

CS 310 Lecture

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Worst, Average, or Best Case

- Plan for the worst, hope for the best
- Best case isn't usually helpful (best case is almost always $O(1)$)
- Average case can be helpful but it is typically very hard to prove, or can only be shown probabilistic-ally
- Worst case is the most important (usually)

String Concatenation

- Efficiency analysis needs to consider everything that the computer does
 - Even the stuff that's not obvious!

```
void method8(String[] arr) {  
    String result = "[";  
    for (String s : arr) {  
        result += s + " ";  
    }  
    result += "];"  
    System.out.println(result);  
}
```

In the code above, we might think that `result += s + " "` is constant, but it is in fact linear. Put this inside of a `for` loop and we've got $O(n^2)$ already.

New Topic: List

- Wikipedia: a list or sequence is an abstract data type that represents a countable number of ordered values, where the same value may occur more than once
 - Dynamic array: like `ArrayList` from Java's `Collections` framework
 - Linked lists (either singly or doubly linked)

Outline Today

- Goals today: check how to implement an expandable array similar to `ArrayList`
 - Generic type with type parameters
 - Implementation highlights
 - * Size can grow if needed
 - * Lacking nice `[]` syntax: use `get()` and `set()`
 - * Other convenient operations supported
 - Analyze the complexity

Our Expandable Array

- Using an underlying array to keep data

```
public class MyArrayList<T> {  
    T[] data;  
    int size;  
    ...  
}
```

- Generic class (an array that can hold any type T)
- `data` is a standard fixed sized array
 - Use consecutive locations, no “holes” allowed
- If/when `data` runs out of space, expand it: when? how?
- What is the use of `size`?

Create MyArrayList

```
public class MyArrayList<T> {  
    T[] data; // Holds elements  
    int size; // Virtual size  
    public MyArrayList(); // Initialize fields  
    public int size(); // Virtual size of ArrayList  
    public void add(T x); // Add an element to the end  
    public T get(int i); // Accessing an element  
    public void set(int i, T x);  
  
    // Only replaces an existing element  
    public void insert(int i, T x);  
  
    /// Insert x at position i, shift elements if necessary  
    public T remove(int i);  
  
    // Remove element at position i, shift elements to remove the gap  
    public int indexOf(T x);  
}
```

Expanding Array

- Which methods need to expand?
- When to expand?
 - If/when `data` runs out of space
- How to expand array `data`?
 1. Allocate a new larger array `data2`
 2. Copy from `data` to `data2`
 3. Add new element(s) to `data2`
 4. Update reference: set `data` to `data2`
 5. GC gets the old array

Implementation

- Demo in Java

Key Observations

- Can't do `new T[10]`, instead use `Object[]` + Casting
 - Recall that arrays are covariant and generics are invariant
 - Considered as unsafe operators
 - * We can use `@SuppressWarnings("unchecked")` but only when we absolutely must
- Magic numbers: standard Java `ArrayList` increases the new size to $3/2 * \text{oldSize} + 1$
 - Chose based on engineering experience rather than theory, can use bit shifts to compute the size quickly
 - Similarly, default size = 10

Complexity

- `ArrayList` of size N

Method	Big- O
<code>.size()</code>	$O(1)$
<code>.get(i)</code>	$O(1)$
<code>.set(i, x)</code>	$O(1)$
<code>.add(x)</code>	$O(n)$
<code>.insert(i, x)</code>	$O(n)$
<code>.remove(i)</code>	$O(n)$
<code>.indexOf(x)</code>	$O(n)$

Compare with a Static Array

- Array of size N
- Worst case

Implementation	get/set	add/del at end	add/del at start	add/del in mid	search	can grow?
Static Array	1	1	N	N	N	no
Dynamic Array	1	N	N	N	N	yes

- Wait... we are only occasionally expanding the array, so do we care about all these other things?

Amortized Analysis for `add(x)`

i-th call	1	2	3	4	5	6	7	8	9	10	11	12
size	1	2	4	4	8	8	8	8	16	16	16	16
Cost of doubling/copying			1	2		4			8			
Cost of putting x	1	1	1	1	1	1	1	1	1	1	1	1
Total cost	1	2	3	1	5	1	1	1	9	1	1	1

- Assume that we start with `capacity = 1`
- Assume that we always double the capacity
- Worst case: keep adding, no removing

Dynamic Array Add: Algebraic Approach

- If we always double the array...
- c_i is the cost of the i -th call
 - If $i - 1$ is an exact power of 2, we need to expand and $c_i = 1$
- Total time for N operations is $O(n)$ as shown below

$$\begin{aligned}\sum_{i=1}^n c_i &\leq 1 + \sum_{j=0}^{\lfloor \log(n) \rfloor} 2^j \\ &< n + 2^{\lfloor \log(n) \rfloor + 1} \\ &= n + 2 \cdot 2^{\lfloor \log(n) \rfloor} \\ &\leq n + 2n \\ &= 3n\end{aligned}$$

- Amortized analysis shows that $\text{add}(x)$ is $O(1)$

Amortized Analysis

- Consider a sequence of M operations

$$\text{amortized efficiency} = \frac{\text{worst-case sequence efficiency}}{M}$$

- Looks at the time performance a sequence of operations averaged over the number of operations: $T(n)/n$
- shows that the average cost over time isn't as bad as the worst case for a single operation
- This is **NOT** the same as average case analysis
 - **Average case:** the expected cost of each operation (innately probabilistic)
 - **Amortized:** the average cost of each operation is the worst case

Complexity

- $\text{add}()$ and $\text{remove}()$ is amortized as a constant
- Now competitive with a static array for linear operations

Implementation	get/set	add/del at end	add/del start	add/del mid	search	can grow?
Static Array	1	1	N	N	N	no
Dynamic Array	1	1^*	N	N	N	no

*Amortized analysis

Take-Home

- Today: expandable array
 - Practice by completing the code
 - Time/space best/worst case analysis
- Next time: linked lists!
 - Reading: Chapter 17 of Weiss