

# 6.006 Recitation

Build 2008.4



# Outline

- Asymptotic Notation
- Merge-Sort
- Python Cost Model
- (maybe) `docdist{5,6}.py`

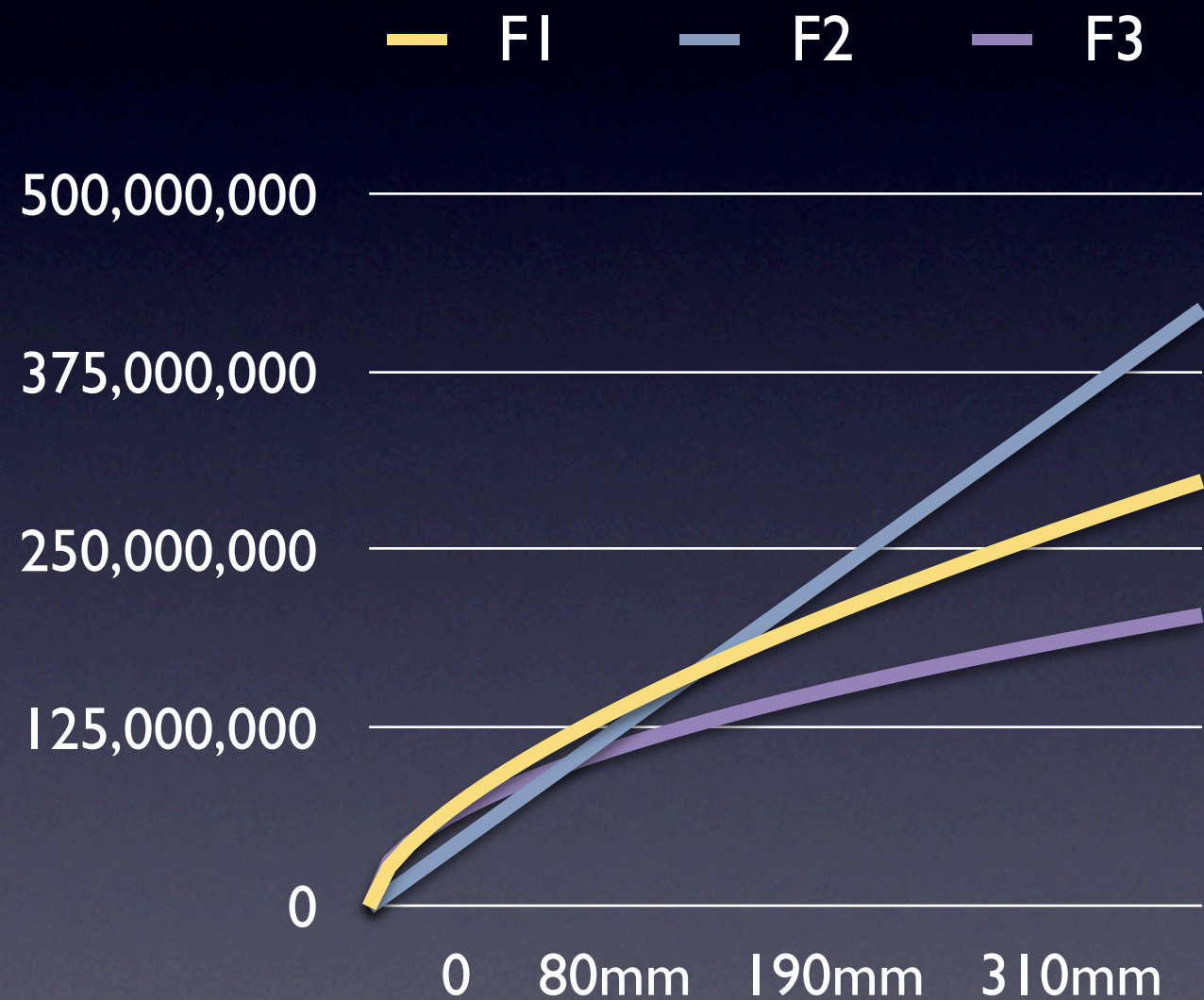


# Asymptotic Notation

$$f1: 1,000 * n^{0.635}$$

$$f2: n$$

$$f3: 10,000 * n^{0.5}$$





# Asymptotic Notation

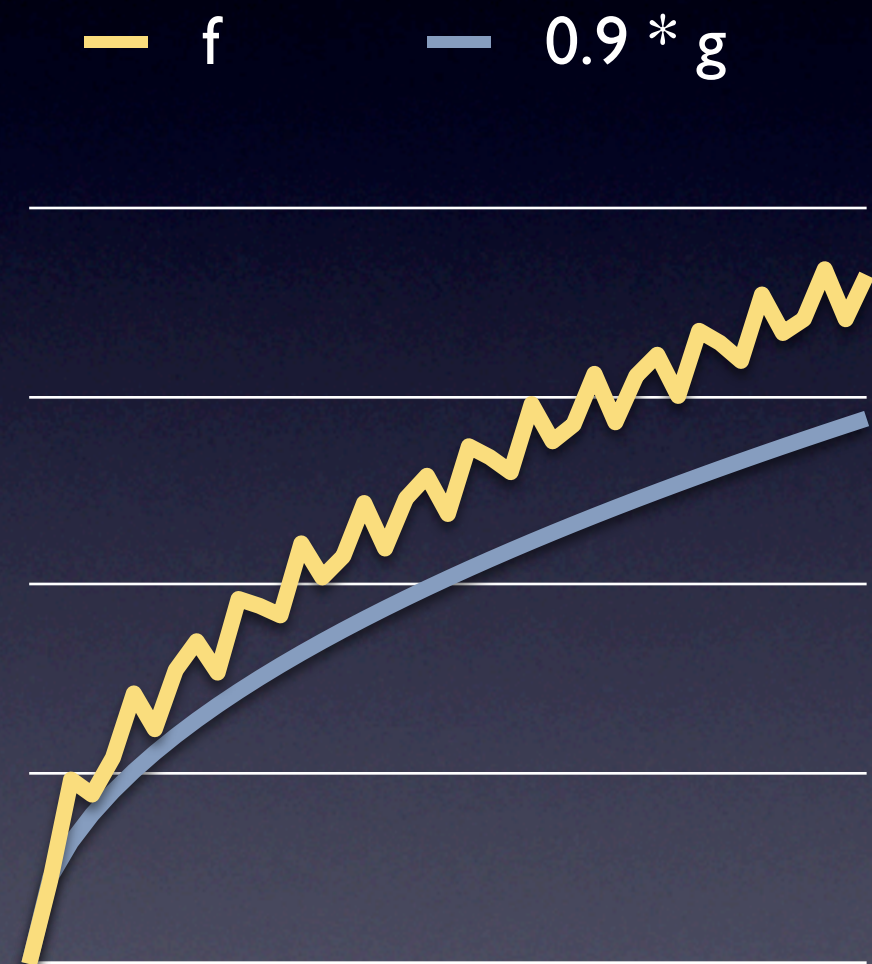
- $f = O(g)$





# Asymptotic Notation

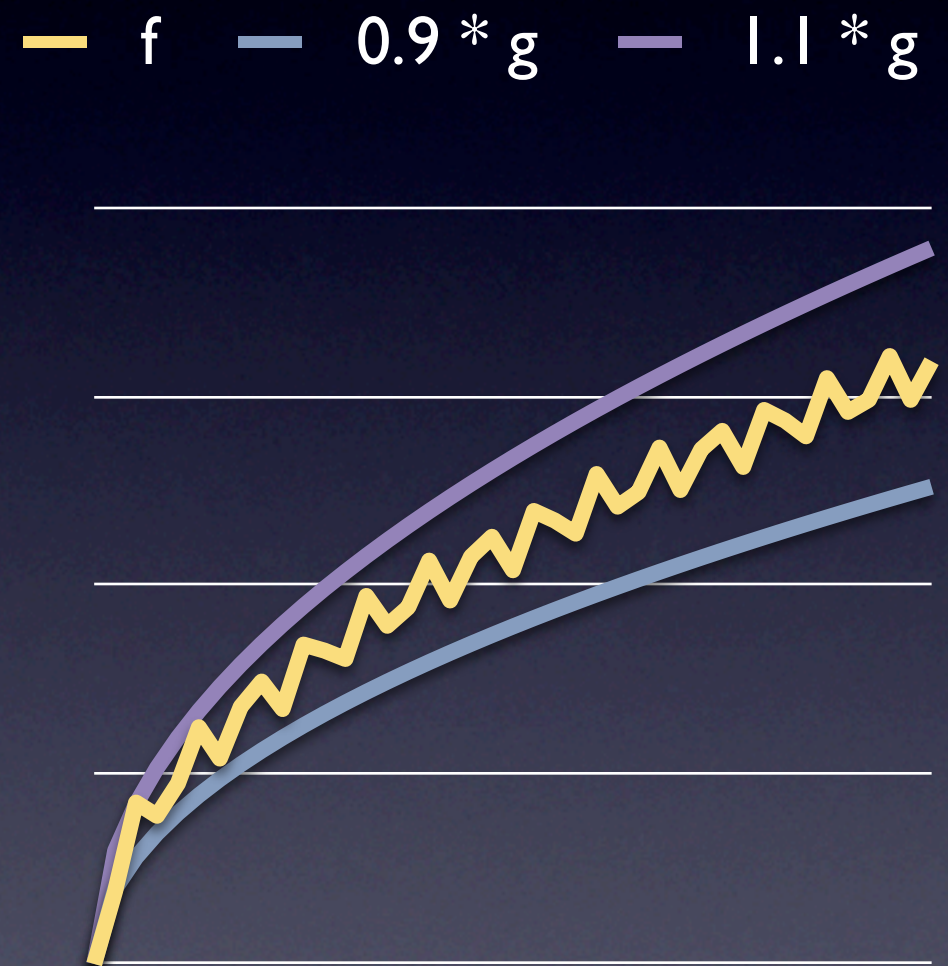
- $f = \Omega(g)$





# Asymptotic Notation

- $f = \Theta(g)$





# Asymptotic Drowning

- $\lg(n^{100}) = 100 * \lg(n) = \Theta(\lg(n))$
- $\lg(n^{0.1}) = 0.1 * \lg(n) = \Theta(\lg(n))$
- $\lg_5(n) = \lg(n) / \lg(5) = \Theta(\lg(n))$
- $n^{\lg(5)} = n^{2.3219...}$  so  $n^2 < n^{\lg(5)} < n^3$



# Asymptotic Headaches

- $10^{80}$  (atoms in the universe)
- $\lg_{\log 5}(\lg^{\lg 100} n)$
- $(20n)^7$
- $5^{\lg 3} n^3 + 10^{80} n^2 + (\lg 3) n^{3.1} + 6006$
- $\lg\binom{N}{N/2}$



# Stirling Banishes the Evil

- $N! \sim \sqrt{2\pi N} * ((N/e)^N)$
- Substitute in  $\lg\binom{N}{N/2}$
- Reduce terms, obtain  $O(N)$



# Binary Search for 23

1    3    4    9    11    **15**    20    24    29    34    38

1	3	4	9	11	15	20	24	<b>29</b>	34	38
---	---	---	---	----	----	----	----	-----------	----	----

1    3    4    9    11    15    **20**    24    29    34    38

1	3	4	9	11	15	20	<b>24</b>	29	34	38
---	---	---	---	----	----	----	-----------	----	----	----

1    3    4    9    11    15    20    24    29    34    38



# Divide and Conquer

## 1. Divide

Break into smaller subproblems

## 2. Conquer

Really small subproblems are easy

## 3. Profit

Combine answers to sub-problems



# Merge-Sort

## 1. Divide

Break into 2 equal-sized sublists

## 2. Conquer

1-element lists are sorted

## 3. Profit

Merge sorted sublists



# Just Merge

$L1 = [2, 3, 5, 7]$

$L = []$

$L2 = [2, 4, 8, 16]$



# Just Merge

$L1 = [3, 5, 7]$

$L = [2]$

$L2 = [2, 4, 8, 16]$



# Just Merge

$$L1 = [3, 5, 7]$$

$$L = [2, 2]$$

$$L2 = [4, 8, 16]$$



# Just Merge

$$L1 = [5, 7]$$

$$L = [2, 2, 3]$$

$$L2 = [4, 8, 16]$$



# Just Merge

$$L1 = [5, 7]$$

$$L = [2, 2, 3, 4]$$

$$L2 = [8, 16]$$



# Just Merge

$L1 = [7]$

$L = [2, 2, 3, 4, 5]$

$L2 = [8, 16]$



# Just Merge

$L1 = []$

$L = [2, 2, 3, 4, 5, 7]$

$L2 = [8, 16]$



# Just Merge

$L1 = []$

$L = [2, 2, 3, 4, 5, 7, 8, 16]$

$L2 = []$



# Running Time Analysis

	Binary Search	Merge Sort
Subproblems	1	2
Subproblem size	$N / 2$	$N / 2$
Time to Divide	$\Theta(1)$	$\Theta(1)$
Time to Profit	$\Theta(1)$	$\Theta(N)$
$T(N)$	$T(N/2) + \Theta(1)$	$2T(N/2) + \Theta(N)$



# Recursion Tree Analysis

	Binary Search	Merge Sort
$T(N)$	$T(N/2) + \Theta(1)$	$2T(N/2) + \Theta(N)$
Tree depth	$\lg(N)$	$\lg(N)$
Cost per level	$\Theta(1)$	$\Theta(N)$
Total cost	$\Theta(\lg(N))$	$\Theta(N * \lg(N))$



# Python Cost Model

- Motivation
  - change + to **extend** for 1000X speed
- Approach
  - stand on the shoulders of giants (Ron)
  - focus on the asymptotic cost



# Timing.py

## a.k.a. Ron's Shoulders

```
1  print "Test List-11: Sort"
2  spec_string = "1000<=n<=100000"
3  growth_factor = 2
4  print "Spec_string: ",spec_string, "by factors of", growth_factor
5  var_list, param_list = make_param_list(spec_string,growth_factor)
6  # f_list = ("n","1")
7  f_list = ("n*lg(n)",)
8  run_times = []
9  trials = 200
10 for D in param_list:
11     t = timeit.Timer("L.sort()",
12                     "import random;L=[random.random() for i in range(%(n)s)]"%D)
12     run_times.append(t.timeit(trials)*1e6/float(trials))
13 fit(var_list,param_list,run_times,f_list)
```



# Pset Hint

*“Good artists borrow, great artists steal”*

Steve Jobs, CEO Apple Inc.

quoting Pablo Picasso



# Python Lists

L, M have n **items**

Creation	<code>list()</code>	$\Theta(1)$
Access	<code>L[i]</code>	$\Theta(1)$
Append	<code>L.append(0)</code>	$\Theta(1)$
Concatenate	<code>L + M</code>	$\Theta(n)$
Pop	<code>L.pop()</code>	$\Theta(1)$
Delete first	<code>del L[0]</code>	$\Theta(n)$



# Python Lists II

L, M have n **items**  
P has n/2 **items**

Slice extraction	<code>L[0:n/2]</code>	$\Theta( n )$
Slice assignment	<code>L[0:n/2] = P</code>	$\Theta( n )$
Copy	<code>L[:]</code>	$\Theta( n )$
Reverse	<code>L.reverse()</code>	$\Theta( n )$
Sort	<code>L.sort()</code>	$\Theta( n * \lg(n) )$



# Python Strings

s, t have n **characters**

Creation

`list()`

$\Theta(1)$

Extract a char

`s[i]`

$\Theta(1)$

Concatenate

`s + t`

$\Theta(n)$

Extract substring of  
n/2 characters

`s[0:n/2]`

$\Theta(n)$



# Python Dictionaries

D has n **items**

Creation	<code>dict()</code>	$\Theta(1)$
Access	<code>D[i]</code>	$\Theta(1)$
Copy	<code>D.copy()</code>	$\Theta(n)$
List items	<code>D.items()</code>	$\Theta(n)$



# Python Cost Exercise

```
1 def merge(L,R):
2     i = 0
3     j = 0
4     answer = []
5     while i<len(L) and j<len(R):
6         if L[i]<R[j]:
7             answer.append(L[i])
8             i += 1
9         else:
10            answer.append(R[j])
11            j += 1
12    if i<len(L):
13        answer.extend(L[i:])
14    if j<len(R):
15        answer.extend(R[j:])
16    return answer
```

$\Theta(1)$	$1$
$\Theta(1)$	$1$
$\Theta(1)$	$1$
$\Theta(1)$	$\Theta(N)$
$\Theta(1)$	$\Theta(N)$
$\Theta(1)$	$\Theta(N)$
$\Theta(1)$	$\Theta(N)$
$\Theta(1)$	$\Theta(N)$
$\Theta(1)$	$\Theta(N)$
$\Theta(1)$	$1$
$\Theta(N)$	$\Theta(1)$
$\Theta(1)$	$1$
$\Theta(N)$	$\Theta(1)$
$\Theta(1)$	$1$



# Python Cost Exercise II

```
1 def merge_sort(A):
2     n = len(A)
3     if n==1:
4         return A
5     mid = n//2
6     L = merge_sort(A[:mid])
7     R = merge_sort(A[mid:])
8     return merge(L,R)
```

$\Theta(1)$	1
$\Theta(1)$	1
$\Theta(1)$	$\Theta(1)$
$\Theta(1)$	1
$\Theta(N)$	$T(N/2)$
$\Theta(N)$	$T(N/2)$
$\Theta(N)$	1



# Python Arithmetic

$x, y, z$  have  $n$  **bits**

Addition	$x + y$	$\Theta(n)$
Subtraction	$x - y$	$\Theta(n)$
Multiplication	$x * y$	$\Theta(n^{1.585...})$
Division	$x / y$	$\Theta(n^2)$
Modular Exponentiation	<code>powmod(x, y, z)</code>	$\Theta(n^3)$
Power of 2	$2 ** n$	$\Theta(1)$



# Python Arithmetic

$x, y, z$  have  $n$  **digits**

Addition	$x + y$	$\Theta(n)$
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Division	$x / y$	$\Theta(n^2)$
Modular Exponentiation	<code>powmod(x, y, z)</code>	$\Theta(n^3)$
Power of 2	$2 ** n$	$\Theta(1)$



# And we're done!

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