

Class Meeting #4

COS 226 — Spring 2018

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Amortization

- When we design and implement algorithms, we often aim to minimize some resources, such as time and memory.
- Often, we cannot guarantee *worst-case* performance, but instead have to settle for average-case.
- Amortized time T per operation $\implies k$ operations cost $\leq k \cdot T$ time steps.
- Not to be confused with expected time.

How to think about amortization?

Real-life examples of amortization:

- Maintenance costs
- Big purchases
- Insurance

Example: condo maintenance

- Expenses:
 - Roof: \$100K, every 20 years
 - Gardening: \$10K/year
 - Elevator: \$300K, when it breaks
 - Fire alarm system: \$50K, every 10 years.
 - ...
- Income: condo fees, stable over time (*if the condo is well-managed): \$5K/month



Long-term cost of condo

- Claim: the long-term cost of maintaining the condo is \$5K/month
- To establish this claim we only need to show that:
- If we collect \$5K/month, we will remain solvent forever.
- Done with careful accounting.
- Amortization “spreads” the \$100K roof over many months

Stack with resizable array

Example from section 1.4

- Maintain stack contents in an array.
- If run out of room...
 double the size of the array

```
public void push(Item item) {  
    if (n == a.length) resize(2*a.length);    // double size of array if necessary  
    a[n++] = item;                             // add item  
}
```

Stack with resizable array

Problem:

- May end up wasting a lot of space:



Stack with resizable array

Solution:

- When array becomes less than quarter full, resize it.

why not half??

```
public Item pop() {
    if (isEmpty()) throw new NoSuchElementException("Stack underflow");
    Item item = a[n-1];
    a[n-1] = null; // to avoid loitering
    n--;
    // shrink size of array if necessary
    if (n > 0 && n == a.length/4) resize(a.length/2);
    return item;
}
```


Cost analysis

- Want to show that the cost of resizing is constant per operation.
- Cost of resizing from n to $2n$ is $\sim 2n$.
- Cost of resizing from $2n$ to n is $\sim n$.
- Collect \$5 for each `push()`, `pop()` operation.
- Pay $\$2n$ to resize from n to $2n$.
- Pay $\$n$ to resize from $2n$ to n .
- Want: show that we'll remain solvent.
- Then, after m ops, collect at most $\$5m$, and so resizing cost $< 5m$

Observation

- After resizing, the array is of size $2n$, and has either n or $n+1$ elements.
- Resizing up:
 - Resize to $2*n$
 - Have $n+1$ elements

```
public void push(Item item) {  
    if (n == a.length) resize( $2*a.length$ ); // double size of array if necessary  
    a[n++] = item; // add item  
}
```

Observation

- After resizing, the array is of size $2n$, and has either n or $n+1$ elements.
- Resizing down:
 - Resize to $2*n$
 - Have n elements

```
public Item pop() {  
    if (isEmpty()) throw new NoSuchElementException("Stack underflow");  
    Item item = a[n-1];  
    a[n-1] = null; // to avoid loitering  
    n--;  
    // shrink size of array if necessary  
    if (n > 0 && n == a.length/4) resize(a.length/2);  
    return item;  
}
```

Saving money for next resize

When will next resize happen?

- Next resize up, will require at least $n - 1$ operations, and will cost $\$4n$.
- Next resize down, will require at least $n/2$ operations, and will cost $\$n/2$.



Accounting

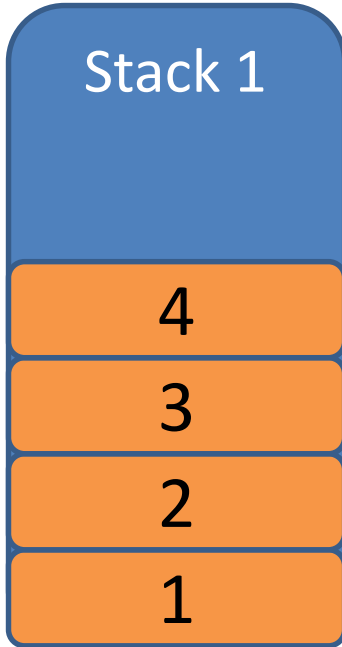
- Case 1: Collect at least $\$5n - 5$, can afford $\$4n$, as long as $n \geq 5$.
- Case 2: Collect at least $\$5n/2$, can afford $\$n/2$.
- Yay!

Algorithm design examples

Problem: given a Stack implementation, implement a queue, subject to the following conditions:

- Use two Stacks
- Amortized constant cost of enqueue() and dequeue()

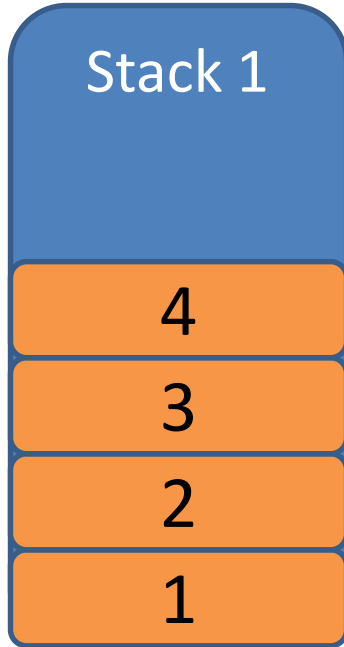
Solution



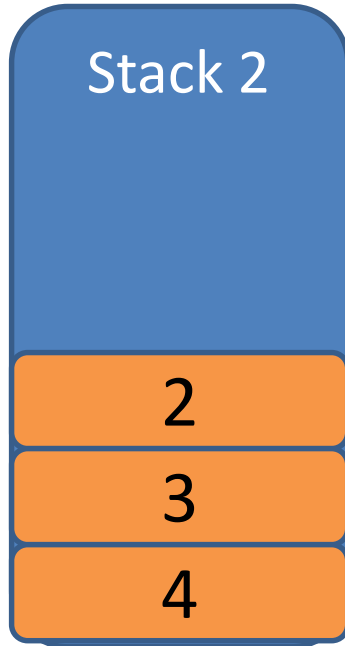
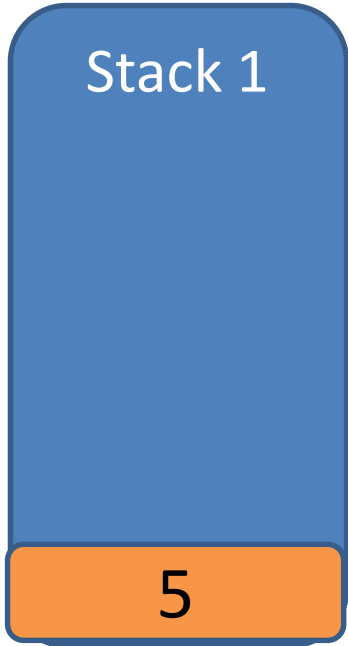
- enqueue(1)
- enqueue(2)
- enqueue(3)
- enqueue(4)
- dequeue()

Solution

- `dequeue()`

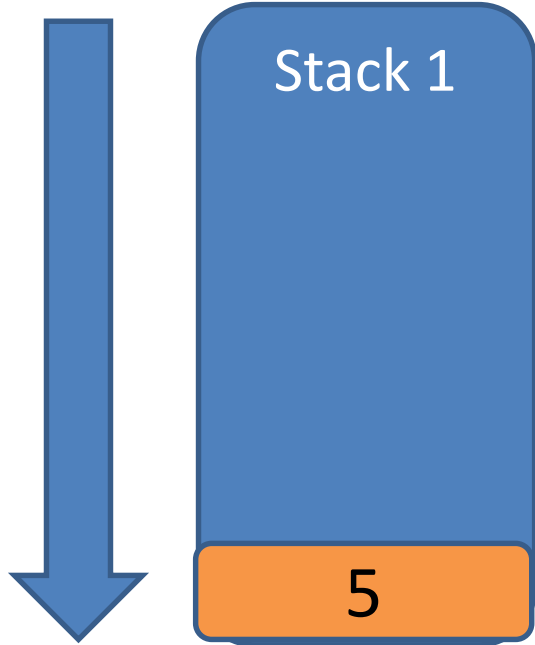


Solution

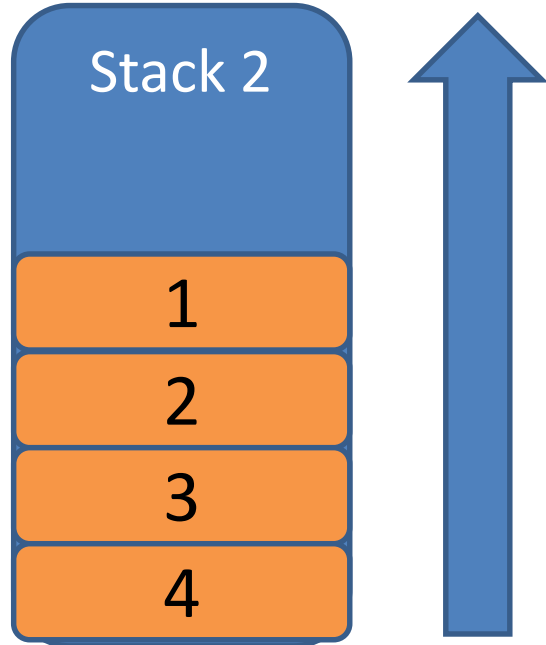


- dequeue()
- dequeue()
- enqueue(5)
- dequeue()

Back of queue



Front of queue



Solution

enqueue(x)

Stack1.push(x)

Solution

```
dequeue()
    if (Stack2.isEmpty())
        if(Stack1.isEmpty())
            return error;
        while(!Stack1.isEmpty)
            Stack2.push(Stack1.pop());

    return Stack2.pop();
```

Amortized analysis

- enqueue() always has cost 1.
- dequeue() may have an arbitrarily high cost.
- Use amortized analysis.

Amortized analysis

- Use amortized analysis.
- Collect \$4 for each enqueued element
- Pay \$1 for each push/pop operation
- Each element is addressed at most 4 times (push into Stack1, pop from Stack1, push into Stack2, pop from Stack2)
- The 4 operations are prepaid, therefore will always remain solvent!
- At any point: Cost so far $\leq 4 * \text{number of enqueue() calls}$.

The 3SUM problem

- Similar in flavor to binary search.
- Given three lists of numbers A , B , C of length n
- Want to know whether there is an element x in A , y in B , z in C such that $x+y=z$.

3SUM

Trivial solution

```
for (int x: A)
    for (int y: B)
        for (int z: C)
            if (x+y==z)
                return true;
return false;
```

Running time? $\sim n^3$

3SUM

- Many solutions in time $\sim n^2$
- Unknown whether can do better.
- Wouldn't be completely shocking if can be done in $\sim n^{1.5}$

3SUM

Start by sorting A and B (cost $\sim n \log n$)

Design a procedure **IsInSum**(A,B,z) which, assuming A and B are sorted, returns whether there is x in A and y in B such that $x+y=z$

IsInSum(A,B,z)

A: ~~1~~, ~~3~~, 7, 12, 18, 22, 26, 31

↑
i

B: 2, 3, 8, 11, 16, ~~21~~, ~~24~~, ~~32~~

↑
j

z=23

32 from B is useless;

24 from B is useless;

1 from A is useless;

....

IsInSum(A,B,z)

```
int i=0;
int j=B.length;
while ((i<A.length)&&(j>0))
{
    if(A[i]+B[j]==z)
        return true;
    if (A[i]+B[j]>z)
        j--;
    else
        i++;
}
return false;
```

Main while() loop runs at most $A.length+B.length$ times, constant cost each.
Total cost linear in n

3SUM

```
sort(A)
sort(B)
for (int z: C)
    if (IsInSum(A,B,z))
        return true;
return false;
```

Assignments tips

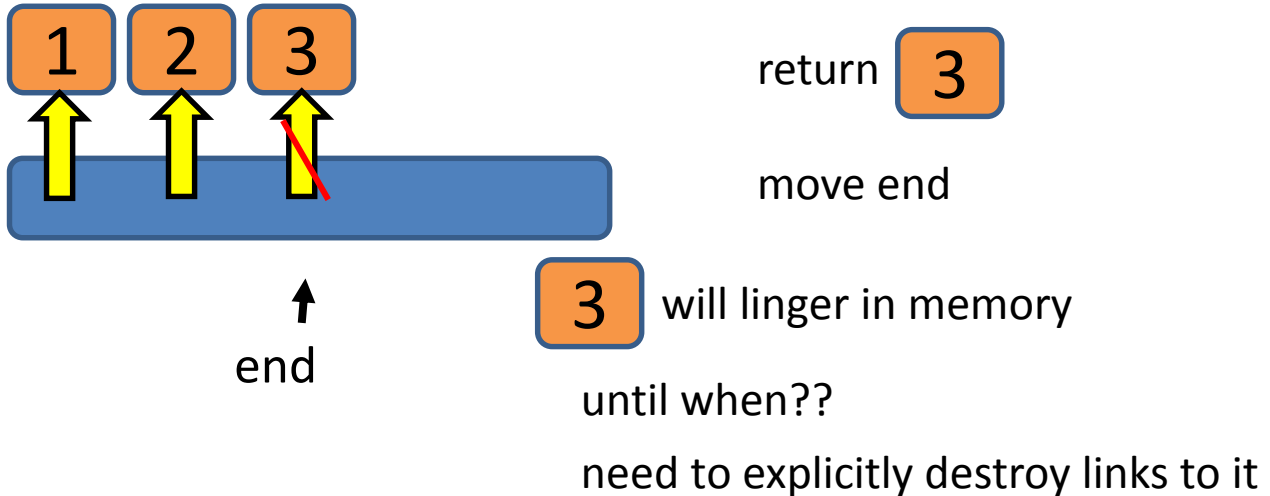


Avoiding loitering

- Loitering:
 - Keeping things in memory after they are no longer needed.
- | | | | | |
|-------------|------|----|-----------|---------------|
| firefox.exe | Mark | 00 | 293,680 K | Firefox |
| chrome.exe | Mark | 00 | 373,024 K | Google Chrome |
- In Java, garbage collection is automatic.
 - “An object is stored as long as someone is pointing at it”

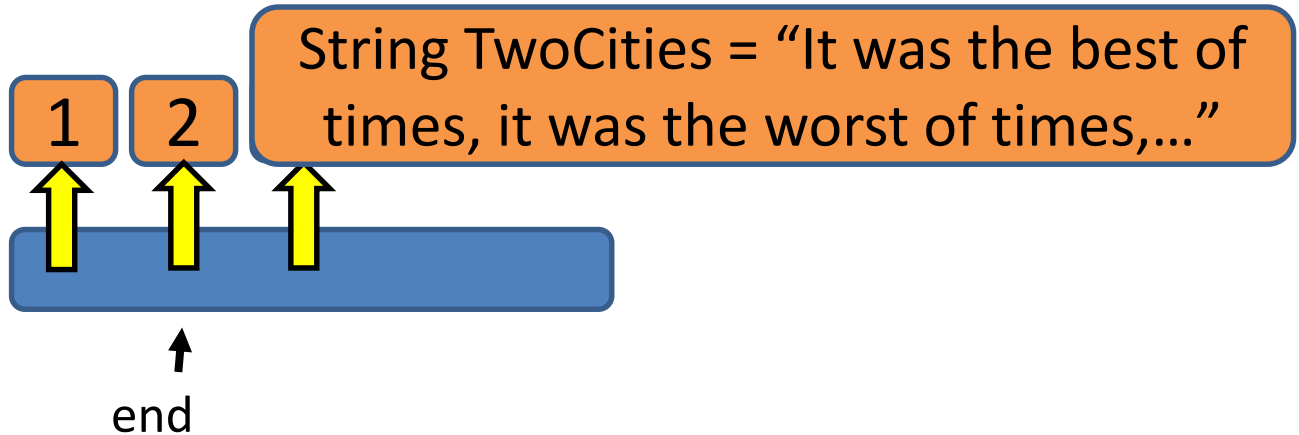
Example: linked list vs resizable array

- When we pop() an element, we may need to actively remove all reference to it.



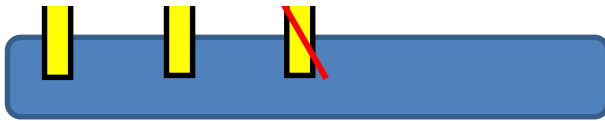
Example: linked list vs resizable array

- Is this a big problem?
- Depends on how big **3** is.



Example: linked list vs resizable array

```
public Item pop() {  
    if (isEmpty()) throw new NoSuchElementException("Stack underflow");  
    Item item = a[n-1];  
    a[n-1] = null; // to avoid loitering  
    n--;  
    // shrink size of array if necessary  
    if (n > 0 && n == a.length/4) resize(a.length/2);  
    return item;  
}
```



move end

↑
end

3 will linger in memory

until when??

need to explicitly destroy links to it

Example: linked list vs resizable array

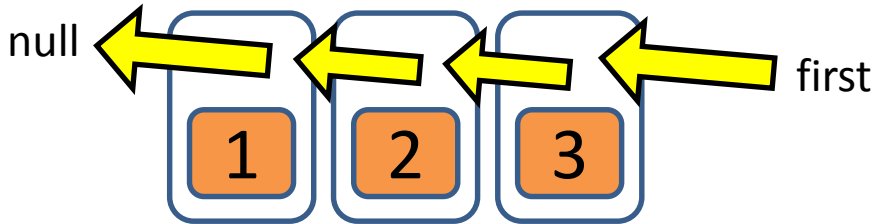
- Removal from linked list implementation of stack

```
public Item pop() {  
    if (isEmpty()) throw new NoSuchElementException("Stack underflow");  
    Item item = first.item;           // save item to return  
    first = first.next;              // delete first node  
    n--;  
    return item;                     // return the saved item  
}
```

Example: linked list vs resizable array

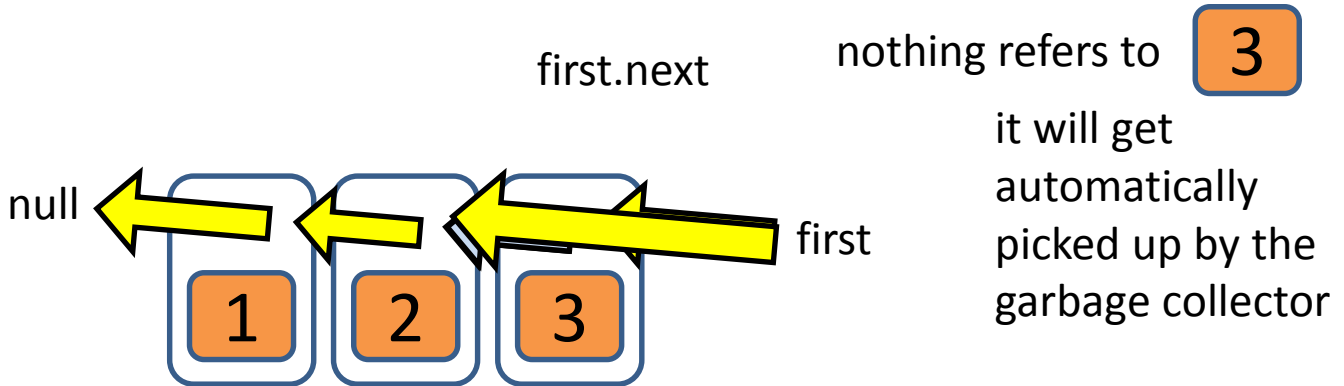
- Removal from linked list implementation of stack

```
private static class Node<Item> {  
    private Item item;  
    private Node<Item> next;  
}
```



Example: linked list vs resizable array

```
public Item pop() {  
    if (isEmpty()) throw new NoSuchElementException("Stack underflow");  
    Item item = first.item;           // save item to return  
    first = first.next;              // delete first node  
    n--;  
    return item;                     // return the saved item  
}
```



Random tips

- Consider sentinel nodes in linked implementations.
 - Often simplifies code/reduces bugs.

```
public class DoublyLinkedList<Item> implements Iterable<Item> {  
    private int n;           // number of elements on list  
    private Node pre;       // sentinel before first item  
    private Node post;      // sentinel after last item
```

- Iterator is just another class.
 - You may put code in its constructor.
 - More: in precept tomorrow.