

Handouts: mergesort.py 6.006  
Rivest  
Readings: CLRS Chaps 1-4, 11.1, 11.2 L2.1  
Python cost model 9/9/08  
docdist1...docdist6

Web: mergesort.py, lecture notes

Admin: HW #1 will be posted today  
laptop loaner program  
new students?

Outline:  Docdist review  
 Asymptotic notation  
 Mergesort:  Divide & Conquer  
 Code  
 Analysis / Recurrences  
 Timing Experiments

### Document Distance Review (Bobsey vs. Lewis)

v1	initial	?secs	
v2	profiled	194	$\Theta(n^2)$
v3	concatenate $\rightarrow$ extend	84	$\Theta(n^2)$
v4	dictionaries instead of lists	41	$\Theta(n^2)$
v5	translate & split	13	$\Theta(n^2)$
v6	merge-sort	6	$\Theta(n \lg n)$
(v7?)	no sorting!	< 1	$\Theta(n)$

(Even though sorting is not necessary, it is very worthwhile to look at, so we shall...)

## Sorting Problem:

Given a list of  $n$  comparable objects,  
rearrange them into increasing (nondecreasing)  
order.

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## Input sizes:

Time gets larger as inputs do.

Parameterize size with one or more measures ( $n, m, \dots$ )

There are many inputs of a given size.

$$T(n) = \text{worst-case running time on an input of size } n \\ = \max_{\substack{\text{inputs } x \\ \text{of size } n}} [\text{running time on } x]$$

For insertion sort (ref docdist code, & CLRS §2.1)

$$T(n) \approx \text{const} \cdot n^2 \quad (\text{due to doubly-nested loops})$$

How to be precise about such things?

when \* we don't care about  $T(n)$  for small  $n$

\* " " " " constant factors

(different computers, interpreted/compiled, etc...)

While running time might be

$$4n^2 + 22n - 12 \text{ microseconds}$$

we only care about high-order term ( $4n^2$ )

but without constant ( $n^2$ )

Since other terms are negligible (relatively) as  $n$  gets large.

## "big oh" notation

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We say

$T(n)$  is  $O(g(n))$

if

$\exists n_0$

$\exists c$

s.t.  $0 \leq T(n) \leq c \cdot g(n)$  for all  $n \geq n_0$

upper  
bound

Example:  $4n^2 + 22n - 12$  is  $O(n^2)$

since  $0 \leq \dots \leq 26n^2$  for  $n \geq 1$ .

write  $4n^2 + 22n - 12 = O(n^2)$

(but not reverse  
 $\Theta$  always on right)

lower  
bound

Big Omega:

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

if  $(\exists n_0)(\exists c) 0 \leq c \cdot g(n) \leq T(n)$  for all  $n \geq n_0$

$4n^2 + 22n - 12 = \Omega(n^2)$   $[c=1, n_0=1]$

both

Big Theta:

$T(n) = \Theta(g(n))$  iff  $T(n) = O(g(n))$  &  $T(n) = \Omega(g(n))$

$\equiv g(n)$  is high-order term in  $T(n)$  (up to constant)

$\therefore T(n) = 4n^2 + 22n - 12 = \Theta(n^2)$

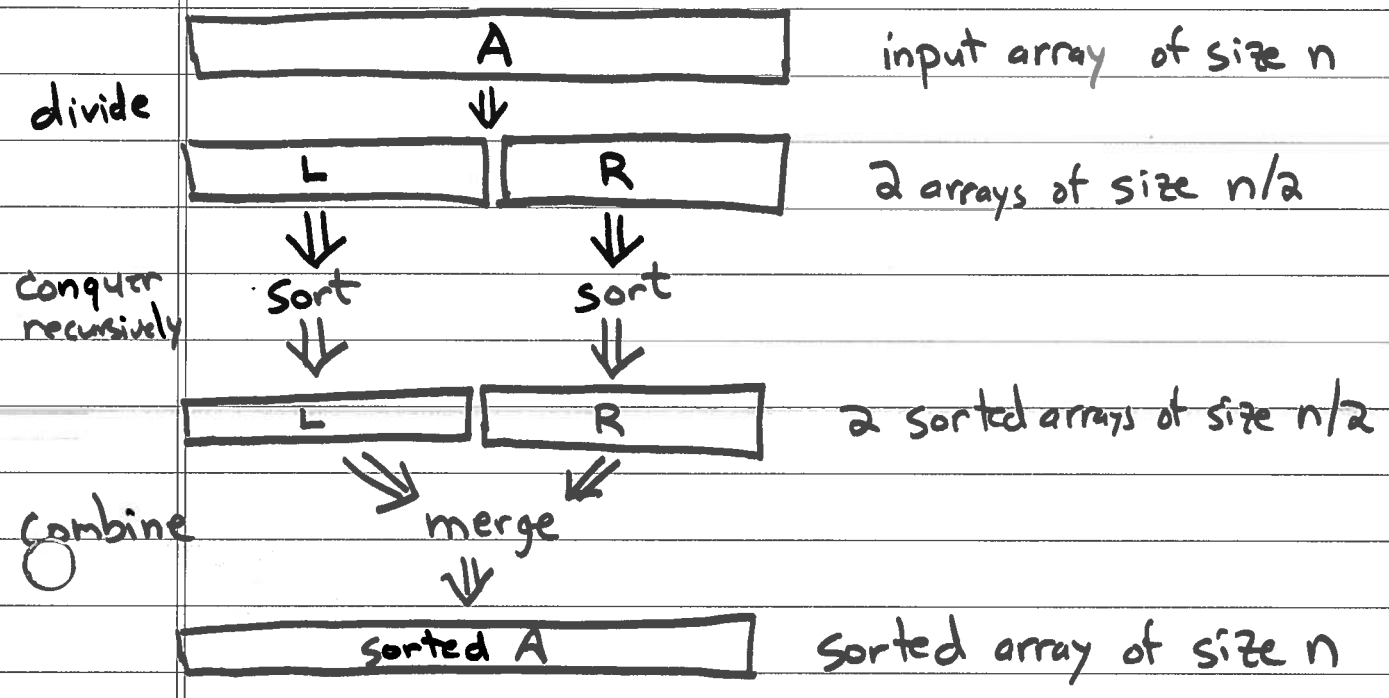
For insertion sort,  $T(n) = \Theta(n^2)$

( $\approx$  if you double input size, running time goes up 4x.)

Can we do better? Yes!

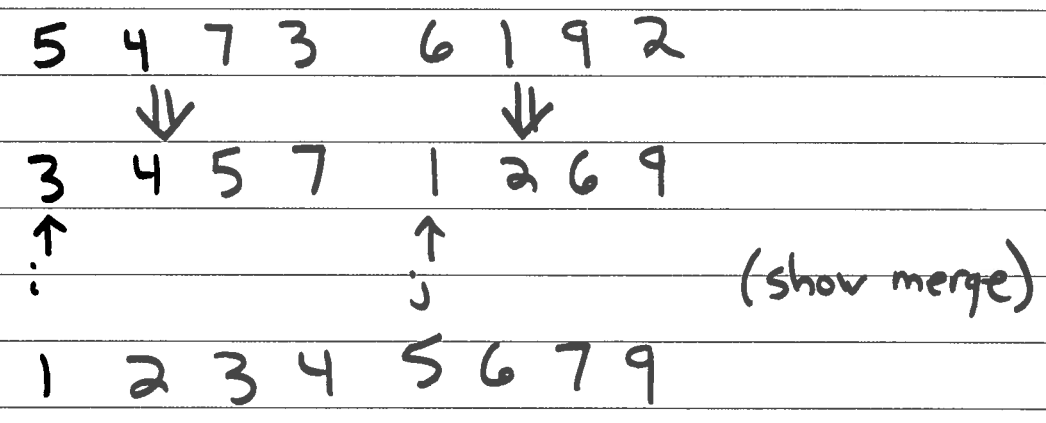
Divide/Conquer/Combine paradigm  
 aka "Divide & Conquer"  
 by example: mergesort

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show code (handout): merge\_sort  
 merge ("two finger algorithm")

Ex. merge



Analysis:

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Running time of merge on two inputs of size  $n/2$  is  $c \cdot n$ , for some  $c$ .

L2.5

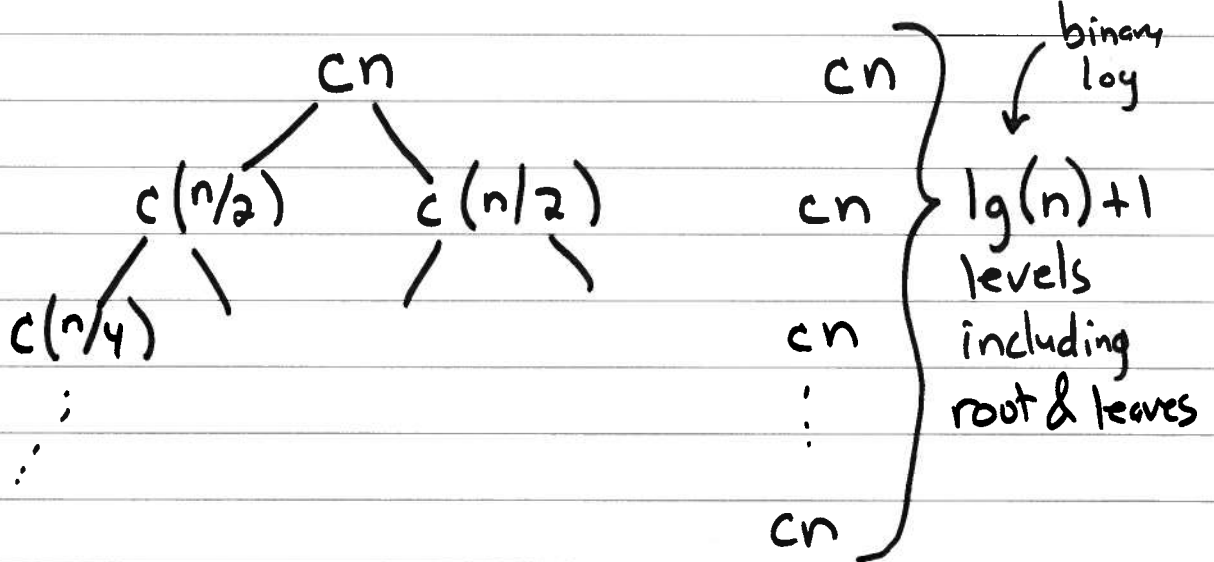
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Let  $T(n)$  = running time of mergesort on inputs of size  $n$ .

$$T(n) = \underbrace{c}_\text{divide} + \underbrace{2T(n/2)}_\text{conquer} + \underbrace{c \cdot n}_\text{combine}$$

$$(T(1)=c) \quad = 2T(n/2) + c \cdot n \quad (\text{only keep high-order terms})$$

$$= cn + 2(c \cdot \frac{n}{2}) + 2(c \cdot \frac{n}{4}) + \dots$$



$$T(n) = c \cdot n \cdot (\lg(n) + 1)$$

$$= \Theta(n \lg n)$$

Ref:  
CLRS  
Chapter 4

## Experimental Results

Insertion-sort	$\Theta(n^2)$	6.006
merge_sort	$\Theta(n \lg(n))$	Rivest
"sorted" (built-in)	$\Theta(n \lg(n))$ ?	<del>6.006</del> L2.6
		9/9/08

~~merge\_sort~~

### insertion\_sort

test\_insertion( $2^{**}12$ )  $\approx$  1 second

insertion sort takes  $\approx 66 \cdot n^2$  nanoseconds

... test(test\_insertion)...

### merge\_sort

test\_merge( $2^{**}17$ )  $\approx$  1.5 seconds

merge\_sort takes  $\approx 701 \cdot n \lg n$  nanoseconds

... test(test\_merge)...

### sorted (built-in)

test\_sorted( $2^{**}20$ )  $\approx$  1 second

sorted takes  $\approx 55 \cdot n \lg n$  nanoseconds

... test(test\_sorted)...

- Not quite linear, as  $\lg(n)$  grows slowly, but "almost".
- Small constant for "sorted", since it is written in C.  
(13x speedup?) but asymptotics same as for mergesort.

When is mergesort (in Python)

$701 n \lg(n)$  nanoseconds  
better than insertion-sort in C?

$5 n^2$  nanoseconds ( $5 \approx 66/13$ )

Crossover:  $5 n^2 \rightarrow 701 n \lg n$   
at  $n \geq 1500$

Mergesort wins for  $n \geq 1500$

Better algorithm much more valuable than hardware or compiler, even for modest  $n$ .

[Note: hybrid approach: use insertion sort if  $n \leq 1500$   
merge-sort if  $n \geq 1500$ ]

6.006

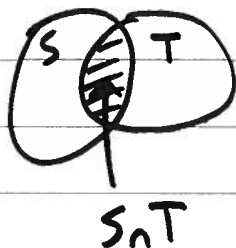
Rivest

4.7

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- Python Cost Model - similar experiments on other operations
  - uses `timing.py` to "fit" formulae to data
  - (code might not be so readable...)
  - look at chart...

• Homework:  $S = \text{set}([1, 2, 3])$  set data type  
 $T = \text{set}([1, 2, 4, 9])$   
 $S.\text{intersection}(T) = \text{set}([1, 2])$



running time may depend on  
 $|S|$ ,  $|T|$ , and  $|S \cap T|$

figure it out!

//end of first module