

CMSC 341-04  
Lecture 3

Announcements

Project 1  
Project Preview tonight

## Mileage Example

Problem:

John drives his car, how much gas does he use?

## Complexity

How many resources will it take to solve a problem of a given size?

- time
- space

Expressed as a function of problem size (beyond some minimum size)

- how do requirements grow as size grows?

Problem size

- number of elements to be handled
- size of thing to be operated on

## Growth Functions

### Constant

$$f(n) = c$$

- ex: getting array element at known location
- trying on a shirt
- calling a friend for fashion advice

### Linear

$$f(n) = cn \text{ [+ possible lower order terms]}$$

- ex: finding particular element in array (sequential search)
- trying on all your shirts
- calling all your  $n$  friends for fashion advice

## Growth Functions (cont)

### Quadratic

$$f(n) = cn^2 \text{ [+ possible lower order terms]}$$

- ex: sorting all the elements in an array (using bubble sort)
- trying all your shirts ( $n$ ) with all your ties ( $n$ )
- having conference calls with each pair of  $n$  friends

### Polynomial

$$f(n) = cn^k \text{ [+ possible lower order terms]}$$

- ex: looking for maximum substrings in array
- trying on all combinations of  $k$  separates ( $n$  of each)
- having conferences calls with each  $k$ -tuple of  $n$  friends

## Growth Functions (cont)

### Exponential

$f(n) = c^n$  [+ possible lower order terms]

ex: constructing all possible orders of array elements

### Logarithmic

$f(n) = \log n$  [+ possible lower order terms]

ex: finding a particular array element (binary search)

trying on all Garanimal combinations

getting fashion advice from n friends using phone tree

## Asymptotic Analysis

What happens as problem size grows really, really large? (in the limit)

- constants don't matter
- lower order terms don't matter

## Analysis Cases

What particular input (of given size) gives worst/best/average complexity?

Mileage example: how much gas does it take to go 20 miles?

- Worst case: all uphill
- Best case: all downhill, just coast
- Average case: “average terrain”

## Cases Example

Consider sequential search on an unsorted array of length  $n$ , what is time complexity?

Best case:

Worst case:

Average case:

## Complexity Bounds

Upper bound (big O):

$T(n) = O(f(n))$  if

$T(n) \leq cf(n)$  for some constants  $c, n_0$  and  $n \geq n_0$

Lower bound (omega):

$T(n) = \Omega(g(n))$  if

$T(n) \geq cg(n)$  for some constants  $c, n_0$  and  $n \geq n_0$

“Exact” bound (theta):

$T(n) = \Theta(h(n))$  if

$T(n) = O(h(n))$  and  $T(n) = \Omega(h(n))$

“Greater” bound (little o):

$T(n) = o(p(n))$  if

$T(n) = O(p(n))$  and  $T(n) \neq \Theta(p(n))$

## Simplifying Assumptions

1. If  $f(n) = O(g(n))$  and  $g(n) = O(h(n))$ , then  $f(n) = O(h(n))$
2. If  $f(n) = O(kg(n))$  for any  $k > 0$ , then  $f(n) = O(g(n))$
3. If  $f_1(n) = O(g_1(n))$  and  $f_2(n) = O(g_2(n))$ ,  
then  $f_1(n) + f_2(n) = O(\max(g_1(n), g_2(n)))$
4. If  $f_1(n) = O(g_1(n))$  and  $f_2(n) = O(g_2(n))$ ,  
then  $f_1(n)f_2(n) = O(g_1(n)g_2(n))$

## Example

Code:

```
a = b;
```

Complexity:

## Example

Code:

```
sum = 0;  
for (i=1; i <=n; i++)  
    sum += n;
```

Complexity:

## Example

Code:

```
sum = 0;
for (j=1; j<=n; j++)
    for (i=1; i<=j; i++)
        sum++;
for (k=0; k<n; k++)
    A[k] = k;
```

Complexity:

## Example

Code:

```
sum1 = 0;
for (i=1; i<=n; i++)
    for (j=1; j<=n; j++)
        sum1++;
```

Complexity:

Code:

```
sum2 = 0;
for (i=1; i<=n; i++)
    for (j=1; j<=n; j++)
        sum2++;
```

Complexity:



## Example

Code:

```
sum1 = 0;
for (k=1; k<=n; k*=2)
    for (j=1; j<=n; j++)
        sum1++;
```

Complexity:

Code:

```
sum2 = 0;
for (k=1; k<=n; k*=2)
    for (j=1; j<=k; j++)
        sum2++;
```

Complexity: