

CS3000: Algorithms & Data

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Lecture 7:

- Divide and Conquer Example – Similar to HW
- Binary Search
- Another Example

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Practice Problem:
Maximum Sum Subarray Problem

Maximum Sum Subarray Problem

- **Input:** Array $A[1:n]$ of integers
- **Problem:** Find a subarray $A[i:j]$ with the largest possible sum
- **Example:** $A = [3, -4, \underbrace{5, -2, -2, 6, -3, 5}, -3, 2]$
Maximum sum = 9

Step 1: Find a "naive" method

Q: If we don't care about efficiency how can we solve?

How bad is that approach?

(What is the time complexity of it?)

Approach: "try everything"
• Iterate over all subarrays
Choose max

For $i = 1 \dots n$

For $j = i+1 \dots n$

Evaluate sum $A[i:j]$

return max

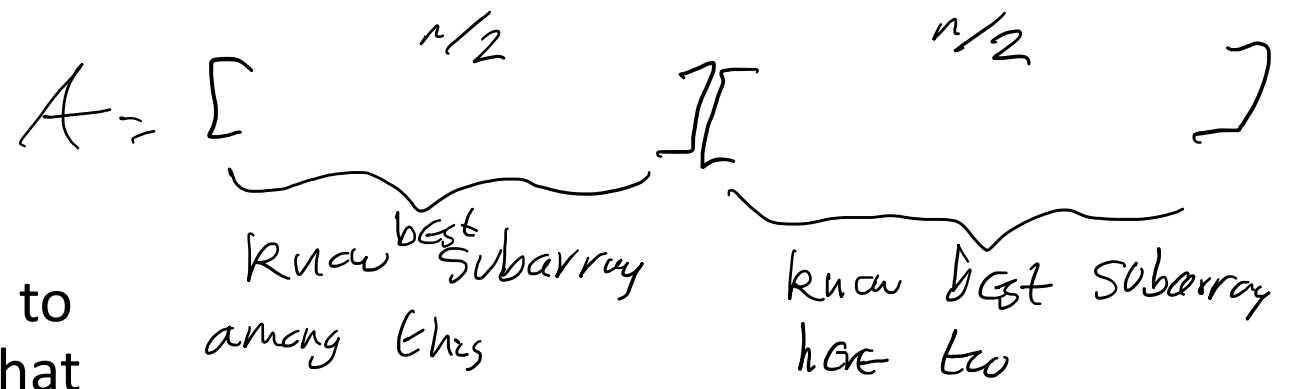
complexity is $\Theta(n^3)$

Feels very slow.

Try divide & conquer

— one factor of n
— factor of n
at most n terms in sum

- **Input:** Array $A[1:n]$ of integers
- **Problem:** Find a subarray $A[i:j]$ with the largest possible sum
- **Task:** Devise a divide and conquer algorithm to solve this problem. Consider an algorithm that divides A into two halves.
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Can I acquire the best subarray over the whole problem efficiently? $O(n)$?

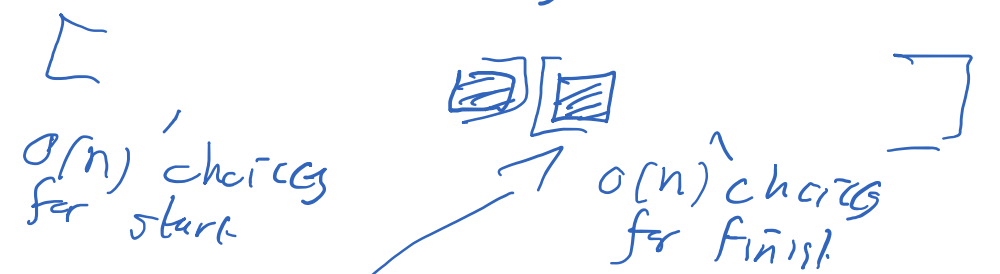
wonder: what hasn't been considered so far.

Subarrays that live in both halves

What do I need to get divide + conquer to work?

Base case ✓

If I've solved two smaller ~~versions~~ ^{versions} how do I "merge" them together efficiently?



could evaluate all $O(n)$ subarrays living in right half (containing \quad) in $O(n)$ time

[[x] x]

Subarray that spans both sides has left part & right part

Separately find best subarray on left & best subarray on right
(includes middle e_l)

[[x]]
[[x x]]
[[x x x]]
⋮
[[x x x x x x x]]

} $O(n)$ diff
chacs
can be evaluated
in $O(n)$
time.

A (A) Best subarray living only on Left

(B) Best subarray living only on Right

(C) Best subarray living on both

Choose best among (A)(B)(C).

can be found by
best subarray living on R
that contains leftmost
entry of R
+
best subarray living on L
that contains rightmost entry
of L

Divide-and-Conquer: Binary Search

Binary Search

anything less is < 28, Dont look at it

Is 28 in this list?

2	3	8	11	15	17	28	42
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A

Naive alg & linear search. check $A[i]$ for $i=1 \dots n$. $O(n)$ time. Bad
did not exploit structure

15	17	28	42
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28	42
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get 28 in list.

Binary Search

Search(A, t) :

// A[1:n] sorted in ascending order

Return BS(A, 1, n, t)

left end of "active" region
BS(A, l, r, t) : *right end of "active" region*
If (l > r) : return FALSE

width
 $m \leftarrow l + \left\lfloor \frac{r-l}{2} \right\rfloor$ *midpoint of list & round down*

If (A[m] = t) : Return m *nothing to right of m matters*

ElseIf (A[m] > t) : Return BS(A, l, m-1, t)

Else: Return BS(A, m+1, r, t)

modify right endpoint

Activity

- What is the running time of binary search?
 - What is the recurrence?
 - What is the solution to the recurrence?

$O(1)$

```
Search(A, t):  
  // A[1:n] sorted in ascending order  
  Return BS(A, 1, n, t)
```

```
BS(A, l, r, t):  
  If (l > r): return FALSE  
  
  m ← l + ⌊(r-l)/2⌋  
  
  If (A[m] = t): Return m  
  ElseIf (A[m] > t): Return BS(A, l, m-1, t)  
  Else: Return BS(A, m+1, r, t)
```

Effective/active part of A is $A[r:l]$
 $l = r + 1 = n$

$$T(n) = T\left(\frac{n}{2}\right) + Cn^0$$

no 2 here
b/c didn't recurse
on both halves.

Master thm: $a = 1$
 $b = 2$
 $d = 0$

$$\frac{a}{b^d} = 1$$

By thm?

$$T(n) = \Theta(n^d \log n) \\ = \Theta(\log n)$$

Proof of Correctness for Binary Search

Proof of Correctness of Binary Search

Clm: $\forall n \in \mathbb{N} \quad \forall l, r \text{ s.t. } r-l \leq n, \forall A, \forall t$

$$BS(A, l, r, t) = \begin{cases} i \text{ s.t. } A[i] = t \\ \perp \text{ if } t \notin A \end{cases}$$

$H(n)$

Inductive Hyp

Base Case: $H(0) \dots H(1)$ the algorithm is correct

False

Inductive Step: Assume $H(n)$ is true

Suppose that we get $BS(A, l, r, t)$ and $r-l \leq n+1$

$$m \leftarrow l + \lfloor \frac{r-l}{2} \rfloor$$

(Case 3) $A[m] < t$.

Same as case 2.

Search(A, t):

// A[1:n] sorted in ascending order

Return BS(A, 1, n, t)

BS(A, l, r, t):

If (l > r): return FALSE

$$m \leftarrow l + \lfloor \frac{r-l}{2} \rfloor$$

* If (A[m] = t): Return m

* ElseIf (A[m] > t): Return BS(A, l, m-1, t)

* Else: Return BS(A, m+1, r, t)

(Case 1) If $A[m] = t$ ✓

(Case 2) $A[m] > t \Rightarrow t$ is not in $A[m:n]$

$A[m:n]$

b/c list was sorted.

By I.H., $BS(A, l, m-1, t) = i$ if

and \perp otherwise $t \in A[l:m-1]$

If returns false, $t \notin A[l:m-1]$. And $t \notin A[m:n] \Rightarrow t \notin A$.

Binary Search Wrapup

- Search a sorted array in time $O(\log n)$!!!
- Divide-and-conquer approach
 - Find the middle of the list, recursively search half the list
 - **Key Fact:** eliminate half the list each time
- Prove correctness via induction
- Analyze running time via recurrence
 - $T(n) = T(n/2) + C$

If we want
to search
many things,
worth it to
sort in advance

Q: If I want to check if $t \in \text{list } A$,
is it worth it to sort A and do binary search?..?

Sort: $n \log n$ Search: $\log n$ $n \log n + \log n = \Theta(n \log n)$

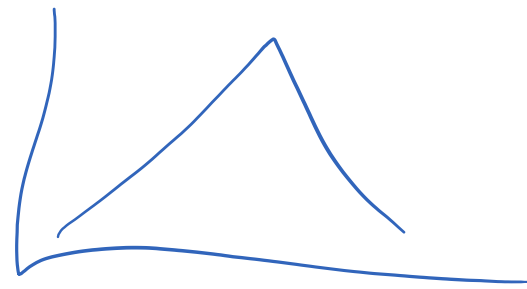
Practice Problem:
Finding maximum of unimodal list

Max of Unimodal List

no repeats

Strictly

Strictly



- **Input:** Array $A[1:n]$ of integers. $A[1:i]$ is increasing. And $A[i+1:n]$ is decreasing.
- **Problem:** Find largest element in $O(\log(n))$ time

Inspired by binary search
how could you solve it by
divide + conquer?

Examples:

$A = [1, 4, 5, 3, 0]$

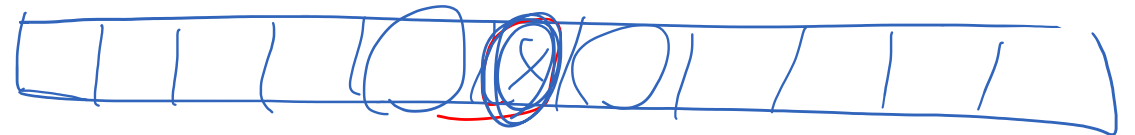
$A = [5, 2, 1, 0, -2]$

$A = [2, 4, 7, 9]$

} all unimodal

Naive algo $O(n)$ time.

Try all possibilities



If x is max among those?, return x .
If left is max, throw away what's right.
If right is max, ————— left

Max of Unimodal List

- **Input:** Array $A[1:n]$ of integers. $A[1:i]$ is increasing. And $A[i+1:n]$ is decreasing.
- **Problem:** Find largest element in $O(\log(n))$ time
- **Examples:**
 - $A = [1,4,5,3,0]$
 - $A = [5,2,1,0,-2]$
 - $A = [2,4,7,9]$