

# CSE525 Lec7: Backtracking



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# Longest Increasing Subsequence

BENT SQUARING ... are subsequences of SUBSEQUENCEBACKTRACKING

Q. Given integer array  $A[1 \dots n]$ , find its longest increasing subsequence.

Incremental

Recursive

Systematic

3	1	4	1	5	9	2	6	5	3	5	8
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Q. What problem should be (recursively) solved? Assume that  $A$  is global.

- **LIS:** Given input  $i$ , return LIS of  $A[i \dots n]$  ✗
- **LIS1:** Given input  $prev$  and  $i$ , return LIS of  $A[i \dots n]$  in which every element is larger than  $A[prev]$
- **LIS2:** Given input  $i$ , return LIS of  $A[i \dots n]$  in which the subsequence starts with  $A[i]$

# Longest Increasing Subsequence

Q. Given integer array  $A[1 \dots n]$ , find its longest increasing subsequence.

0	1	2	3	4	Incremental			Recursive			Systematic		
$-\infty$	3	1	4	1	5	9	2	6	5	3	5	8	

→ sentinel

$LIS2(0) =$  length of LIS of  $A[0 \dots n]$  in which the subseq. starts with  $-\infty$

- $LIS2(i)$ : Given  $i$ , return LIS of  $A[i \dots n]$  in which the subsequence starts with  $A[i]$

$$= [-\infty]. LIS(A[1 \dots n])$$

$$LIS2(i) = 1 + \max \{ LIS2(j) : i < j \text{ such that } A[i] < A[j] \}$$

What is no such  $j$  exists?

(base)  $LIS2(n) = 1$

LIS = ?  $LIS2(1), LIS2(2), \dots, LIS2(n)$

1.  $LIS(A) = \max \{ LIS2(i) : \text{all } i \}$

2.  $LIS(A) = LIS2(0) - 1$  in which  $A[0] = -\infty$

# Longest Increasing Subsequence

**LIS2(i):** Given i, return LIS of  $A[i \dots n]$  in which the subsequence starts with  $A[i]$

$$\text{LIS2}(i) = 1 + \max \{ \text{LIS2}(j) : i < j \text{ such that } A[i] < A[j] \}$$

(base)  $\text{Solve}(n) = 1$

1.  $\text{LIS}(A) = \max \{ \text{LIS2}(i) : \text{all } i \}$

2.  $\text{LIS}(A) = \text{LIS2}(0) - 1$  in which  $A[0] = -1$

Time complexity:  $T(n+1) = O(n)$

LIS(A[1..n]):

best  $\leftarrow 0$

for  $i \leftarrow 1$  to  $n$

best  $\leftarrow \max\{\text{best}, \text{LISFIRST}(i)\}$

return best

LISFIRST(i):

best  $\leftarrow 0$

for  $j \leftarrow i + 1$  to  $n$

if  $A[j] > A[i]$

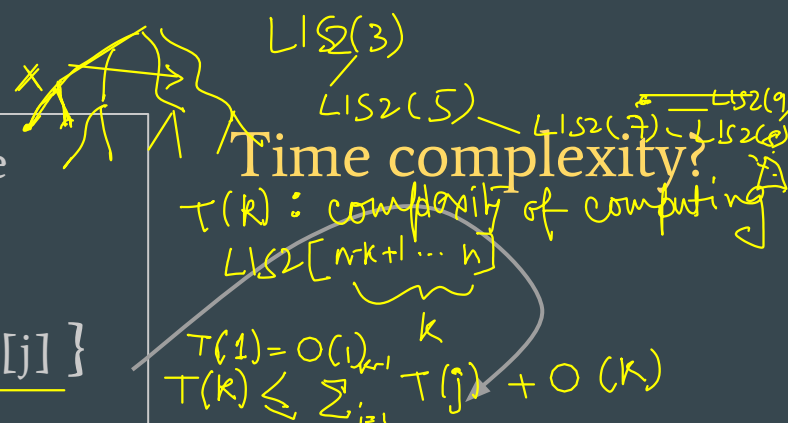
best  $\leftarrow \max\{\text{best}, \text{LISFIRST}(j)\}$

return  $1 + \text{best}$

LIS(A[1..n]):

$A[0] \leftarrow -\infty$

return  $\text{LISFIRST}(0) - 1$



# Longest Increasing Subsequence

Q. Given integer array  $A[1 \dots n]$ , find its longest increasing subsequence.

Incremental

Recursive

Systematic

1	2	3	4	5	6	7	8	9	10	11	12
3	1	4	1	5	9	2	6	5	3	5	8

- Given input  $prev$  and  $i$  where  $prev < i$ , return LIS of  $A[i \dots n]$  in which every element of the LIS is larger than  $A[prev]$

Solve( $prev, i$ ): If  $prev < i$ , return length of LIS of  $A[i \dots n]$  in which every element is larger than  $A[prev]$ . If  $prev \geq i$ , undefined.  $Solve(1, 10) = ?$   $Solve(1, 11) = ?$   $Solve(1, 12) = ?$

Q: Write recursive expression to compute Solve( $prev, i$ ). Include boundary/base cases. What happens to Soln. if  $A[prev] > A[i]$ ? What happens to Soln. if  $A[prev] < A[i]$  ?

# Binary search trees

$$B(n) \Big|_{\text{root is } i} = B(i-1) * B(n-i)$$

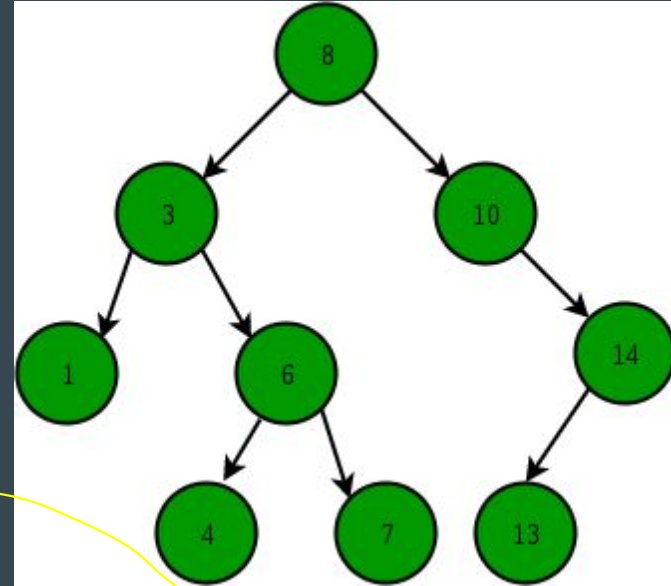
Number of binary search trees from

Ex-1	1	3	4	6	7	8	10	13	14
Ex-2	1	2	3	4	5	6	7	8	9
Ex-3	20	12	2	130	13	23	34	14	42

$n_1$

$n_2$

$n_3$



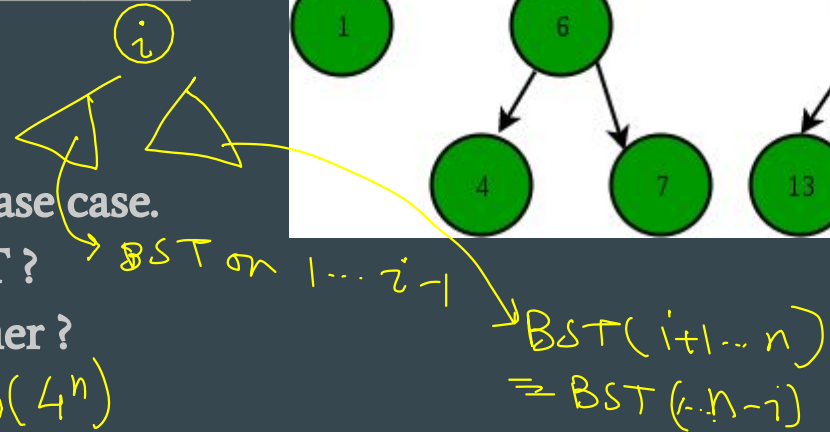
$B(n)$  = number of BSTs from  $n$  numbers

$[1 \dots n]$

Q: Write a recursive formula for  $B(n)$  w/ base case.

What is the first thing you draw in a BST?

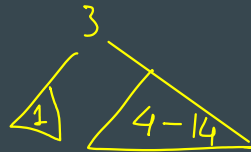
Can you draw a BST in a recursive manner?



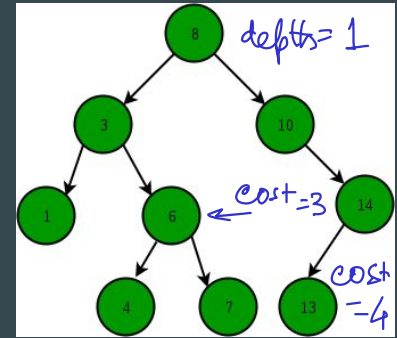
$$B(1) = 1 \quad B(n) = \sum_{i=1}^n B(i-1) * B(n-i) = O(4^n)$$

$$B(i+1 \dots n) = B(i \dots n-1)$$

# Optimal BST given search frequencies



key	1 <sub>1</sub>	3 <sub>2</sub>	4 <sub>3</sub>	6 <sub>4</sub>	7 <sub>5</sub>	8 <sub>6</sub>	10 <sub>7</sub>	13 <sub>8</sub>	14 <sub>9</sub>
freq	5	7	2	6	9	1	3	4	2



Given tree T, access Cost(T) = total cost of search in T =  $\sum_{i=1}^n freq[i] \times depth(i, T)$



r is automatically accessed during access to 1, 2, ... r-1

$$\text{cost}(T.\text{left}) + \text{freq}(1) + \dots + \text{freq}[r-1]$$

Q: Given T with root r(T), Cost(T) = cost from r(T), cost from T.left, cost from T.right

$$\min_r \left\{ \sum_{i=1}^n freq[i] + \text{Cost}(T.\text{left}) + \text{Cost}(T.\text{right}) \right\}$$

↳ does not depend on r

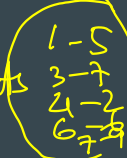
$$\text{freq}[r] \times \text{depths}(\text{root}) = 1$$

independently

$$\text{cost}(T.\text{right}) + \text{freq}(r+1) + \dots + \text{freq}(n)$$

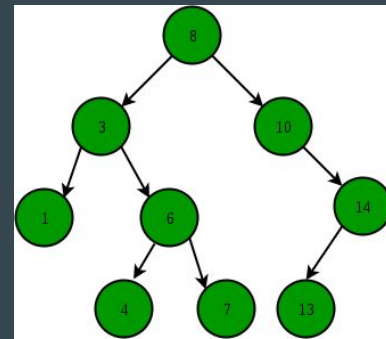
Cost(T.left | root = r)

= cost of pr-BST on elements



# Optimal BST given search frequencies

key	1	3	4	6	7	8	10	13	14
freq	5	7	2	6	9	1	3	4	2



Given tree  $T$ , access  $Cost(T) = \text{total cost of search in } T = \sum_{i=1}^n freq[i] \times depth(i, T)$

Q: Given  $T$  with root  $r(T)$ ,  $Cost(T) = \text{cost from } r(T), \text{cost from } T.left, \text{cost from } T.right$

$$\sum_{i=1}^n freq[i] + Cost(T.left) + Cost(T.right)$$

Q: From key-freq table, construct tree with smallest cost. Solve  $OptCost(1,n)$ .

$OptCost(i,k) = \text{cost of minimum cost BST using keys } \{ i, i+1, \dots, k \}$

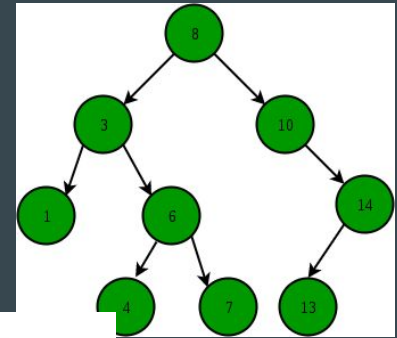
Suppose you knew how to solve  $OptCost(2,n) / OptCost(3,n) / \dots OptCost(1,n-1)$ .



Opt Cost(1, n) = original problem

# Optimal BST given search frequencies

key	1 <sub>1</sub>	3 <sub>2</sub>	4 <sub>3</sub>	6 <sub>4</sub>	7 <sub>5</sub>	8 <sub>6</sub>	10 <sub>7</sub>	13 <sub>8</sub>	14 <sub>9</sub>
freq	5	7	2	6	9	1	3	4	2



$$\text{OptCost}(i, k) = \begin{cases} 0 & \text{if } i > k \\ \sum_{j=i}^k f[j] + \min_{i \leq r \leq k} \left\{ \begin{array}{l} \text{OptCost}(i, r-1) \\ + \text{OptCost}(r+1, k) \end{array} \right\} & \text{otherwise} \end{cases}$$

*T(j)*      *j* →      *T.left | root = r*      *cost*      *T*      *T.right | root = r*



Q: What is the recurrence for time-complexity?

T(i,k) = time-complexity to compute OptCost(i,k)

T(j) = time-complexity to compute OptCost([any range with j elements])

$$T(j) = \sum_{t=1}^j [T(t-1) + T(j-t)] + O(j) = O(3^n)$$

Q: Solve recurrence. Compare with number of total number of BSTs.

*T(3) = cost to compute OptCost(1..3)*  
*= ... .. ([2..4])*

Show that T(n) - T(n-1) = 2T(n-1) + ...

$$T(j) = \sum_{t=1}^j [T(t-1) + T(j-t)] + c_j = T(0) + T(j-1) + T(1) + T(j-2) + \dots + T(j-1) + T(0) + c_j$$

$$T(j) = 2 \sum_{t=0}^{j-1} T(t) + c_j$$

$$T(j+1) = 2 \sum_{t=0}^j T(t) + c_{j+1}$$

$$O(n^2) = \{ f(n) : \dots \}$$

$$T(j) - T(j-1) = 2T(j-1) + c$$

$$T(j) = 3T(j-1) + c = O(3^n)$$

$$\min_x (f(x) + g(x))$$

$$= \min_x f(x) + \min_x g(x)$$

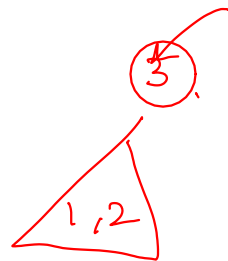
1	2	3	1
$f_1$	$f_2$	$f_3$	

given 3 is the root



opt. BST for 2, 1

$$f_1 + f_2$$



$$\text{Cost}(T) = \text{Cost}(3)$$

$$+ (f_1 + f_2)$$

It access root while  
access 2, 1

$$\text{Cost}(3) + \text{Cost}(4) + \boxed{\text{Cost}(2) + \text{Cost}(1)} + \text{Cost}(4, 1)$$