

# AVL Tree

## 引入与定义

### 数据结构作用

1. 存储数据

2. 支持操作

- 查找
- 插入
- 删除
- etc.

考虑BST，其查找、插入和删除操作都是 $O(h)$ 的，为了尽可能降低时间复杂度，我们会采取 $h$ 尽可能小的建树方式，那么complete BT（完全二叉树）就符合这个性质。

但是由于在树的维护过程中，我们插入一个数据之后再将这个数变成完全二叉树的时间代价是 $O(N)$ 的，其维护成本非常高，所以我们就放宽了一些限制条件，定义了**balanced binary tree**：

对于树的任意节点 $u$ ，其左子树的高度 $h_L$ 和右子树的高度 $h_R$ 满足条件： $|h_L - h_R| \leq 1$

其中， $|h_L - h_R|$ 被称作这个节点的balance factor，而满足这个条件的搜索树被称为BBST，也称**AVL tree**。

## 证明

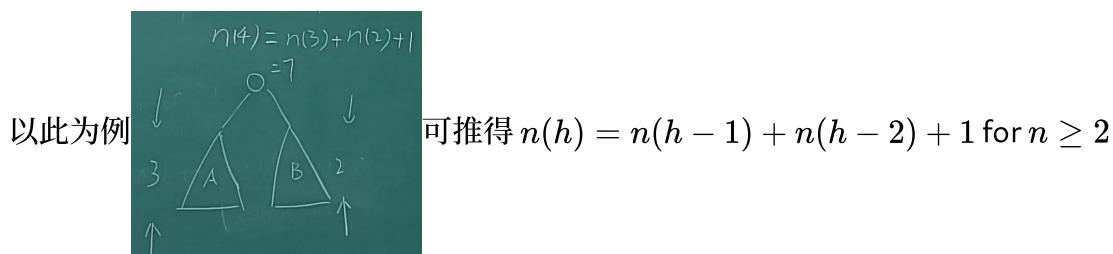
1. 这个条件虽然放宽了，但是仍然可以较快地做查找

LEMMA: A balanced binary tree with  $n$  nodes must have a height of  $O(\log N)$

proof:

主要需要证明 any BBT of height  $h$  has at least  $c^h$  ( $c$  is a constant) nodes

定义  $n(h)$ : nodes in the smallest BBT of height  $h$

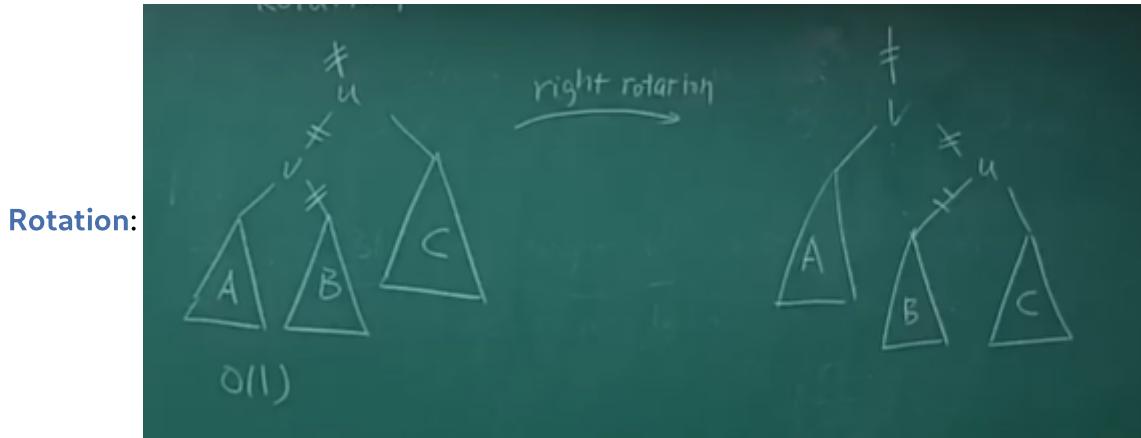


由递推式可得  $n \approx (\sqrt{5} + 1/2)^h$

故  $n \geq c^h \rightarrow h \leq \log_c n$

## 2. 这个性质的维护代价小

先理解一个操作：



- 只需要改3个指针，是 $O(1)$ 时间复杂度的
- 若旋转前满足BST性质，旋转后仍然满足
- 左右子树的高度发生了变化
- left rotation就是right rotation的逆操作

考虑不同操作的维护：

- 插入

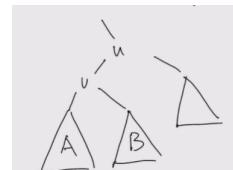
### 1. insert as in BST

- 哪些点的平衡可能会受到影响？ - 被插入节点的ancestor
- 变得不平衡之后高度差（平衡因子）是多少？ - 只可能是2

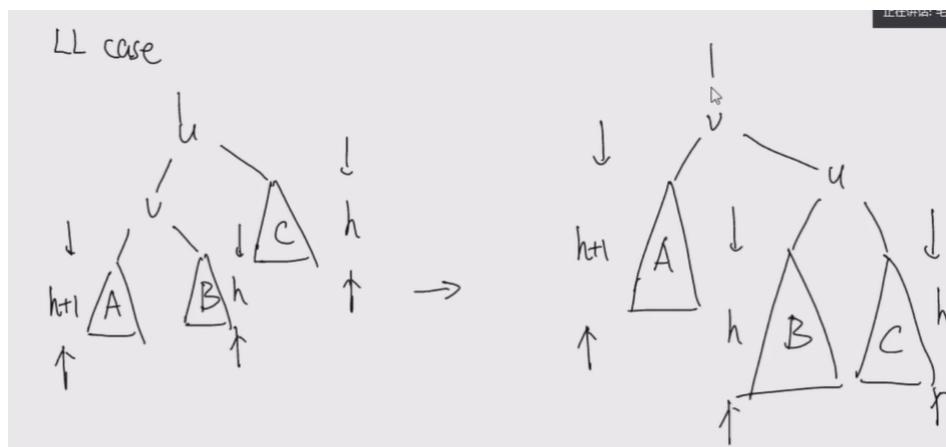
### 2. restore the balance

- 选取路径上最低的不平衡节点 $u$
- 以 $h_L - h_R = 2$  (**L case**) 为例讨论（相反的情况**R case**类比即可），左右子树的高度分别被记为 $h + 2$ 和 $h$

- 考虑左子树的根节点 $v$ ，其左右子树分别记为 $A$ 和 $B$ ：

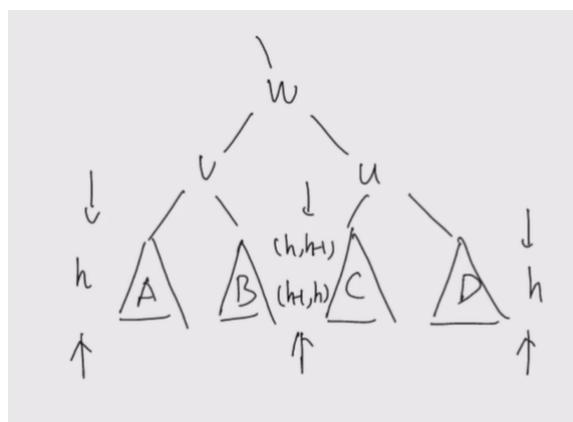
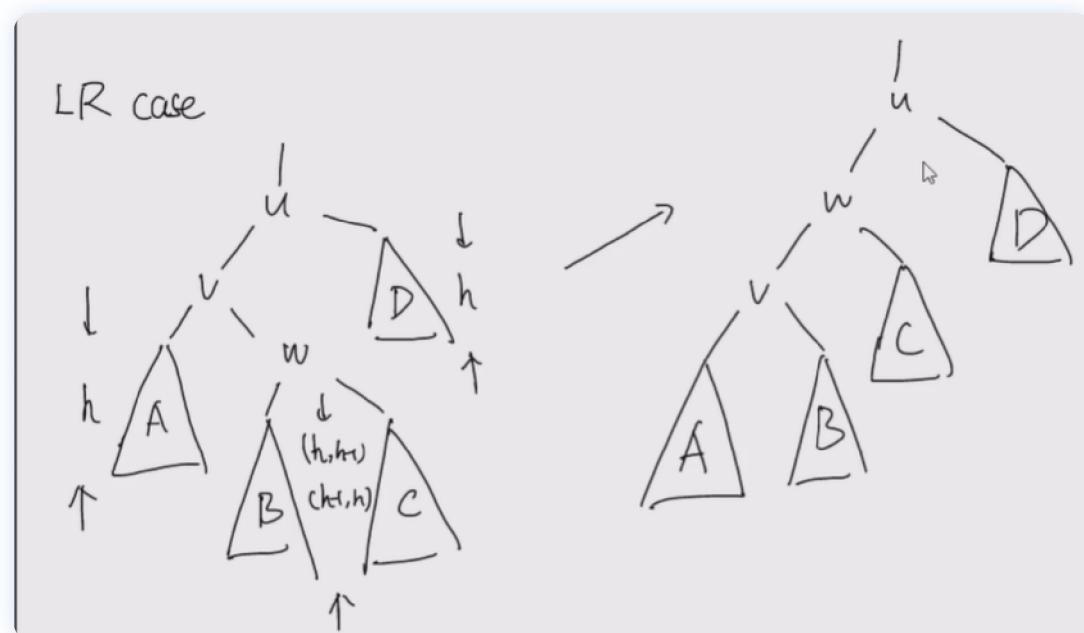


- 由于在插入操作前为平衡树，故 $h_A$ 和 $h_B$ 有且仅有两种可能性：
  - $h_A = h + 1, h_B = h$  - **LL case**



- $h_A = h, h_B = h + 1$  - LR case

将B子树再分成以w为根节点的左右子树，把w拎起来做两次旋转：



此时三个节点都平衡了

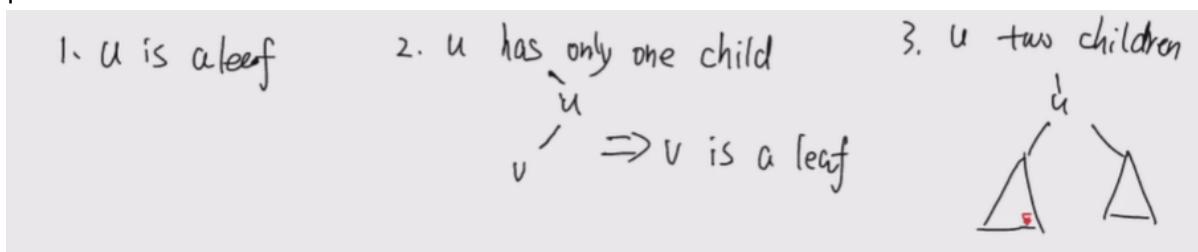
- 那么总共需要旋转多少次可以修复所有节点？

- 做插入前树的高度为  $h + 2$ ，插入后（不平衡）为  $h + 3$ ，把  $u$  修复平衡后高度为  $h + 2$ ，因此对上面的原先不平衡的ancestors节点，在最低不平衡节点被修复后也都修复了，所以总共1或2次（即修复最下面的不平衡点）就可以

- 总时间复杂度  $O(\log N)$
- 删除

## 1. delete as in BST

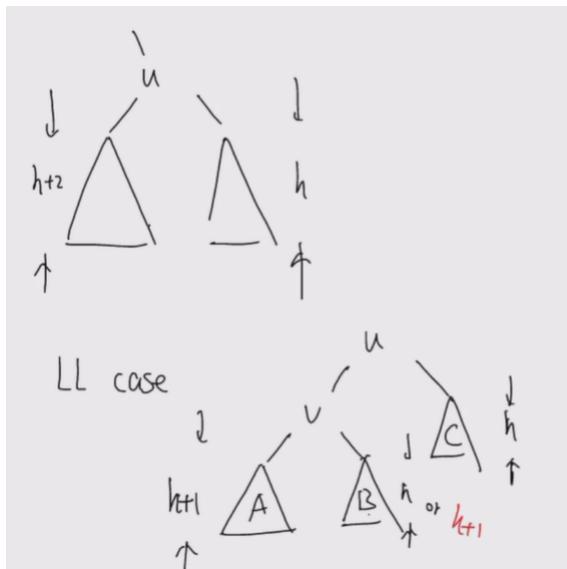
- BST deletion in BBST is essentially removing a leaf
- proof:



- 如果删掉一个leaf，可能会使得某一个子树高度下降，导致至多一个节点不平衡（刚刚做完删除操作），且高度差为2

## 2. restore the balance

### ■ LL case



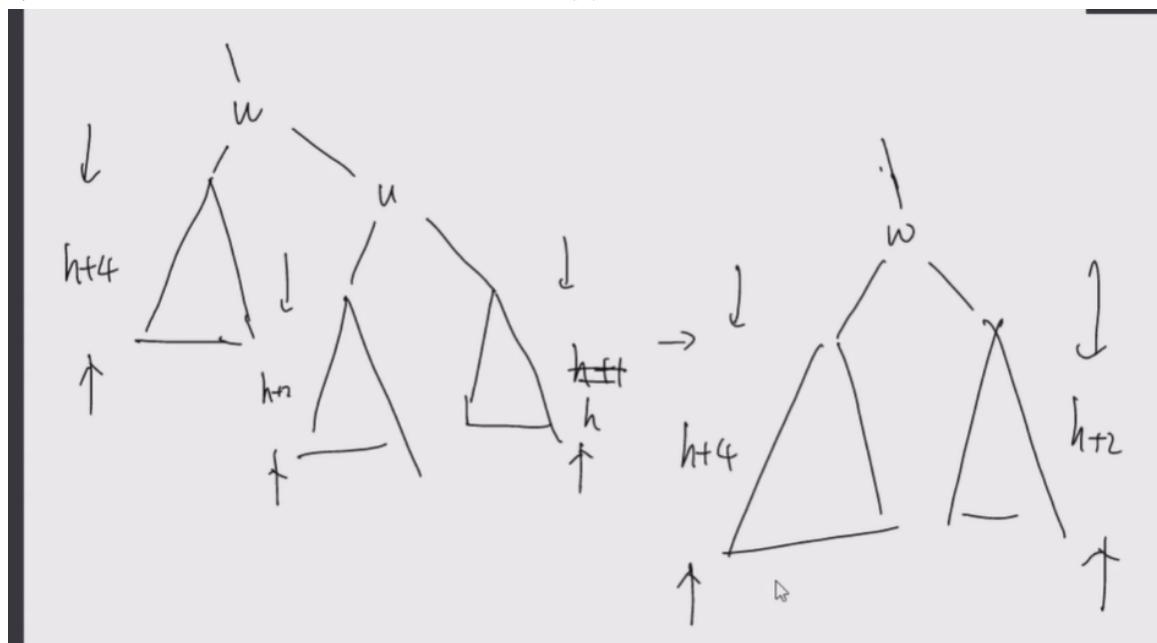
只是B子树高度可能性不同，但是把 $u$

变平衡的操作和插入相同

### ■ LR case 同理

- 那么总共需要旋转多少次可以修复所有节点？

- 虽然最开始只有一个节点不平衡，但是修复那个节点的过程可能会导致上面的节点不平衡



- 考虑到不平衡的向上传递，删除 + 修复的时间复杂度为  $O(\log N) + O(1) * O(\log N) = O(\log N)$

树的高度和维护代价都是 $O(\log N)$ 数量级的

## 红黑树

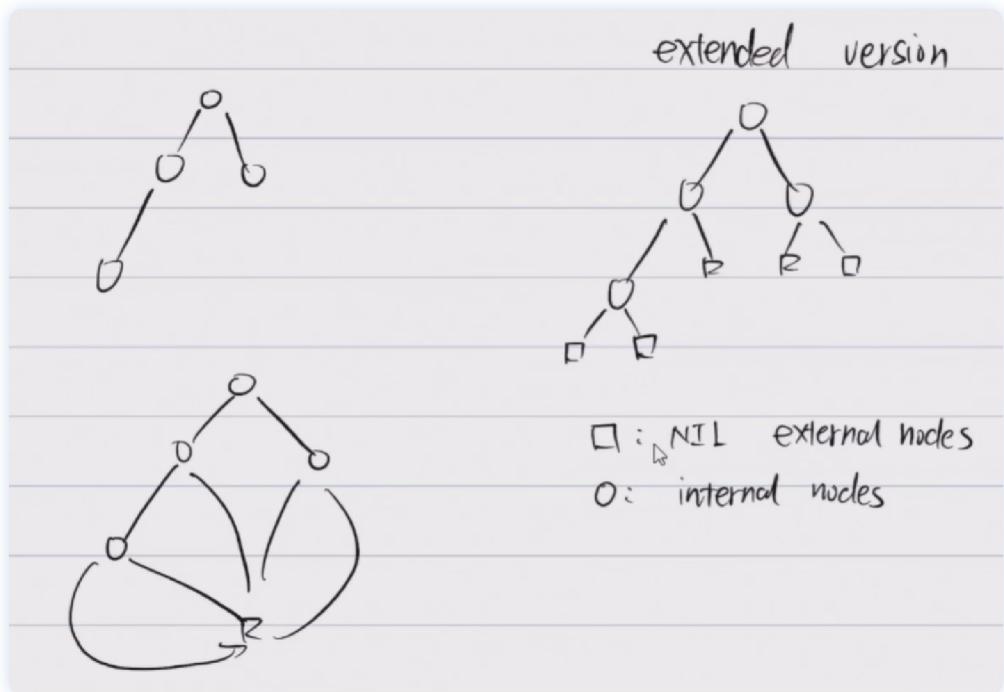
## 引入

complete binary tree: 每一个leaf的height相差最多为1

→ 红黑树：每一个leaf的height相差最多是两倍

实现方法：染色

树的拓展表现形式



- 将空的节点合并为一个节点
- 方块数量 = 圆点数量 + 1

## 定义

A red black tree is a BST whose extended satisfies the following properties:

1. node color: red or black
2. root is black
3. leaves (NIL) are black
4. children of red must be black
5. for each node  $v$ , all descending paths from  $v$  to leaves contain **the same number(excluding  $v$ )** of black nodes  
 $\rightarrow$  black height of  $v$ :  $bh(v)$  of black nodes  $\rightarrow bh(T) = bh(\text{root})$

结合45可推：树上的黑点比红点多且每条路的黑点数目一致 $\rightarrow$ 最长路的height不会超过最短路的两倍，且  $h(T) \leq 2 * bh(T)$

## 证明

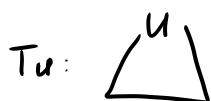
1. 树的高度是  $O(\log N)$  数量级的

LEMMA: A RBT(in extended version) with  $n$  internal nodes has height of at most  $2\log_2(n + 1)$ .

~~红黑树~~

Proof:

首先我们定义，一棵树  $T$  中的节点  $u$ ，记  $T_u$  为以  $u$  为 root 的子树， $size(T_u)$  则为此子树内部节点的个数。



$$size(T_u) = \# \text{ internal nodes}$$

我们需要证明： $\text{size}(Tu) \geq 2^{bh(u)} - 1$  for any  $u$   $\rightarrow \text{size}(T) \geq 2^{bh(T)} - 1 \rightarrow bh(T) \leq \log_2(n+1) \rightarrow h(T) \leq 2\log_2(n+1)$

归纳法：base case:  $h(T_u) = 0$

$$u: \emptyset \quad \text{size}(Tu) = 0 \quad bh(T_u) = 0 \\ \Rightarrow \text{size}(Tu) \geq 2^{bh(u)} - 1$$

Inductive hypothesis:

Assume that for all  $T_u$  with  $h(T_u) \leq k$ ,  $\text{size}(Tu) \geq 2^{bh(u)} - 1$

Inductive Step: when  $h(T_u) = k+1$ .

$$\begin{array}{c} u \\ / \quad \backslash \\ v_1 \quad v_2 \end{array} \Rightarrow \text{size}(Tu) = 1 + \text{size}(Tv_1) + \text{size}(Tv_2) \\ \geq 2^{bh(v_1)} - 1 + 2^{bh(v_2)} - 1 + 1 \\ \geq 2 \cdot 2^{bh(u)-1} - 1 \\ \text{又 } \because \begin{array}{l} bh(v_1) \geq bh(u)-1 \\ bh(v_2) \geq bh(u)-1 \end{array} \Rightarrow = 2^{bh(u)} - 1 \end{array}$$

2. 维持性质的代价是  $\log(N)$  级别的。

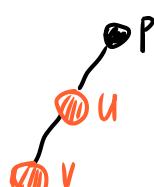
## ① Insertion

步骤

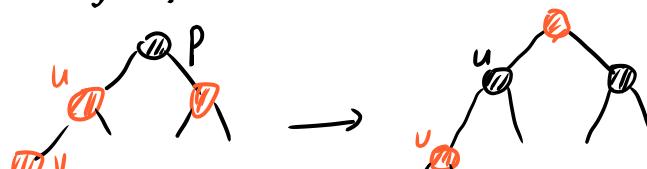
1. insert as in BST

2. make the new node red

考虑插入节点的 parent — block 不用任何维护  
red 维护 分成左右两种情况，由对称，考虑 new node 在左的情况



3. case1:  
sibling of u is red



第5条性质依然√

考虑 (a) P is root, mark P as black, done

(b) parent of P is black, done

(c) parent of P is red, violation

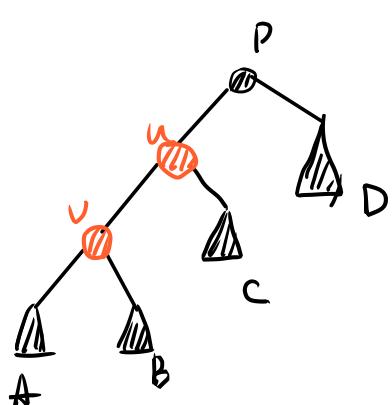
goes upwards

继续递归

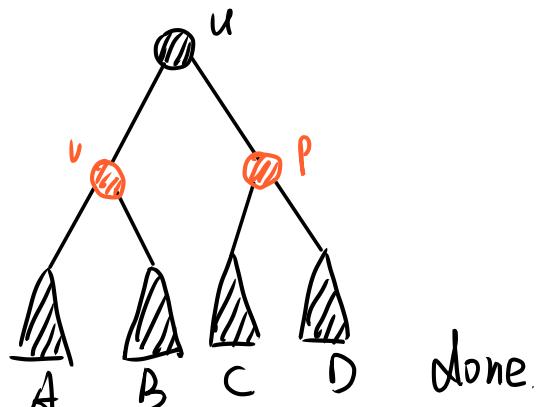
case 2.

sibling of u is black

case 2.1 v is left child

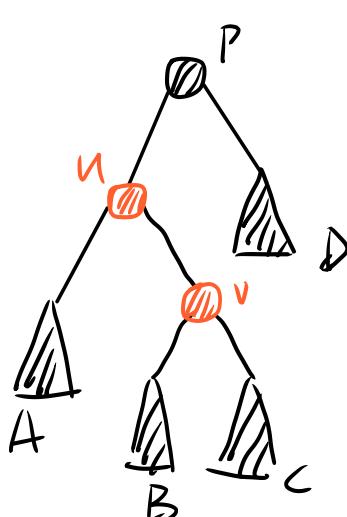


把 u 捡起来  
rotate

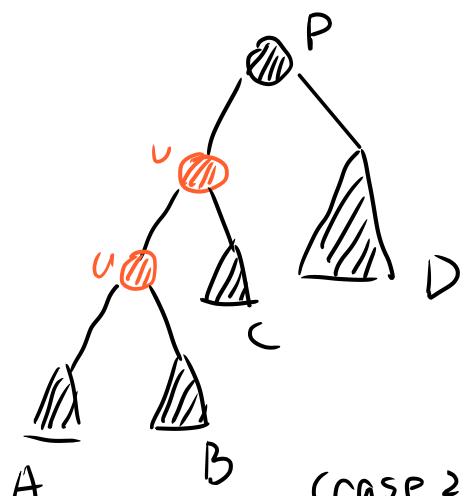


done

case 2.2 v is right child of u.

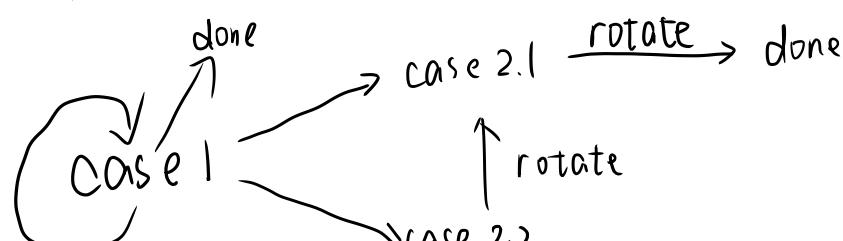


把 v 捡起来  
left rotation



(case 2.1)  
再转一次

流程图：



时间复杂度：① 插入  $\log(N)$

② “向上推”流程最多为树高  $\log(N)$

③ rotate 最多两次

$$\begin{aligned}\Rightarrow \text{总} &= O(\log N) + O(\log N) \cdot O(1) + O(1) \cdot 2 \\ &= O(\log N)\end{aligned}$$

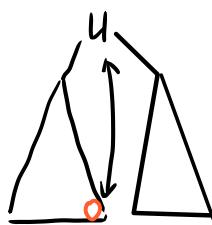
## ② deletion

步骤：

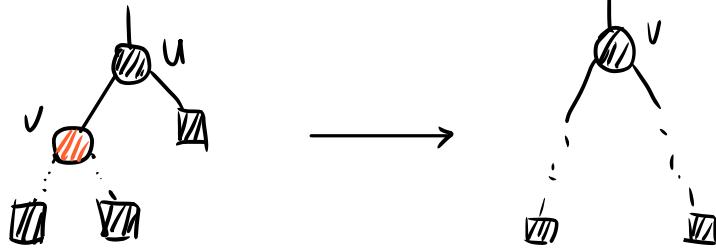
1. delete it as in BST

\* 只交换 key，不交换颜色

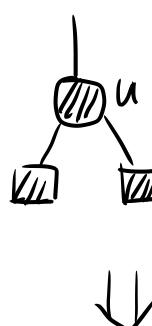
→ deleted node u has one most child (excluding NULL)



2. case 1:

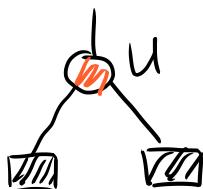


case 3.



直接删会使得  
RBT 的第5条性质不  
满足

CASE 2:



直接删风险即而

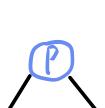
处理双层黑问题

$P^+$   
left ↑ right  
对称，仅考虑此情况

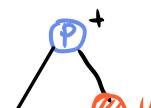
双层黑问题：

case 1 the sibling<sup>"</sup> of  $P^+$  is black

case 1.1 children of u are all black



把 u 的黑向上推一层





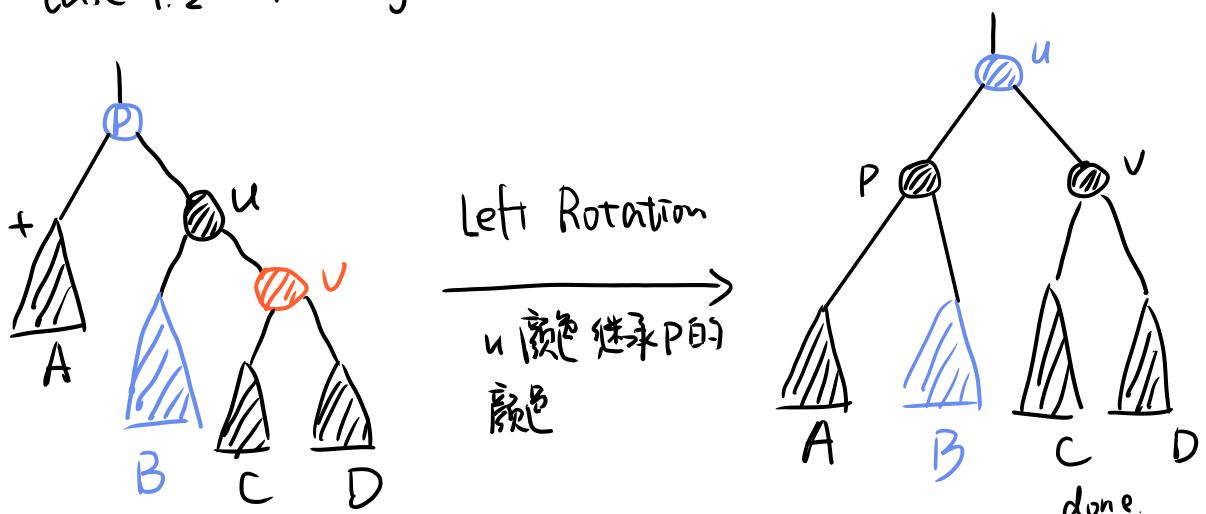
(a) P is the root, 直接把加号去掉, done

(b) P is red, mark P as black, done

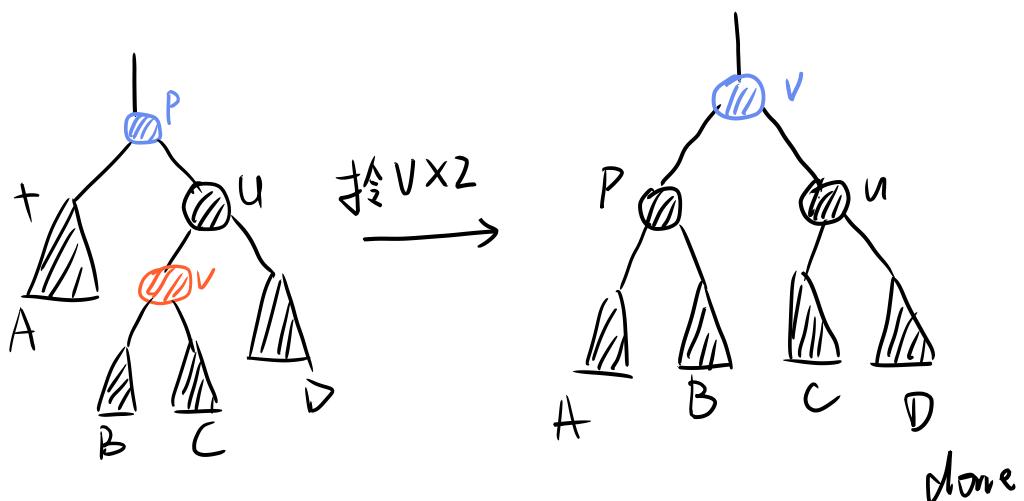
(c) P is black (not root), P becomes double black

把问题向上推了一层

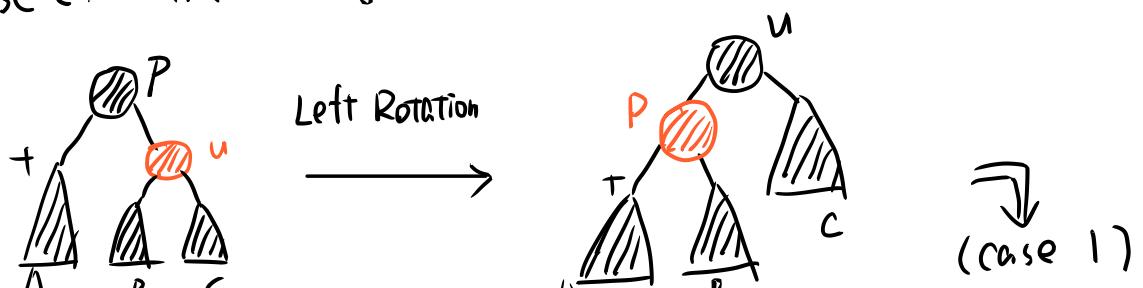
case 1.2 the right child of u is red

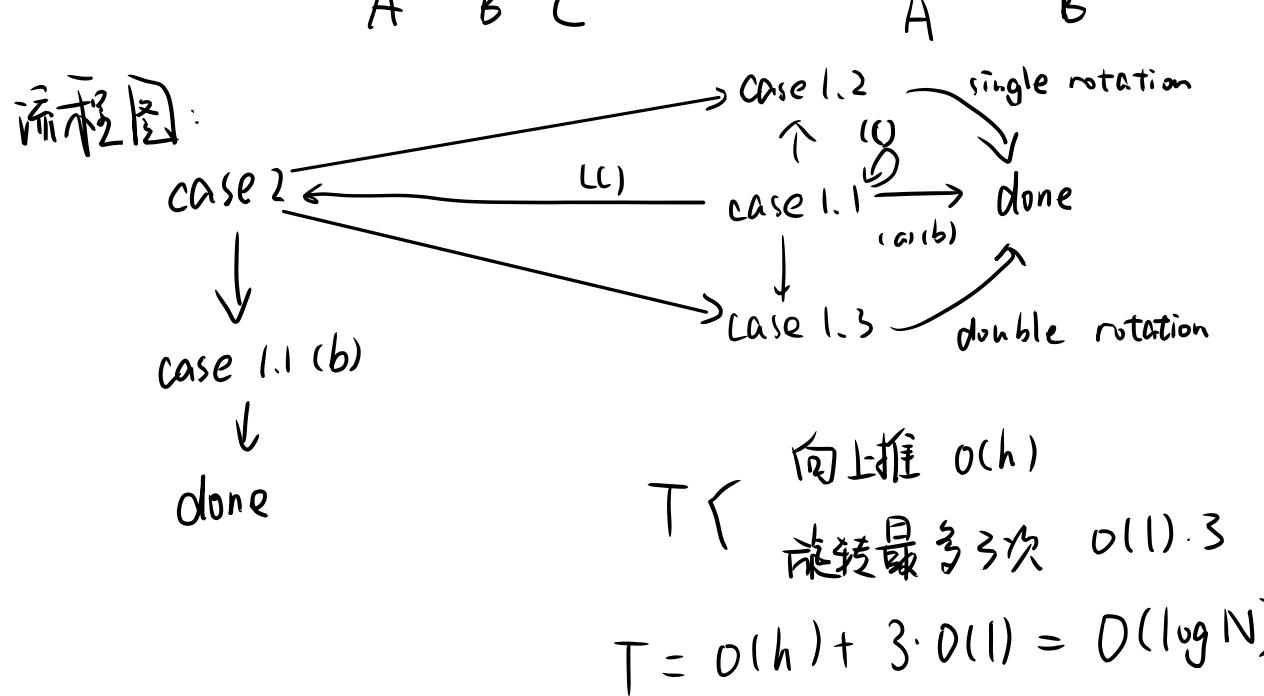


case 1.3 the right child of u is black.  
the left child of u is red



case 2. the sibling of 0+ is red





	AVL	RBT
height	$\approx \log_{1.618} N$ ✓	$\approx 2 \log_2 N = \log_{\sqrt{5}} N$
insertion	2# rotation ✓	2# rotation
deletion	$O(\log N)$ #rotation	3# rotations ↗

## 均摊分析

previous: worst-case bound for a single operation  
 amortized: worst-case bound for a sequences operation  
 $\downarrow$   
 from empty structure

e.g.  
 Dynamic Array

- $A[i]$
- Insertion

•  $O(n)$  space



$m=2$   $\boxed{\text{V} \text{ V}} \rightarrow \boxed{\text{V} \text{ V} \square \square}$

$m=3$   $\boxed{\text{V} \text{ M} \text{ V}}$   $\xrightarrow{\text{插入扩容}}$

$m=4$   $\boxed{\text{V} \text{ V} \text{ V} \text{ V}} \rightarrow \boxed{\text{V} \text{ V} \text{ V} \text{ V} \square \square \square}$

$m=5$   $\vdots$

$m=6$

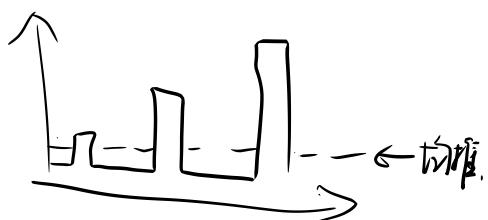
Insertion  $\xrightarrow{-\text{一次的 worst case: } O(n)}$  但发现扩容很贵 但次数少

$T(m) = \text{cost of the worst sequence of insertion.}$

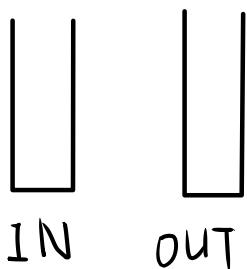
$$= cm + \underbrace{2^0 \cdot 3c + 2^1 \cdot 3c + 2^2 \cdot 3c + \dots + 2^{i-1} \cdot 3c}_{\substack{\uparrow \\ \text{写} \\ \text{扩容}}} \quad i = \lfloor \log_2 m \rfloor$$

$$= cm + 3c \cdot (2^{\lfloor \log_2 m \rfloor + 1} - 1) \leq cm + 6cm = 7cm$$

平均每次操作  $\frac{T(m)}{m} = 7c \leftarrow O(1)$   
 法 amortized cost



eg2. 考虑 Two-Stack Queue 数据结构



enqueue( $x$ ):

IN.push( $x$ )

dequeue( $x$ ):

If OUT not empty  
 OUT.pop()

else if IN not empty

while IN not empty

$x = \text{IN.pop()}$

OUT.push( $x$ )

OUT.pop().

enqueue:  $O(1)$

dequeue: # elements moved

"在一次很贵的 dequeue 前一定有很多次便宜的 enqueue."  
考虑之后的做法 - 什么是 worst sequence? 不好找

## 法2. Accounting Method.

$$\text{amortized cost} = \text{actual cost} + \frac{\text{credit}}{\text{存取款变化}}$$

$$\sum \text{amortized cost} = \sum \text{actual cost} + \sum \text{credit}$$

$$\sum \text{credit} \geq 0 \quad \text{"不欠钱"}$$

$$\sum \text{amortized cost} \geq \sum \text{actual cost}$$

$\Rightarrow$  考虑 eg2.

	actual cost	credit	amortized
enqueue	$c$	$2c$	$3c$
dequeue	$2c$ # elements moved $+ c$	$-2c$ # elements moved	$c$ $\downarrow$ $D(1)$ amortized cost

要保证不欠钱  $\Rightarrow$  证明: 每一个 enqueue 和后的 dequeue |  
最多  $2c$ .

用函数记录总存款的量:

$\Phi(i)$ : total # credits in the bank after the  $i$ th operation

$\Rightarrow$  改写上面的 accounting method:

$$\text{amortized cost} = \text{actual cost} + \underbrace{\Phi(i) - \Phi(i-1)}_{\text{of } O_i} \text{ 就是第 } i \text{ 步的 credit}$$

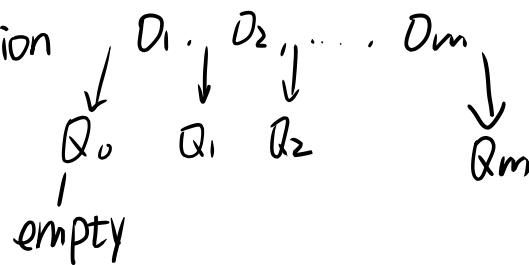
$$\Phi(i) \geq \Phi(0) \quad (\text{不欠钱})$$

↑

势能函数 potential function 法3

$\Phi(Q)$  = (# element in Stack In) - 2c (定义 eg2 的势能函数)

for any sequence of operation



$$\Phi(Q_0) = 0, \quad \Phi(Q_i) \geq 0$$

if  $O_i = \text{enqueue}$  ,  $\hat{d}_i = d_i + 2C = C + 2C = 3C$

if  $D_i = \text{deque}$ ,  $\hat{d}_i = C + 2C \cdot \# \text{elements moved} - \# \text{elements moved} \cdot 2c = C$

给出均摊费用定义: Given  $k$  types of operation  $1, \dots, k$  with actual cost

$T_1(D), \dots, T_k(D)$ , we say they have amortized cost  $A_1(D), \dots, A_k(D)$ , if  
 通常<sup>↑</sup>是与当前数据结构D相关的函数, by an insertion of a BST  $T(D) = \text{height of } D$ )

for any  $m > 0$ , for any sequence of  $m$  operations  $D_1, D_2, \dots, D_m$

$$\sum_{i=1}^m A_{\text{type}(v_i)}(D_{i-1}) \geq \sum_{i=1}^m T_{\text{type}(v_i)}(D_{i-1})$$

potential function:  $\Phi: \mathcal{D} \rightarrow \mathbb{Z}$       -  $\Phi(D) \geq \Phi(\text{empty})$  for any  $D \in \mathcal{D}$   
 fix      - for any  $t \in [1, 2, \dots, k]$ ,  $A_t(D) = T_t(D) + \underbrace{\Phi(D)}_{\substack{\uparrow \\ \text{after operation } t}} - \Phi(D')$

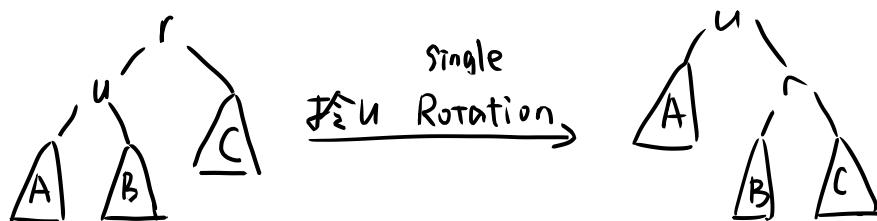
# Splay Tree

- ∴  $\Theta(n)$  in worst case
  - ∴  $O(\log n)$  amortized cost
  - ∴ easy to implement
  - ∴ no extra space

(基于 BST 的)

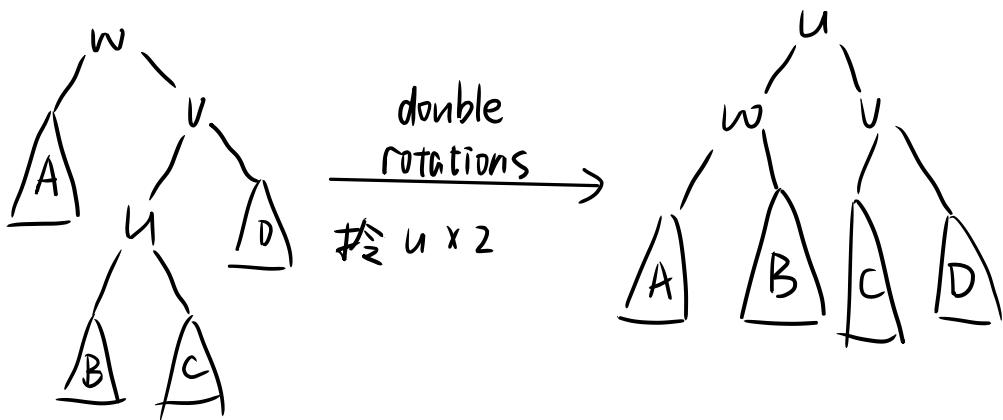
splay(u): repeat the follows until u is the root

case 1. u is a child of the root (对称情况略)

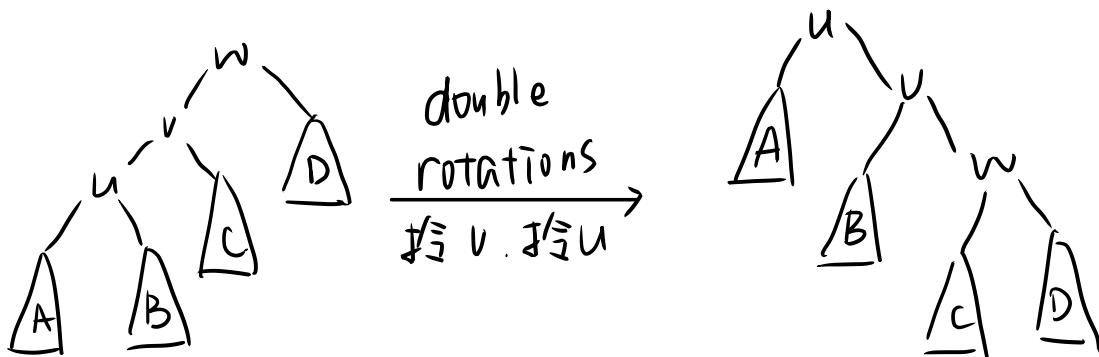


case 2.  $u$  has a grandparent

case 2.1 zig-zag (对称情况)



case 2.2 zig-zig (对称情况)



findkey:

1. find as in BST
2. splay the node you found

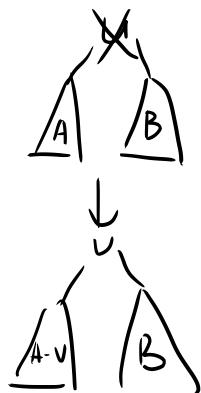
Insert:

1. insert as in BST
2. splay the new node

delete( $u$ ):

1. splay( $u$ )
2. if  $u$  has only one child  $\rightarrow$  delete  $u$  directly
- else  $u$  has two children  $\rightarrow$  ① delete  $u$   
② splay the largest element in A

③ attach  $B$  to  $v$



证明以上三种操作均摊费用为  $O(\log N)$

Observation

actual cost of each operation is  $c \cdot \# \text{rotations}$   
amortized cost =  $c \cdot \lg n \leftarrow \text{goal}$

$\Delta \Phi = c \cdot \lg n - c \cdot \# \text{rotations}$  由目标推出势函数变化值  
↓ 定义势函数

Given a BST  $T$ , for each  $u \in T$ ,  $\text{size}(u) = \# \text{nodes in } T_u$   
 $\text{rank } r(u) = \lg(\text{size}(u)) \rightarrow$  定义势函数:

$$\Phi(T) = c \cdot \sum_{u \in T} r(u), \quad \Phi(\text{empty}) \geq 0, \quad \Phi(T) \geq 0$$

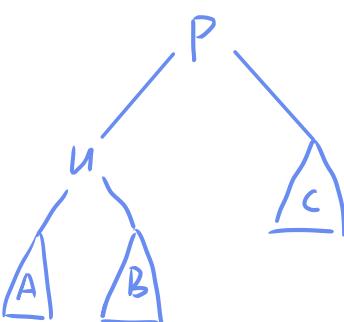
LEMMA: let  $T$  be a splay tree. let  $u \in T$

(let  $T'$  be the tree obtain from  $T$  by performing  $\text{splay}(u)$ )

$$\Phi(T') - \Phi(T) \leq 3c[r'(u) - r(u)] - 2c[\# \text{rotations} - 1]$$

↓  
rank of  $u$  in  $T'$       during  $\text{splay}(u)$

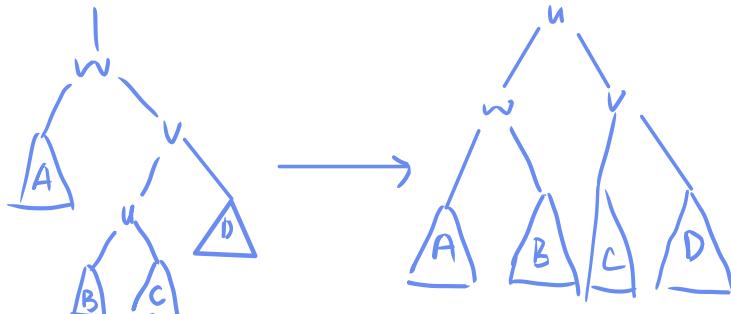
proof: case 1.  $u$  is a child of root



$$\frac{\Delta \Phi}{c} = r'(u) - r(u) + r'(P) - r(P) \\ \leq r'(u) - r(u) \\ \leq 3[r'(u) - r(u)] - 2(\# \text{rotations} - 1)$$

相等抵消

case 2.1 zig-zag

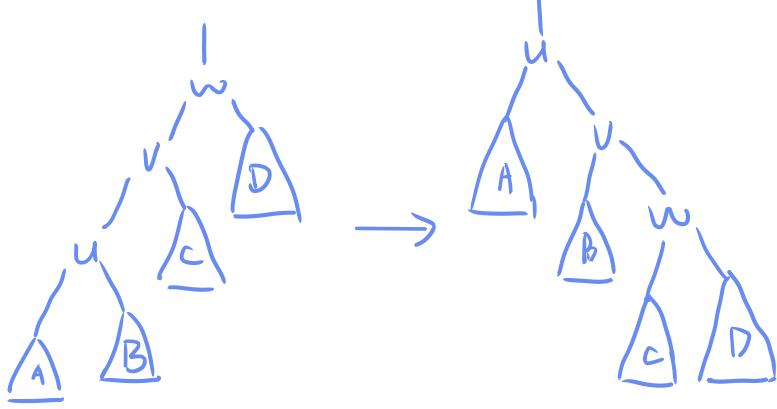


$$\frac{\Delta \Phi}{c} = r'(u) - r(u) + r'(v) - r(v) + r'(w) - r(w) \\ = r'(v) + r'(w) - r(u) - r(v) \\ \leq r'(v) + r'(w) - 2r(v)$$

$\text{size}(v) + \text{size}(w) + 1 = \text{size}(u')$   
 $\Rightarrow r'(v) + r'(w) \leq 2r'(u) - 2$

$$\leq 2r'(u) - 2r(u) - 2 \\ \leq 3(r'(u) - r(u)) - 2(\# \text{rotations} - 1)$$

## CASE 2.2 zig-zig



$$\begin{aligned}
 \Delta \frac{\Phi}{c} &= r'(u) - r(u) + r'(v) - r(v) + r'(w) - r(w) \\
 &\leq r'(w) - r(u) + [r'(v) - r(v)] \quad \text{放缩成 } r'(u) - r(u) \\
 &\leq r'(w) + r'(u) - 2r(u) \\
 &\leq r'(w) + r(u) + r'(u) - 3r(u). \\
 \boxed{\begin{aligned}
 \text{size}'(w) &= |C| + |D| + 1 \\
 \text{size}(u) &= |A| + |B| + 1 \\
 \text{size}'(w) + \text{size}(u) + 1 &= \text{size}'(u) \\
 \downarrow \\
 r'(w) + r(u) &\leq 2r'(u) - 2
 \end{aligned}}
 \end{aligned}$$

$$\begin{aligned}
 \Rightarrow &\leq 3[r'(u) - r(u)] - 2 \\
 &\leq 3[r'(u) - r(u)] - 2(\# \text{rotations} - 1).
 \end{aligned}$$

接下来使用 LEMMA 让我们三种操作的均摊费用:

### ① findkey:

1. find as in BST
2. splay the node you found

$$\begin{aligned}
 \text{actual cost} &= c \cdot \# \text{rotations} \\
 \Delta \frac{\Phi}{c} &= 3c \cdot [r'(u) - r(u)] - 2c \cdot (\# \text{rotations} - 1) \\
 &\leq 3c \cdot \lg n - 2c \cdot \# \text{rotations} + 2c
 \end{aligned}$$

$$\begin{aligned}
 \text{amortized cost} &\leq 3c \cdot \lg n - 2c \cdot \# \text{rotations} + 2c + c \cdot \# \text{rotations} \\
 &\leq 3c \cdot \lg n + 2c \leq 5c \cdot \lg n
 \end{aligned}$$

### ② Insert:

1. insert as in BST
2. splay the new node

$$\begin{aligned}
 \text{actual cost} &= c \cdot \# \text{rotations} \\
 \Delta \frac{\Phi}{c} &= \# \text{rotations} + 3c \cdot [r'(u) - r(u)] - 2c(\# \text{rotations} - 1) \\
 &\text{第一阶段的增量是 } h \leq 3c \cdot \lg n - (2c - 1) \# \text{rotations} + 2c \\
 &\text{这里 } h = \# \text{rotations} \leq 3c \cdot \lg n + 2c \leq 5c \cdot \lg n
 \end{aligned}$$

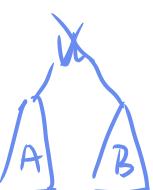
### ③ delete(u):

1. splay(u)
2. if u has only one child  $\rightarrow$  delete u directly  $\rightarrow$  和 insert一样

else u has two children  $\rightarrow$  ① delete u

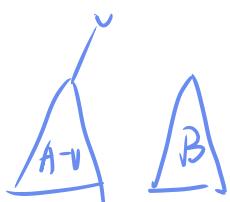
② splay the largest element in A  $\Delta 2$

③ attach B to u  $\Delta 4$



$$\Delta_2 = -\lg(|A| + |B| + 1).$$

(rank(u))



$$\Delta 4 = \lg(|A| + |B|) - \lg(|A| + 1)$$

$\Delta 2 + \Delta 4 \leq 0$  放缩

反考慮  $\Delta_1 + \Delta_3$ :  $\Delta_2 \leq \Delta_1 + \Delta_3$   
amortized cost  $\leq$  actual cost +  $\Delta_2$   
 $\leq \# \text{rotations in step 1} + \Delta_1 + \# \text{rotations in step 2} + \Delta_3$   
 $\leq 3C \cdot \lg n + 2C + 3C \cdot \lg n + 2C \leq 10C \cdot \lg n$