

# Growth Functions and Asymptotic Analysis (I)

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CSC 212

# Announcements

- **Go to office hours.**
- Next Quiz Sept 24 (next Tuesday).
- Everything **covered on Sept 12 and this week** are fair game for the quiz.
- Same format as today's quiz.

# Running Time of Algorithms

- Running time of algorithm determines how “**quickly**” it executes.
- **Computed based on # of basic steps** in the algorithm that are executed
  - Loops result in repeated computational sets leading to larger running time than those without
- **Size of the inputs can also affect number of basic steps**
  - Sorting longer arrays need more time than shorter ones!
  - In such cases, **size of input usually dictates # of basic steps!**

# Runtime affected by # of Basic Steps

- Two algorithms for performing the same tasks can have different running times **depending upon # of steps it has**
- Here, the size of the input is the same --- **1 number** --- but the presence of loops dictates running time.

```
import time

def SumOfN(n):
    start = time.time()
    theSUM = 0

    for i in range(1,n+1):
        theSUM +=i

    end = time.time()

    return theSUM, end-start
```

w/ FOR LOOP

```
def directSumOfN(n):
    start = time.time()
    theSUM = (n*(n+1))/2
    end = time.time()

    return theSUM, end-start
```

DIRECT SUMMATION

```
def main():

    print("Sum of N with for loop")
    for i in range(5):
        print("Sum is %d required %10.7f seconds"%SumOfN(100000))

    print("Sum of N function direct ")
    for i in range(5):
        print("Sum is %d required %10.7f seconds"%directSumOfN(100000))
```

Sum of N with for loop

Sum is 500000500000 required	0.0627120	seconds
Sum is 500000500000 required	0.0636330	seconds
Sum is 500000500000 required	0.0593448	seconds
Sum is 500000500000 required	0.0563250	seconds
Sum is 500000500000 required	0.0615969	seconds

Sum of N function direct

Sum is 500000500000 required	0.0000012	seconds
Sum is 500000500000 required	0.0000000	seconds
Sum is 500000500000 required	0.0000000	seconds
Sum is 500000500000 required	0.0000012	seconds
Sum is 500000500000 required	0.0000007	seconds

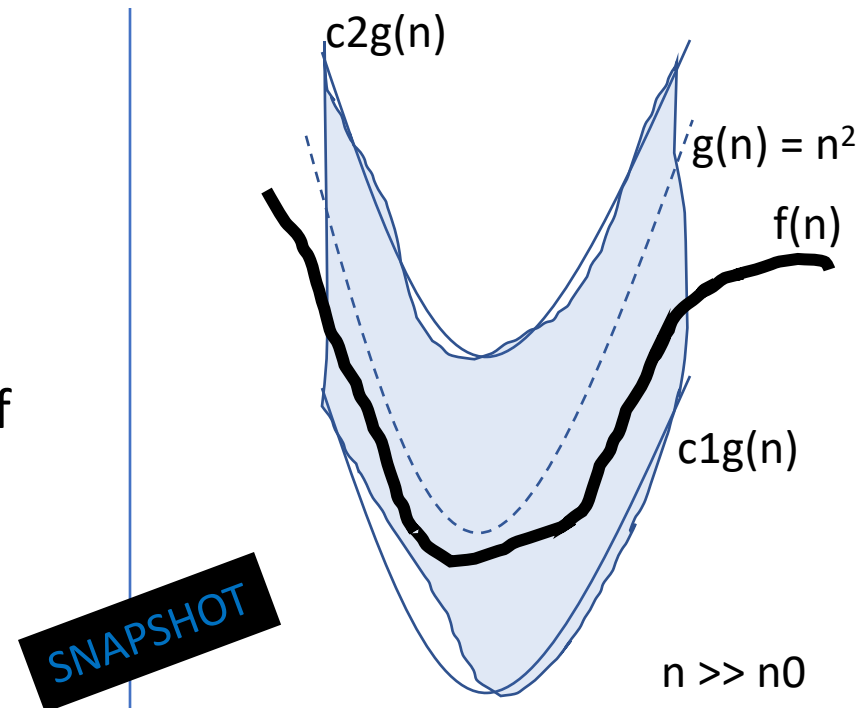
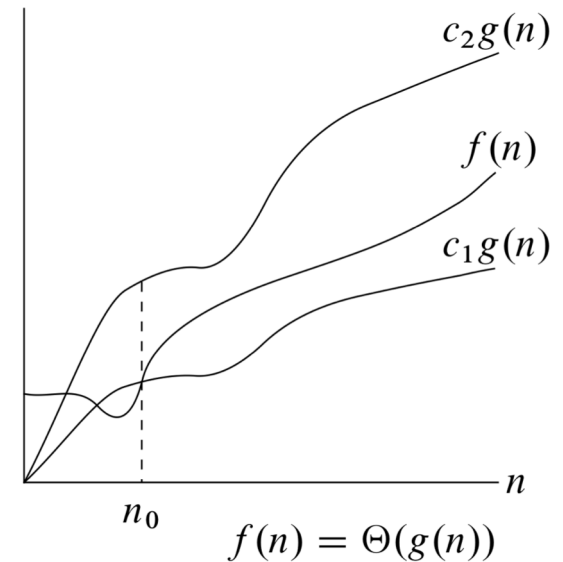
# Runtime affected by input size: Insertion Sort (Recap)

	Assume $n$ elements	Cost	Times
<i>def</i> InsertionSort( <i>A</i> )		c1	$n$
for <i>k in range(1, len(A))</i>		c2	$n-1$
<i>key = A[k]</i>		c4	$n-1$
<i>i = k - 1</i>			WHY?
while <i>i &gt; 0</i> and <i>A[i] &gt; key</i>		c5	$\sum_2^n t_j$ ✓
<i>A[i+1] = A[i]</i>		c6	$\sum_2^n (t_j - 1)$
<i>i = i - 1</i>		c7	$\sum_2^n (t_j - 1)$
<i>A[i+1] = key</i>		c8	$n-1$

$$T(n) = c1 * n + c2(n - 1) + c4(n - 1) + c5 \sum_2^n t_j + c6 \sum_2^n (t_j - 1) + c7 \sum_2^n (t_j - 1) + c8(n-1)$$

# $\Theta$ -notation

- **Definition:** For a given function  $g(n)$ ,  $\Theta(g(n))$  is a **set of functions** such that
  - $\Theta(g(n)) = \{f(n): \text{there exists positive constants } c_1, c_2, \text{ and } n_0 \text{ s.t. } 0 \leq c_1g(n) \leq f(n) \leq c_2g(n) \text{ for all } n \geq n_0\}$
- This is called an asymptotic tight-bound for  $f(n)$ 
  - Really,  $f(n) \in \Theta(g(n))$
- For all values of  $n \geq n_0$  the value of  $f(n)$  is between the  $c_1g(n)$  and  $c_2g(n)$  belt.
- Focus on **large values of  $n$**

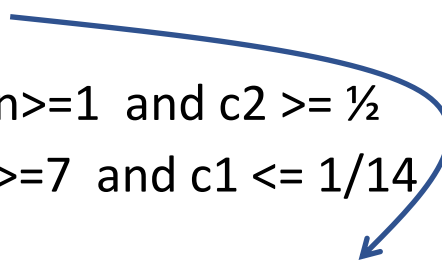


# $\Theta$ -notation: Example

- Assume  $f(n) = 1/2n^2 - 3n$
- We say  $f(n) = \Theta(n^2)$ , if this is true then
  - $c_1n^2 \leq 1/2n^2 - 3n \leq c_2n^2$
  - $c_1 \leq 1/2 - 3/n \leq c_2$

Remember:

$c_1, c_2$  and  $n$  are positive constants

- The right inequality is true for  $n \geq 1$  and  $c_2 \geq 1/2$
  - The left inequality is true for  $n \geq 7$  and  $c_1 \leq 1/14$
  - Thus if we choose
    - $c_1 = 1/14$ ,  $c_2 = 1/2$ , and  $n_0 = 7$  we can make the inequality true
  - Thus  $f(n) = \Theta(n^2)$
  - **Note, other  $c_1$ ,  $c_2$ , and  $n_0$  may also exist that make the inequality true**
  - Suffice it to say, that we can find one groups of values
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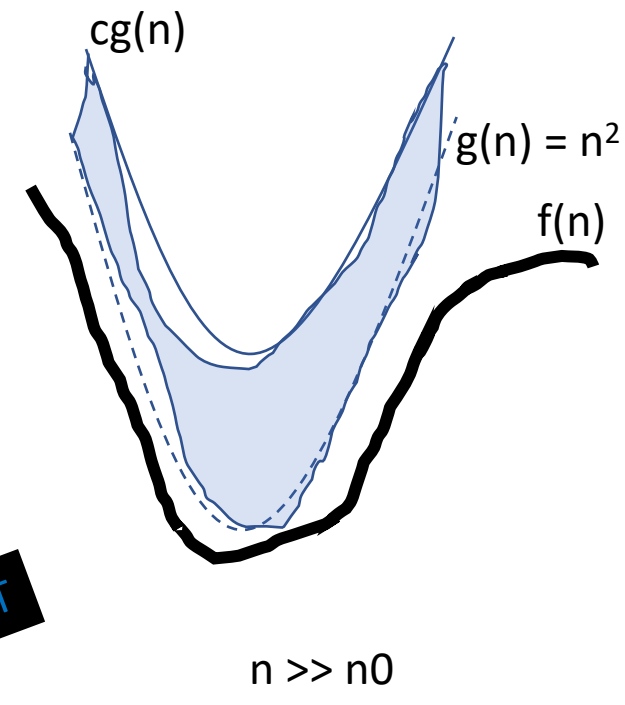
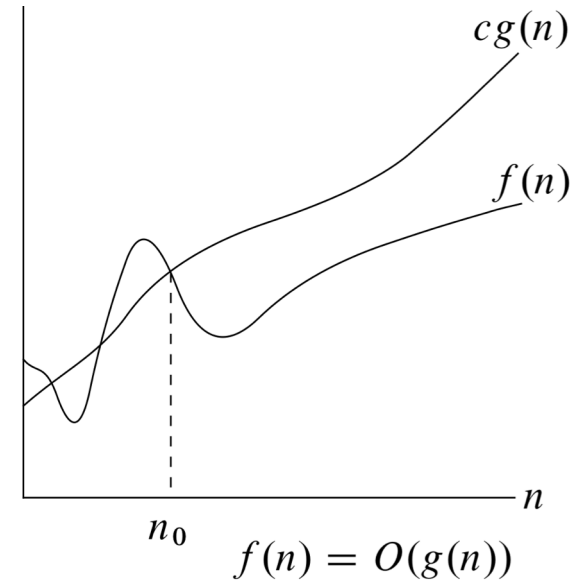
# $\Theta$ -notation

- In the running time of an algorithm, lower order terms are ignored.
  - For large values of  $n$ , the lower order terms become minuscule compared to the highest-order term
  - E.g., For  $T(n) = an^2 + bn + c$ , the **value of  $n^2$  will dominate** values of  $b*n$  or  $c$  or  $a$  for large values of  $n$
- More generally, for any polynomial
$$p(n) = \sum_{i=0}^d a_i n^i$$
where  $a_i$  is a constant and  $a_d > 0$ ,  
 **$p(n) = \Theta(n^d)$**
- Similarly, for a zero—degree polynomial  $q(n)$  or a constant function --- e.g., a given algorithm step  
 **$q(n) = \Theta(n^0) = \Theta(1)$**
- Called the **Asymptotic Tight-bound!**
  - Asymptotic means for large  $n$
  - Tight-bound because we have found the function that describes the algorithm's running time to within a constant multiple above and below



# $O$ -notation

- **Definition:** For a given function  $g(n)$ ,  $O(g(n))$  is a **set of functions** such that
  - $O(g(n)) = \{f(n): \text{there exists positive constants } c, \text{ and } n_0 \text{ s.t. } 0 \leq f(n) \leq cg(n) \text{ for all } n \geq n_0\}$
- This is called an asymptotic upper-bound for  $f(n)$
- For all values of  $n \geq n_0$  the value of  $f(n)$  is always  $\leq cg(n)$
- Focus on **large values of  $n$**



# $O$ -notation: Example

- Assume  $f(n) = 1/2n^2 - 3n$

- We say  $f(n) = O(n^2)$ , if this is true then

- $0 \leq 1/2n^2 - 3n \leq cn^2$

- $0 \leq 1/2 - 3/n \leq c$

Remember:

$c$  and  $n$  are positive constants

- The right inequality is true for  $n \geq 1$  and  $c \geq 1/2$

- The left inequality is true for  $n \geq 4$

- Thus if we choose

- $c = 1/2$ , and  $n_0 = 4$  we can make the inequality true

- Thus  $f(n) = O(n^2)$

- Called the **Asymptotic Upper-bound!**

- Asymptotic means for large  $n$

- Tight-bound because we have found the function that describes the algorithm's running time to within a constant multiple above

# Practice

- What is the Asymptotic Relationship ( $O$  or  $\Theta$  — *notation*) between
- $n^k$  *in terms of*  $c^n$  (assuming  $c > 1$  and  $k > 1$ )
- $\lg n^{\lg 17}$  *in terms of*  $\lg 17^{\lg n}$
- $\log_2 n$  *in terms of*  $\log_8 n$  --- [tricky work it out]
- $3n \log_8 n$  *in terms of*  $n^3 \lg n$



*That's all Folks!*  
*Any Question?*