

# Announcements

- S27 (amortized) → HW11. Only need 1x to get it to count
- Midterm Sat - Sun S12 - now (not S25)

## Today

- Doubling array
- Amortized analysis } (S27)

## Array API

new array[n]

- A[i], get(i) — get item @ position i } O(1)-time
- come back to this* A[i] = x — set item @ position i }
- (List) add(x) — adds x to the end

baseArray — array, fixed size, allocated in contiguous block of memory

length — int, keeps track of # items in our DoubblingList

new DL:

baseArray = new array [2<sup>0</sup>]  
length = 0

arbitrary time  
} O(1)

get(i):

if  $i \leq \text{length} - 1$ :  
return baseArray[i]  
else:  
error

} O(1)

add(x):

if length < len(baseArray):  
baseArray[length] = x  
length = length + 1  
else: // baseArray full

} O(1)

nextArray = new array [2<sup>length</sup>] "doubling"  
for  $i \in [0.. \text{length}-1]$ :

} OR

nextArray[i] = baseArray[i]

(deallocate baseArray)

$\Theta(n)$

baseArray = nextArray  
baseArray[length] = x

# items  
in list

e.g. } length+4

memory length

list = new DL()

[ ] 0

list.add(7)

[7] 1

- list.get(1) → error 7 1
- list.add(13)
- list.add(11) 7 | 13 2  
7 | 13 | 11 | ~~3 | 13~~ 3

## Amortized Analysis

Data structure  
Sequence of  $\frac{\# \text{ ops}}{T}$  operations  
(Want to know: worst-case total runtime  
of operations, as a function of  $T$ )

Amortized runtime (Sequence of ops) =  

$$\frac{\text{total runtime}}{\# \text{ ops}}$$

Worst-case sequence of operations  
report amortized time for that sequence.

e.g.

List = new DL()

memory	length	runtime
	0	C

List.add(7)

[7]	1	C
-----	---	---

List.get(1) → error

[7]	1	C
-----	---	---

List.add(13)

[7 13]	2	C
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List.add(11)

[7 13 11] (3+3)	3	$\frac{3C}{n+1}$
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A

$$T = \# \text{ ops} = 5$$

amortized cost of  
this sequence =  $\frac{7C}{5}$

What is a worst-case sequence  
of operations for Doubling List?

try:

new DL

add

time

O(1)

O(1)

T-2	get	$O(1)$
	get	$O(1)$
	.	
	get	$O(1)$

$$\frac{+ O(1)}{\overline{T} \cdot O(1)}$$

$$\text{amortized} = \frac{\overline{T} \cdot O(1)}{\overline{T}} = O(1)$$

Worst-case

T-1	new DL	add	time	length	len(banArray)
			$O(1)$	0	2
			$O(1)$	1	2
			$O(1)$	2	2
			$2 \cdot O(1)$	3	4
			$\{ O(1) \}$	4	4
			$4 \cdot O(1)$	5	8
			$\{ O(1) \}$	6	8
			$O(1)$	7	8
			$O(1)$	8	8

add

7 more  
before  
we double

$8 \cdot O(1)$

9 16

15 more  
before doubling



17 32

$T(\tau)$  = total time of  $\tau$   
add operations

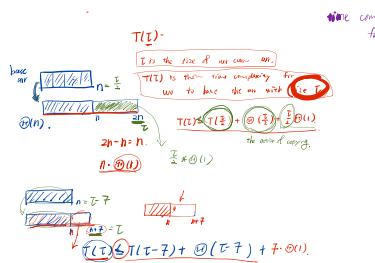
worst case is when last op  
is a doubling  
doubling  
list  
more



$$T(\tau) \leq O(c) + \frac{\tau}{2} \cdot O(1) + T\left(\frac{\tau}{2}\right)$$

for cost + - adds

doubling operation )



between  
last two  
doubling ops

$$\leq c \cdot T + c \cdot \frac{T}{2} + T\left(\frac{T}{2}\right)$$

$$= \frac{3}{2}cT + T\left(\frac{T}{2}\right)$$

unroll

$$= \underbrace{\frac{3}{2}cT}_{+} + \underbrace{\frac{3}{2}c\left(\frac{T}{2}\right)}_{+} + T\left(\frac{T}{4}\right)$$

$$= \frac{3}{2}c\left(T + \frac{T}{2}\right) + T\left(\frac{T}{4}\right)$$

unroll

$$= \frac{3}{2}c\left(T + \frac{T}{2}\right) + \frac{3}{2}c\frac{T}{4} + T\left(\frac{T}{8}\right)$$

$$= \frac{3}{2}c\left(T + \frac{T}{2} + \frac{T}{4}\right) + T\left(\frac{T}{8}\right)$$

$$= \frac{3}{2}c\left(T + \frac{T}{2} + \frac{T}{4} + \frac{T}{8}\right) + T\left(\frac{T}{16}\right)$$

$$= \frac{3}{2}cT \sum_{i=0}^{k-1} \left(\frac{1}{2}\right)^i + T\left(\frac{T}{2^k}\right)$$

Solve for base case  $\frac{T}{2^k} \leq 1$

$$\log_2 T \leq k$$

Plug back in

$$= \frac{3}{2} c T \sum_{i=0}^{\log_2 T} \left(\frac{1}{2}\right)^i + \underbrace{\text{base case}}_{O(1)}$$

Note:  $\sum_{i=0}^{\infty} \left(\frac{1}{2}\right)^i = 2$

$$\leq 3cT \leq O(T)$$

Total time of  $T$  adds  $\leq O(T)$

Amortized time  $\leq \frac{O(T)}{T} = O(1)$ .

List

$$\frac{T(T)}{T} = \frac{O(T)}{T} = O(1)$$

creation

$O(1)$

} worst-case

$O(1)$

$O(1)$  amortized

get

add

Using data structure w/ better amortized runtime to get algorithm w/ better worst-case runtime.

## Dijkstra's Algorithm (shortest paths)

Priority queue

- add  $V$  times
- update priority  $E$  times

Balanced binary tree -  $\Theta(\lg V)$  runtime for all ops

$\Rightarrow O(V+E)\log V$  time for algo

Fibonacci heap

- add  $O(\log n)$  # items =  $V$
- update amortized  $O(1)$  time

$\Rightarrow E$  updates take  $O(E)$  time

$\Rightarrow$  total runtime  $O(V \log V + E)$

P. jkstra  
BBT

sparse case  $E = O(V)$   $O(V \log V)$

dense case  $E = \Omega(V^{1+\epsilon})$   $O(V^{1+\epsilon} \log V)$

Dijkstra  
Fib heap

- $O(V \log V)$
- $O(V^{1+\epsilon})$