

Running Time and Sorting

Running Time

- How fast does an algorithm run?
- Usually relative to the size of the input
- Is it reasonable? $T(n)$, $T(\log n)$, $T(n^2)$...
- For even moderate input sizes is it unreasonable? $T(2^n)$

Examples of running times (in milli seconds)

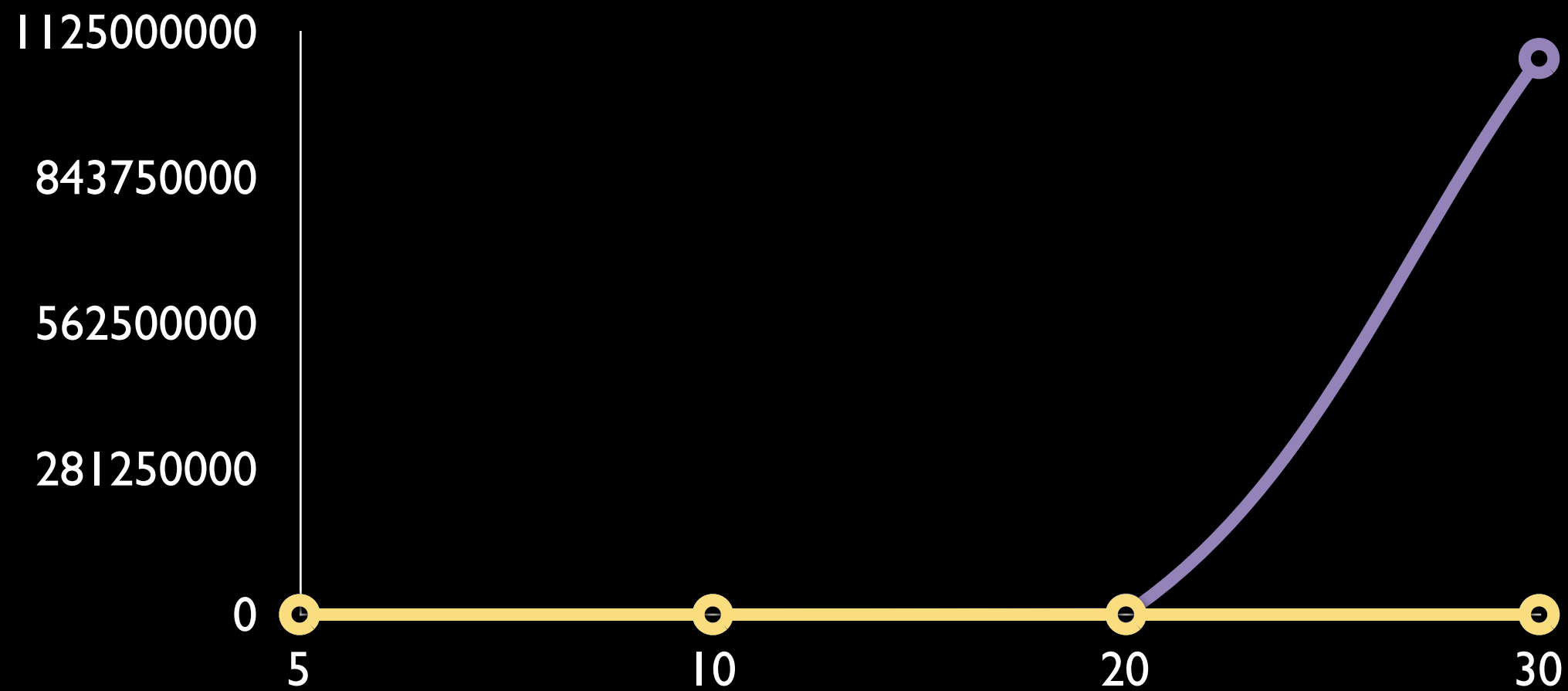
input size	$n \log n$	n^2	2^n
1	0	1	2
10	10	100	1024
100	200	10000	1.26765E+30
1000	3000	1000000	1.07151E+301

3.9×10^{19} years!

2.4×10^{290} years!

Function growth

 $n \log n$  n^2  2^n



Computing Running Time

- Which parts depend on input size?
- Usually ignore things that aren't input size dependent: constant amount of work on any input
- Places where time is often needed:
 - loops
 - recursive calls

Computing Running Time: Loops

Consider the following two loops:

```
for (int i = 0; i < n; i++)
{
    if list[i] > value
        remove list[i] from list
}
for (int j = 0; j < n; j++)
{
    display(list[j])
}
```

```
for (int i = 0; i < n; i++)
{
    for(int j=0; j<n; j++)
    {
        display(i*j);
    }
}
```

Which one takes less time?

A

```
for (int i = 0; i < n; i++)  
{  
    if list[i] > value  
        remove list[i] from list  
}  
for (int j = 0; j < n; j++)  
{  
    display(list[j])  
}
```

B

```
for (int i = 0; i < n; i++)  
{  
    for(int j=0; j<n; j++)  
    {  
        display(i*j);  
    }  
}
```

What are their rough running times?

A

```
for (int i = 0; i < n; i++)  
{  
    if list[i] > value  
        remove list[i] from list  
}  
for (int j = 0; j < n; j++)  
{  
    display(list[j])  
}
```

B

```
for (int i = 0; i < n; i++)  
{  
    for(int j=0; j<n; j++)  
    {  
        display(i*j);  
    }  
}
```


Computing Running Time: Loops

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n iterations

```
for (int i = 0; i < n; i++)  
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Computing Running Time: Loops

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```

n iterations

n iterations

Total: $n+n=2n$

```
for (int i = 0; i < n; i++)  
{  
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    }  
}
```

Computing Running Time: Loops

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n iterations

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n iterations

Total: $2n$

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n iterations

Computing Running Time: Loops

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n iterations

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    }  
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n iterations

**n iterations
in each of n iterations**

Computing Running Time: Loops

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n iterations

n iterations

Total: $2n$

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    {  
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    }  
}
```

n iterations

**n iterations
in each of n iterations**

Total: $n * n = n^2$

Recursive Calls: Quicksort

```
Quicksort(list a, length x)
if(x<=1) return a;
int p = x-1;
list lower;
list higher;
higher.add(p)
for(int i =0; i<x-1, i++)
    if(a[i] < p)
        lower.add(a[i]);
    else
        higher.add(a[i]);
Quicksort(lower, lower.length());
Quicksort(higher, higher.length());
return(lower+higher);
```

Recursive Calls: Quicksort

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    int p = x-1;
    list lower;
    list higher;
    higher.add(p)
    for(int i =0; i<x-1, i++)
        if(a[i] < p)
            lower.add(a[i]);
        else
            higher.add(a[i]);
    QUICKSORT(lower, lower.length());
    QUICKSORT(higher, higher.length());
    return(lower+higher);
```

what's
going on?



Running time of Quicksort

- Each time the pivot splits the list into two lists
- At each call there at most $\sim n^2$ comparisons
- consider how it works for: 1 2 3 4 5
- how about: 1 2 4 5 3

Example: quicksort

1 2 3 4 5

Running time of Quicksort

- Each time the pivot splits the list into two lists
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$\sim n^2$ comparisons

Example: quicksort

1 2 4 5 3

Running time of Quicksort

- Each time the pivot splits the list into two lists
- At each call there at most $\sim n^2$ comparisons
- consider how it works for: 1 2 3 4 5
- how about: 1 2 4 5 3

$\sim n \log n$ comparisons

$\sim n^2$ comparisons

Which Sort is best?

- Many things to consider:
 - range of input
 - type of input
 - unique values or not?
 - integer, real numbers, alphabetical...
 - expected size of input

Can we sort better than $T(n \log n)$?

- What if we know something about the data?
- Sorting integers: create a bucket for ranges of values
- if needed, use a comparison base sort in each bucket

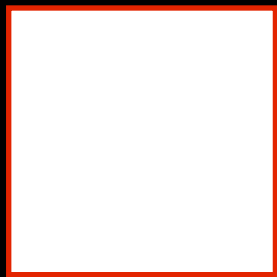
Bucket Sort Example

input: 20, 33, 2, 42, 48, 10, 17, 35, 9

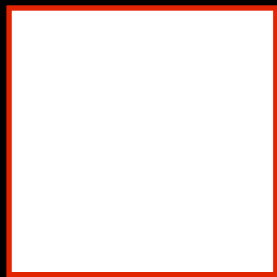
Bucket Sort Example

If we know the input is always integers from 0 to 49

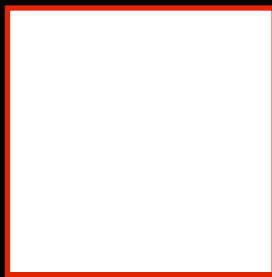
input: 20, 33, 2, 42, 48, 10, 17, 35, 9



0-9



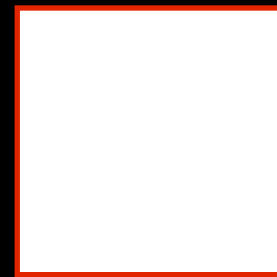
10-19



20-29



30-39



40-49

Bucket Sort Example

input: 20, 39, 2, 42, 48, 10, 17, 35, 9

2
9

0-9

10
17

10-19

20

20-29

39
35

30-39

42
48

40-49

Bucket Sort Example

input: 20, 39, 2, 42, 48, 10, 17, 35, 9

One pass: n comparisons

2 9	10 17	20	39 35	42 48
0-9	10-19	20-29	30-39	40-49

Some Sorting Algorithms ...

- Selection sort
- Insertion sort
- Quicksort
- Bubble sort
- Heap sort
- Bucket sort
- Merge sort
- and many more...

Properties of sorting algorithms

- comparison based?
- speed ($n \log n$ vs. n^2)
- memory usage (in place or not?)
- iterative or recursive?
- stability (do like-valued items stay in original order?)

Properties of some sorting algorithms

- Selection sort: in place, comparison, slow ($\sim n^2$)
- Insertion sort: low memory needs, comparison, shifting needed ($\sim n^2$)
- Quicksort: not stable, fast ($\sim n \log n$), low memory
- Bubble sort: simple, slow, low memory ($\sim n^2$)
- Bucket sort: fast for data with little variation ($\sim n$)
- Merge sort: fast ($\sim n \log n$)