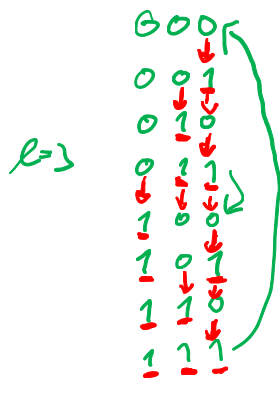


Coin method

Ex: binary counter: INC (increment),  $l$  bits, unit cost = 1 bit flip



$\Theta(l)$  worst case

bit  $i$  changes once in every  $2^{i-1}$  operations

$\Rightarrow$  INCS  $\Rightarrow$  by aggregation  $\sum_{i=1}^l \left\lfloor \frac{n}{2^{i-1}} \right\rfloor \leq n \sum_{i=1}^{\infty} \frac{1}{2^{i-1}} = 2n$

$\Rightarrow \Theta(1)$  amortized time

paying in advance: 2 coins for each operation (bitcoins)  
 (1 coin for  $0 \rightarrow 1$ , 1 coin stored on the heap)  
 for  $1 \rightarrow 0$ , use the stored coins

$\Rightarrow \Theta(1)$  amortized time

Potential method (general approach)

goal: compensate "expensive" operations by "cheap" ones

$n$  operations, real cost  $R_i$  (upper bounds), amortized cost  $A_i$  (our claim)

after  $i$  operations:  $\Phi_i := \sum_{j=1}^i A_j - \sum_{j=1}^i R_j$  potential "bank account"

$\Phi_i \geq 0$  "never over time"

$\Phi_0 = 0$  (by definition)

ith operation:

potential difference  $\Delta \Phi_i := \Phi_i - \Phi_{i-1} = A_i - R_i = \begin{cases} > 0 & \text{saves time} \\ = 0 & \text{pay exactly} \\ < 0 & \text{spends time} \end{cases}$

Ex: binary counters

$\Phi_i = \# 1's \text{ in } (i)_2$

$A_i = 2, R_i = 1 + \# \text{ trailing } 1's$

$\Delta \Phi_i = 1 - t$

Ex: flexible array

$\Phi_i = \# \text{ operations since last reallocation}$

$A_i = 2$  (1 for APPEND/REMOVE, 1 for potential)

$R_i = \begin{cases} 1 & \text{no realloc} \\ 1 + \Theta(c) & \text{with realloc} \end{cases}$  (rescale the potential)

What is amortized cost?

$A_i := R_i + \Delta \Phi_i$  (when potential defined first)

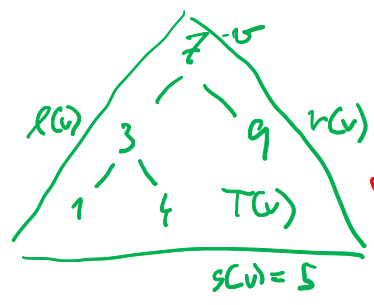
after  $n$  operations:  $\sum_{i=1}^n A_i = \sum_{i=1}^n (R_i + \Phi_i - \Phi_{i-1}) = \sum_{i=1}^n R_i + \underbrace{\Phi_n - \Phi_0}_{\geq 0}$

$\Rightarrow \sum$  real costs bounded by  $\sum$  amortized costs  $\checkmark$  (telescopic sum, we need  $\geq 0$ )

- Summary: "recepty"
- 1) choose unit cost (time/space linear is it)
  - 2) estimate real costs (upper bounds)
  - 3) choose an appropriate potential  $\Phi$  (i.e. counting something in the structure)
  - 4) show that  $\Phi_m - \Phi_0 \geq 0$  (never go bankrupt)
  - 5) aim for  $A_i := R_i + \Delta\Phi_i$  to be small

Lazy balanced BSTs (example for amortized complexity)

idea: let the structure "degrade", but occasionally rebuild it (locally)



Notation: for a node  $v$  in BST  
 $T(v)$  ... subtree rooted at  $v$  (including  $v$ )  
 $s(v)$  ... size of  $v := \#$  nodes in  $T(v)$   
 $l(v), r(v)$  ... left, right child of  $v$  ( $\emptyset$  if child missing)  
 not p.b. but balanced

Def: BST is perfectly balanced if  $|s(l(v)) - s(r(v))| \leq 1$  for every  $v$  (ratio 1:1 (almost))

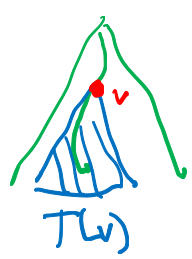
☺: sorted  $n$  keys  $\implies$  perfectly balanced BST can be built in  $\Theta(n)$  time.

Def: a node  $v$  is in balance if  $s(c) \leq 2/3 s(v)$  for each child  $c$  of  $v$  (between 1:2 and 2:1)  
 BST is balanced if all its nodes are in balance.

☺: The height of a balanced tree with  $n$  nodes is  $O(\log n)$ .

Pf:  $h \leq \log_{2/3} n$   $1 \leq (\frac{2}{3})^h n \implies h \leq \log_{2/3} (1/n) = \log_{3/2} n = O(\log n)$

INSERT (lazy): standard INSERT in BST  $\leftarrow$  keep  $s(v)$  at each  $v$   
 update  $s(v)$  in each  $v$  on the path to the root  
 if all nodes in balance, stop.  
 else REBUILD  $(T(v))$  at the highest out-of-balance node  $v$   
 perfectly balanced BST in time  $\Theta(s(v))$



Thm: INSERT works in  $O(\log n)$  amortized time.

Potential  $\Phi := \sum_v \varphi(v)$  (sum of contributions)  
 $\varphi(v) := \begin{cases} |s(l(v)) - s(r(v))| & \text{if at least 2} \\ 0 & \text{otherwise} \end{cases}$  (think why)

amortized cost of INSERT:

a) without rebuild

$O(\log n) + O(\log n) = O(\log n)$   
 ↑ real cost      ↑ change of potential (each  $\varphi(v)$  increases by  $\leq 2$  on the path)

b) rebuild at node  $v$

w.l.o.g.  $s(l(v)) > 2/3 s(v) \Rightarrow s(r(v)) < 1/3 s(v)$   
 $\Rightarrow \varphi(v) = 1/3 s(v)$  this drops to 0 in  $\Phi$   
 $\Rightarrow \Delta\Phi \leq -1/3 s(v)$  potential drops by at least  $1/3 s(v)$

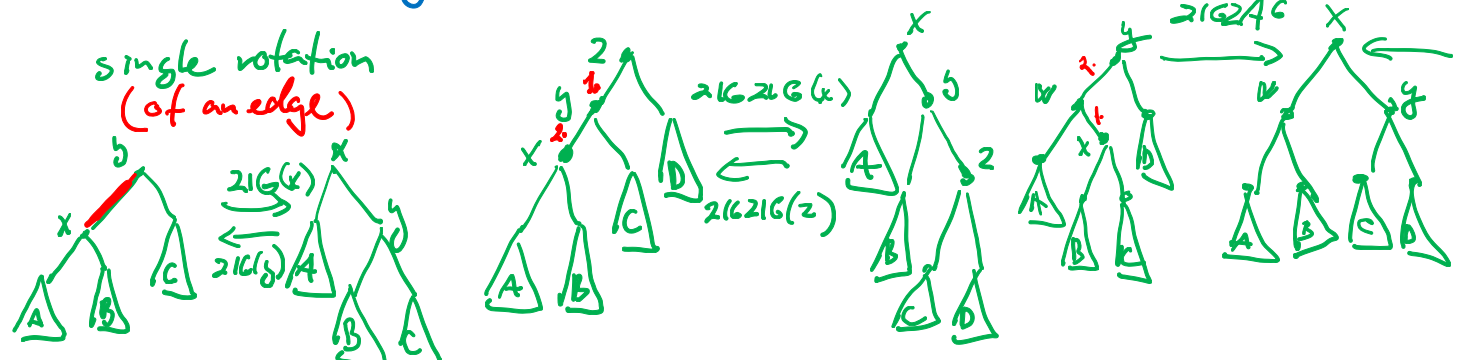
amortized cost of REBUILD =  $\Theta(s(v)) + c \cdot \Delta\Phi \leq 0$   
 (i.e. for free)      ↑ real cost      for a suitable constant  $c$ .  
 (rescaling the potential, amortized costs)

$\Rightarrow O(\log n)$  amortized time for INSERT  $\square$

Splay trees (intro)

self-balancing BST with  $O(\log n)$  amortized costs

SPLAY(x) ... bring x to the root, preferring double rotations:



zig only if x child of the root, otherwise zig-zig or zig-zag

IDEA: always splay the lowest visited node (at the end of each operation).