# Lecture 7: Analysis of Algorithms 

CS 62
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## Assignment

- WordStream: Reads text word by word

Use nextToken() but make sure hasMoreTokens()

- Pair: of two elements
- StringPair
- Pair of Strings. Extends Pair
- Assume two associations $\langle\mathrm{k}, \mathrm{v}\rangle,\left\langle\mathrm{k}^{\prime}, \mathrm{v}^{\prime}\right\rangle$.
- the equals method will return true iff the $k$ and $k^{\prime}$ are equal
- List
- indexOf(Object o) finds index of $\mathbf{o}$ in a list
- Return -1 if on not in list


## FreqList

- list of associations holding words and their frequencies
- Instance variable List<Association<String, Integer>> flist

In general...

- Work on paper first!
- More demanding than assignment 1. Start early!
- Start with toString()
- Come to office hours
- Continue with add()
- Don't forget Friday's quiz
- What to check when adding?


## Order of Magnitude

- Definition: We say that $g(n)$ is $O(f(n))$ if there exist two constants $C$ and $k$ such that
$|g(n)|<=C|f(n)|$, for all $n>k$.
- Used to measure time and space complexity of algorithms on data structures of size n
- Examples:
- $2 n+1$ is $O(n)$
- $n^{3}-n^{2}+83$ is $O\left(n^{\wedge} 3\right)$
- $2^{n}+n^{2}$ is $O\left(2^{\wedge} n\right)$
- Most common are:
- $O(1)$ - for any constant
- $O(\log n), O(n), O(n \log n), O\left(n^{2}\right), \ldots, O\left(2^{n}\right)$


## Complexity



## Complexity



Figure 5.3 Long-range trends of common curves. Compare with Figure 5.2.
$\longrightarrow$
Comparing Orders of Magnitude

- Suppose have ops w/complexities given \& problem of size n taking time $t$.
- How long if increase size of problem?

| Problem Size: | Io $n$ | I00n | I000n |
| :---: | :---: | :---: | :---: |
| $O(\log n)$ | $3+\mathrm{t}$ | $7+\mathrm{t}$ | $10+\mathrm{t}$ |
| $O(n)$ | 10 t | 100 t | 1000 t |
| $O(n \log n)$ | $>10 \mathrm{t}$ | $>100 \mathrm{t}$ | $>1000 \mathrm{t}$ |
| $O\left(n^{2}\right)$ | 100 t | $10,000 \mathrm{t}$ | $\mathrm{I}, 000,000 \mathrm{t}$ |
| $O\left(2^{n}\right)$ | $-\mathrm{t}^{10}$ | $-\mathrm{t}^{100}$ | $-\mathrm{t}^{1000}$ |



## Adding to ArrayList

- Suppose $n$ elements in ArrayList and add 1.
- If space:
- Add to end is $O$ (1)
- Add to beginning is $O(n)$
- If not space:
- What is cost of ensureCapacity?
- $O(n)$ because n elements in array


## EnsureCapacity

- What if only increase in size by 1 each time?
- Adding $n$ elements one at a time to end
- Total cost of copying over arrays: $1+2+3+\cdots+(n-1)=n(n-1) / 2$

Total cost of $O\left(n^{2}\right)$

- Average cost of each is $O(n)$
- What if double in size each time?
- Suppose add $n=2^{m}$ new elts to end
- Total cost of copying over arrays: $1+2+4+\cdots+n / 2=n-1, O(n)$

Average cost of $O(1)$, but "lumpy"

## ArrayList Operations

- Worst case:
- $O(1)$ : size, isEmpty, get, set
- $O(n)$ : remove, add
- Add to end is on average $O(1)$

