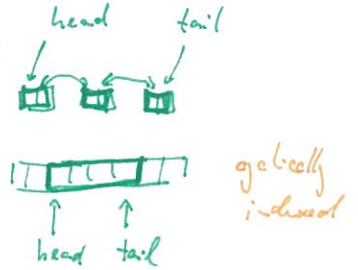


introduction - see wwww

Preliminaries

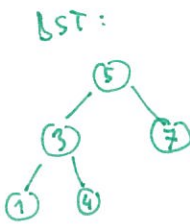
DS: { data + operations (queries / updates) } "black-box" interface
 { implementation \Rightarrow complexity of operations }
 static DS (only queries) / dynamic

Examples: • Queue: Enqueue(x) $O(1)$ implementations:
 (sequence of items) Dequeue $O(1)$ linked list
 (abstract) IsEmpty $O(1)$ array



(• Stack: Push(x) Pop IsEmpty similar)

• Set: (of keys)	Insert(x)	^{is there already?} $O(n)$	$O(n)$	$O(n)$	$O(\log n)$	$O(n)$
	Delete(x)	$O(n)$	$O(n)$	$O(n)$	$O(\log n)$	$O(n)$
	Find(x)	$O(n)$	$O(n)$	$O(\log n)$	$O(\log n)$	$O(n)$
	Build($x_1 \dots x_n$)	$O(n)$	$O(n)$	$O(n \log n)$	$O(n \log n)$	$O(n)$
						\uparrow average complexities



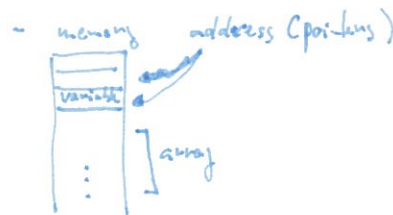
• modification: key + value (dictionary)

• ordered set:	MIN/MAX	$O(n)$	$O(n)$	$O(1)$	$O(\log n)$	$O(n)$
	SUCC(x)	$O(n)$	$O(n)$	$O(\log n)$	$O(\log n)$	$O(n)$
	PRED(x)	$O(n)$	$O(n)$	$O(\log n)$	$O(\log n)$	$O(n)$

\uparrow
disadv.

Model of computation

RAM



- memory allocator

- standard arith. + logic instructions (compare, loop, ...)

assumption: all integers used $\leq \text{poly}(\text{len}(I), \text{max}(I))$

- time = #instructions performed

- space = # cells used (including empty cells between used cells) the smallest and largest accessed addresses

Amortized complexity - intuition first

Aggregation method

Example: flexible array: APPEND(x)
 $\Theta(n)$ worst-case time

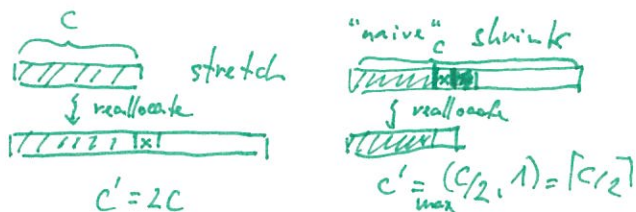


n items \Rightarrow final capacity $2^k, 2^{k-1} < n \leq 2^k$ $C' = 2C$

(aggregated) total time = $2^0 + 2^1 + \dots + 2^{k-1} = 2^k - 1 = \Theta(n) \Rightarrow \Theta(1)$ amortized time

Accounting method

Ex. shrinkable array: APPEND(x)
 (stretch) REMOVELAST



"naive" shrink if $n < C/2$ does not work:

for $n = C + \text{APPEND}(x), \text{REMOVELAST } 2x, \text{APPEND}(x')$

$\Rightarrow \Theta(n)$ amortized time!



"better" strategy: ~~REMOVELAST~~, shrink if $n < C/4$.

n operations, divided in blocks by reallocations



⊙: After stretch/shrink we have $n = C/2 \pm 1$.

\Rightarrow each block contains at least $C/4$ operations, cost $\Theta(C)$ reallocation

accounted to operations in its block $\Rightarrow \Theta(1)$ amortized cost

(Total time is redistributed (accounted) between operations.)

Coin method

Ex. binary counter: INC
 (l-bits) ISZERO



⊙: i th bit changes once in 2^{i-1} increments

initially 0...0, n INCs \Rightarrow aggregation = $\sum_{i=1}^l \lfloor \frac{n}{2^{i-1}} \rfloor \leq \sum_{i=0}^{l-1} \frac{n}{2^i} < n \sum_{i=0}^{\infty} \frac{1}{2^i} = 2n$

$\Rightarrow \Theta(1)$ amortized time

Coin method (cont.)

paying ^{for time} in advance: 2 coins for each INC (one for $0 \rightarrow 1$, one for 1)
 $\Rightarrow \Theta(n)$ amortized time

Lecture 2Potential method (general approach)

goal: compensate "hard" operations by "easy" ones.

in operations, real costs R_i , ^(upper bounds) amortized costs A_i

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

$$\Phi_i \geq 0 \quad (\text{never owe time})$$

$$\Phi_0 = 0 \quad (\text{naturally})$$

potential difference $\Delta\Phi_i = \Phi_i - \Phi_{i-1} = A_i - R_i$

> 0	saves time
$= 0$	pay exact amount
< 0	spends time

ith operation:

Ex. binary counters: $\Phi_i = \#$ of 1's in $(i)_2$

$$A_i = 2, R_i = (\# \text{ of trailing 1's in } i-1) + 1$$

$$\Delta\Phi_i = 1 - t \quad (\text{one 1 created, trailing 1's disappear})$$

shrinkable arrays: $\Phi_i = \#$ of operations since the last reallocation.

$$A_i = 2 \quad (1 \text{ for append/remove, } 1 \text{ for potential})$$

$$R_i = \begin{cases} 1 & \text{no reallocation} \\ 1 + \Theta(n) & \text{reallocation} \end{cases} \quad (\leftarrow \text{idea of multiplying by a constant})$$

What is an amortized cost? \leftarrow sum of real cost + change of potential

$$A_i = R_i + \Delta\Phi_i$$

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

\leftarrow telescopic sum

$\Rightarrow \{ \text{real costs} \}$ bounded by $\{ \text{amortized costs} \}$ \checkmark

Summary: 1) choose an appropriate potential Φ (i.e., counting something in the structure)

2) show $\Phi_m - \Phi_0 \geq 0$ (never owe time)

3) aim for $A_i = R_i + \Delta\Phi_i$ to be small

amortized vs. average complexity