = \text{buildTree}(A[b..k-1])$

return new IntNode( $A[b].key, L, R$ )



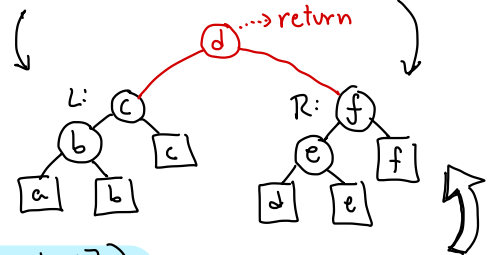
## Example:

	0	1	2	3	4	5	$k=6$
key:	a	b	c	d	e	f	
wt:	←3→	←2→	←4→	←1→	←2→	←4→	

$$\Delta_{\min} = |(1+2+4) - (3+2+4)| = 2$$

$L = \text{buildTree}(A[0..2])$

$R = \text{buildTree}(A[3..5])$



But it is pretty close! 😊 ↩

**Theorem:** (Mehlhorn '77)

The above balanced split algorithm produces a tree whose exp. search time is

$$\leq H + 3$$

where  $H$  = entropy bound.



**Dictionary Operations:**

→ Balance by destroying + rebuilding - **Jackhammer Trees**

**Find:** Same as usual. Tree height  $\leq \log_{3/2} n$ , so  $O(\log n)$  time - guaranteed.

**Insert/Delete:** Start same as standard BST  
→ After operation completes **check + rebuild**

**Analysis:**

Does this algorithm produce the **optimal tree** (w.r.t. expected case search time)?

- No. 😞 The optimal BST can be computed by **dynamic programming**

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Weight-Balanced Trees III

→ **Check + Rebuild:**

- When returning from recursive calls, update each node's weight

$$p.wt \leftarrow p.left.wt + p.right.wt$$

- Starting at root, walk down search path. Stop at first node  $p$  s.t.

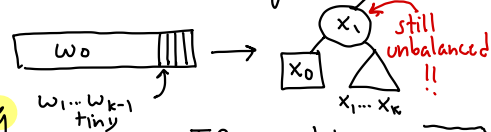
Recall def earlier

$$balance(p) > \alpha$$

Given by designer e.g.  $\alpha = 2/3$

**Bad weight distributions?**

- If a weight is very large relative to neighbors, rebalance may be ineffective



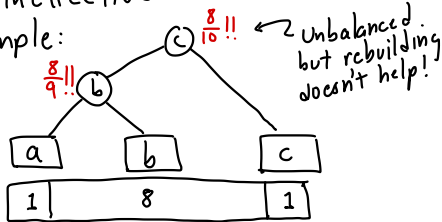
**Lemma:** If weights are "nice" (not too much variation), insert + delete run in  $O(\log n)$  amortized time.

→ If no such  $p$  found - Great! Tree is balanced  
Else: **Jackhammer!**  
- Traverse  $p$ 's subtree inorder, store extern nodes in array  $A[0..k-1]$   
- Replace  $p$ 's subtree with **buildTree(A)**

## Very heavy entries:

- If an entry's weight is too high, rebuilding is ineffective

- Example:



- This tree is best possible!

- Exemption: Don't rebuild if a key's weight is very high

For node  $p$ :  $\max(p) =$   
max weight in  $p$ 's subtree

$$\max\text{-ratio}(p) = \frac{\max(p)}{\text{weight}(p)}$$

Given parameter  $0 < \beta < 1$ ,  
a node is  $\beta$ -exempt if  
 $\max\text{-ratio}(p) > \beta$

## Dictionary Operations:

- find: as usual
- insert: insert as usual but rebuild if needed
- delete: delete as usual but rebuild if needed

## Weight-Balanced Trees IV

$(\alpha, \beta)$ -balance: Every internal node  $p$  is either  
 $\alpha$ -balanced or  
 $\beta$ -exempt

Lemma: For any set of weighted entries,  $\exists$  an  $(\alpha, \beta)$ -balanced BSTree if  
 $\frac{1}{2} < \alpha < 1$  and  $\beta < 2\alpha - 1$

## When to rebuild?

- When "backing out" from insert/delete, update node weights
- Walk down search path from root [opposite from scapegoat!]

- If any node  $p$  is out of balance:

$$\text{balance}(p) > \alpha$$

-and-

$$\max\text{-ratio}(p) \leq \beta$$

then:

- Rebuild  $p$ :

- Traverse  $p$ 's subtree in order
- Collect external nodes in array  $A[0..k-1]$
- replace  $p$  with  $\text{buildTree}(A)$

E.g.  
 $\alpha = 2/3$   
 $\beta = 1/4$