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3.2 BINARY SEARCH TREES

- ▶ *BSTs*
- ▶ *ordered operations*
- ▶ *deletion*



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- ▶ *BSTs*
- ▶ *ordered operations*
- ▶ *deletion*

Binary search trees

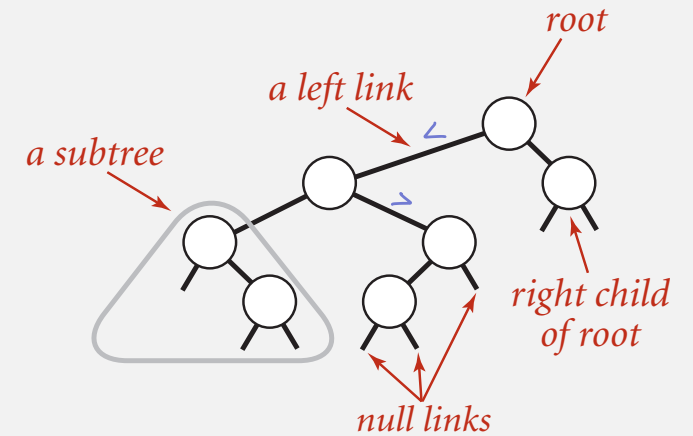
1) BT
2) $L \leq N \leq R$

المعادنه تبدأ + للاولاد maximum
عدد ال nodes
لازم الجزء اليسار يكون
اليمين اكبر منه او يساويه

Definition. A BST is a binary tree in symmetric order.

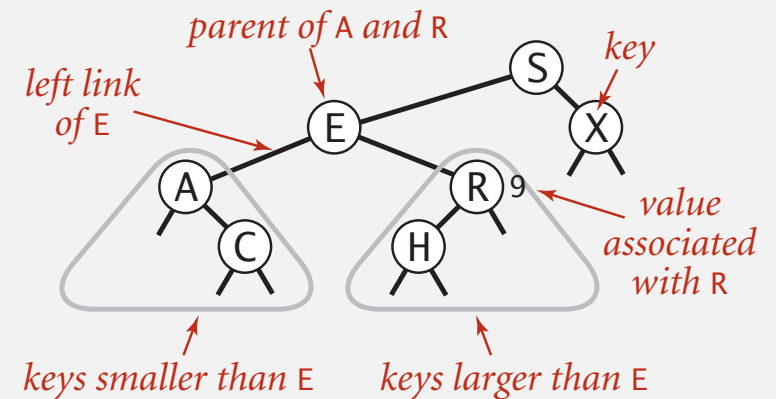
A binary tree is either:

- Empty.
- Two disjoint binary trees (left and right).



Symmetric order. Each node has a key, and every node's key is:

- Larger than all keys in its left subtree.
- Smaller than all keys in its right subtree.

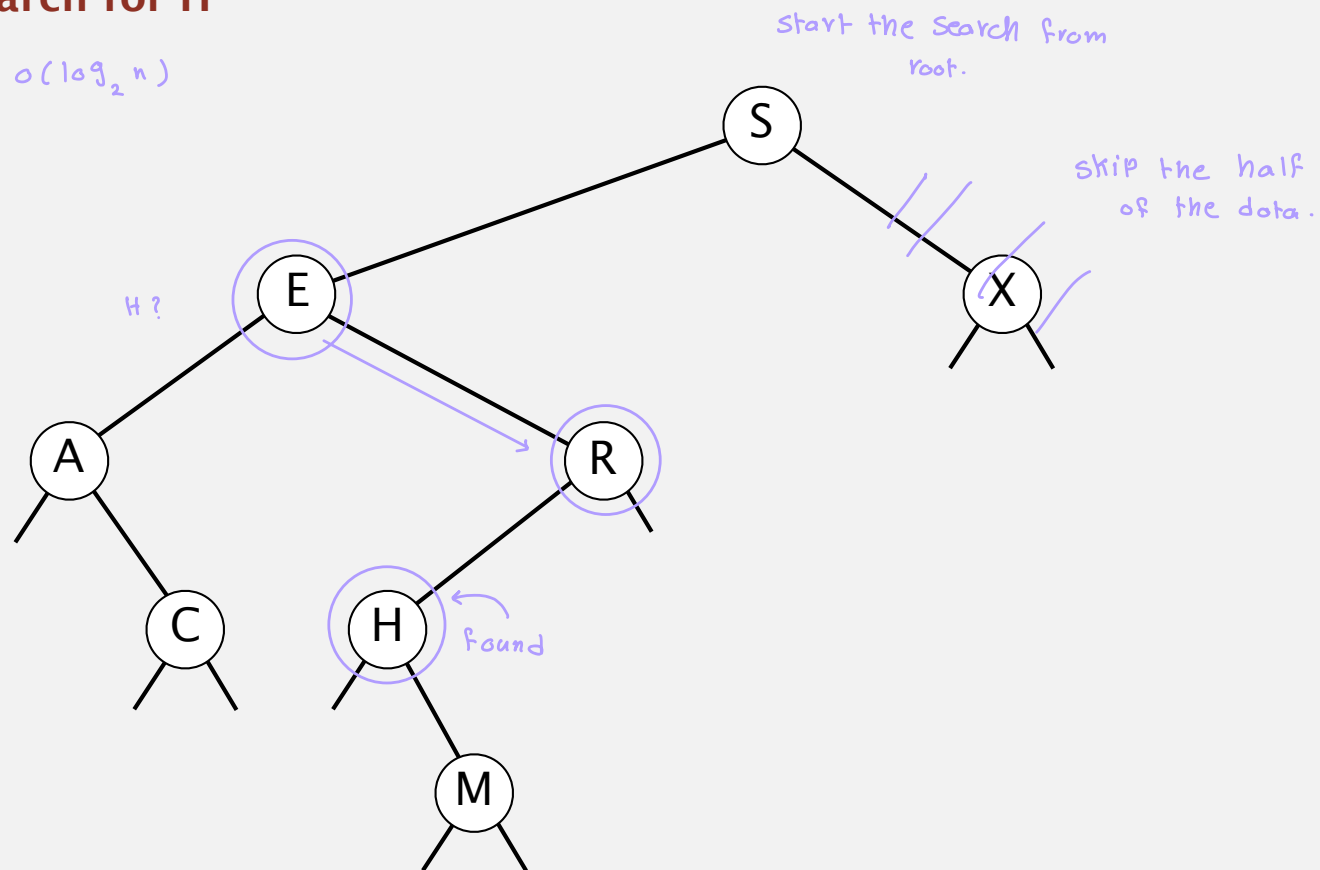


Binary search tree demo

Search. If less, go left; if greater, go right; if equal, search hit.

successful search for H

$n = 8$
best = 4 $\rightarrow o(\log_2 n)$

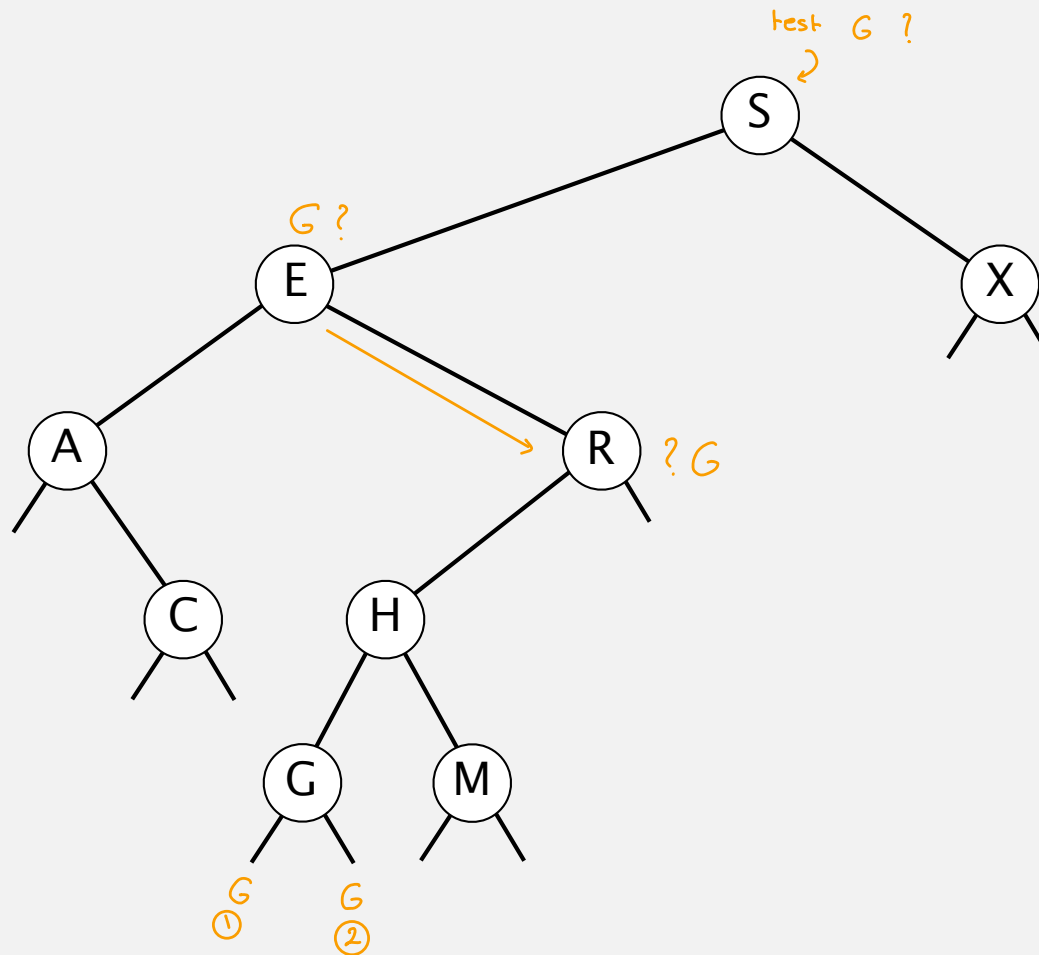


Binary search tree demo

Insert. If less, go left; if greater, go right; if null, insert.

insert G

- 1-
- 2- $L < N \leq R$
- $L \leq N < R$



BST representation in Java

Java definition. A BST is a reference to a root Node.

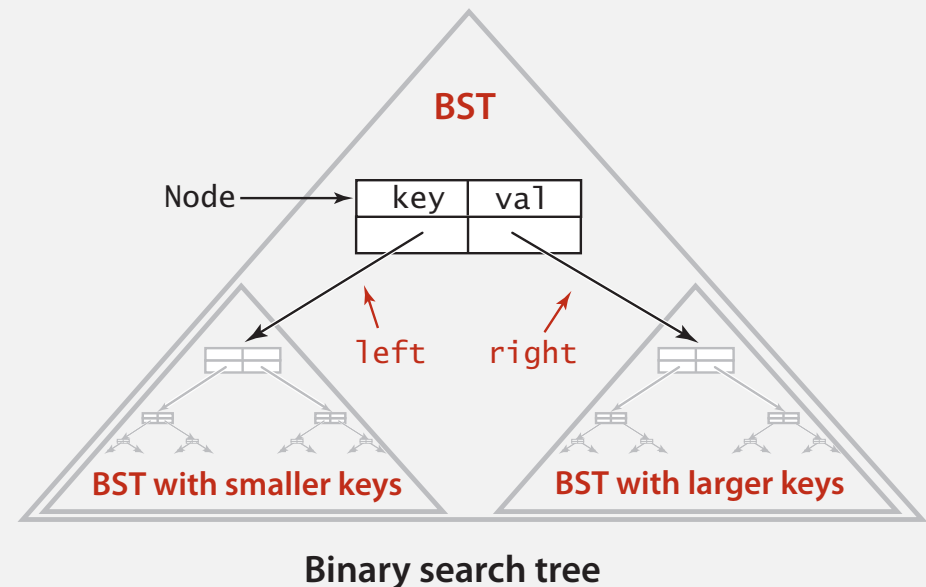
A Node is composed of four fields:

- A Key and a Value.
- A reference to the left and right subtree.

↑ smaller keys ↑ larger keys

Key : ID	

```
private class Node
{
    private Key key; must be unique data.
    private Value val;
    private Node left, right;
    public Node(Key key, Value val)
    {
        this.key = key;
        this.val = val;
    }
}
```



Key and Value are generic types; Key is Comparable

BST implementation (skeleton)

```
public class BST<Key extends Comparable<Key>, Value>  
{
```

```
    private Node root;
```

← root of BST

```
    private class Node  
    { /* see previous slide */ }
```

```
    public void insertput(Key key, Value val)  
    { /* see next slides */ }
```

```
    public Value searchget(Key key)  
    { /* see next slides */ }
```

```
    public void delete(Key key)  
    { /* see next slides */ }
```

```
    public Iterable<Key> iterator()  
    { /* see next slides */ }
```

```
}
```

BST search: Java implementation

↪ must be ordered

Get. Return value corresponding to given key, or null if no such key.

Tree Search:

عندنا ثلاث احتمالات

- 1- يا اما تساويها .
- 2- يا اما اكبر منها .
- 3- يا اما انها null .
- 4- يا اما اصغر منها .

اذا كانت (External) :

— معاناتها : null متى موجودة
وتعمل return الـ Value .

— واذا كانت اقل بتنادي

الـ function على الجهة اليسار .

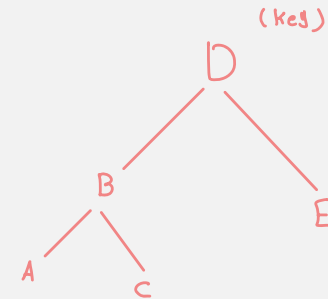
— اذا كانت تساوي معاناته
لقمها بيرجع الـ Value .

— اذا كانت اكبر بتادي

الـ function على الجهة اليمين .

```
public Value get(Key key)
{
    Node x = root;
    while (x != null)
    {
        int cmp = key.compareTo(x.key);
        if (cmp < 0) x = x.left;
        else if (cmp > 0) x = x.right;
        else if (cmp == 0) return x.val;
    }
    return null; Element does not exist.
}
```

$O(\log n + 1)$ → We add one to search



Cost. Number of compares is equal to 1 + depth of node.

كل ما كبرت ال array
 ما ر اسرع في الحسابات



Search for (7)

first = 0
 last = 4
 $mid = (0+4) / 2 = 2$
 $a[2] = 5$
 $5 < 7$

first = mid + 1 = 3
 last = 4
 $mid = (3+4) / 2 = 3$

$a[3] = 7$ Stop
 7 = 7 found

Search for (6):

first = 0
 last = 4
 $mid = (0+4) / 2 = 2$
 $a[2] = 5$
 $5 < 6$

first = mid + 1 = 3
 last = 4
 $mid = (3+4) / 2 = 3$

$a[3] = 7$
 $7 > 6$

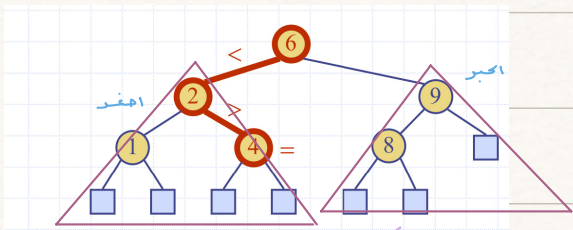
لما ن يكون مندي اهل
 بيحرك ال last

first = 3
 * last = mid - 1 = 2

لما ال last اجفنا ال
 first دائم ال first اجفنا ال last
 لان ال first يجي من قدام . وال last
 من واد . فال first قيمه كالمند اجفنا ال last .

فالمن يجي كذا ال first اكبر من ال last مناته يعمل (Stop) و not found

$left > right < mid$
 * $Key(u) \leq Key(v) \leq Key(w)$



* immediate successor: ال قيمة مباشرة ، بتحرك وحدة ال right وبمين لاقص ال left

* immediate predecessor: ال قيمة مباشرة ، بتحرك وحدة ال left وبمين لاقص ال right.

ايضا اكبر قيمة فيها : بيكون اكثر
 شي ، right .
 بيتش اوفر قيمة فيها : بيكون اكثر شي ، left .

مين قبل ال ؟ : بتحرك وحدة ال left بيمين

مين الي بعد ال ؟ : بتحرك وحدة ال right

right , right , right لاقص ال right ويكون مندي قبل ال .

بيمين left , left , left لاقص ال left

ويكون هذا
 الي بعد ال .

BST insert

Put. Associate value with key.

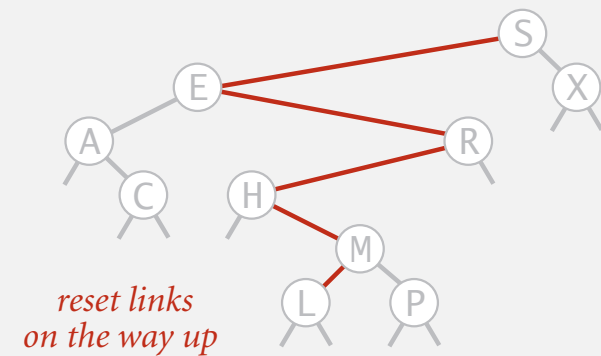
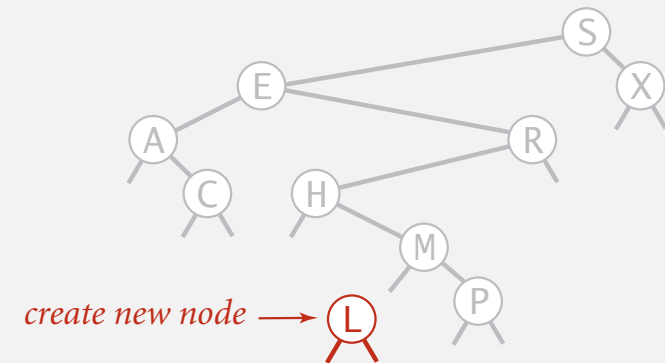
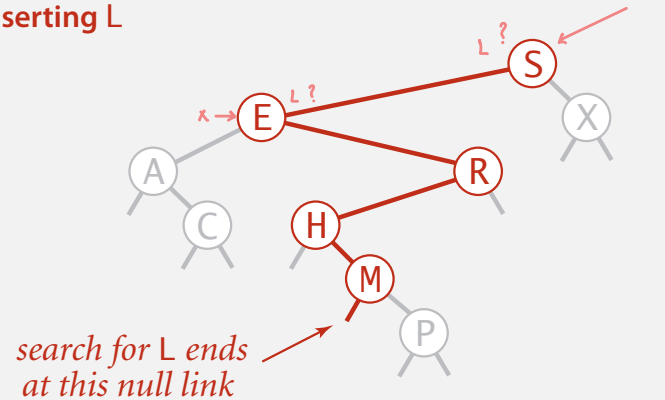
Search for key, then two cases:

- Key in tree \Rightarrow reset value.
- Key not in tree \Rightarrow add new node.

✳ اول ما اخيف رقم يكون هو ال root .
 بعدين بضيف رقم ثاني بيقل منه بال root
 اذا اصغر بيروح left واذا اكبر بيروح right وهكذا .
 ✳ البحث يبدأ من ال root يقارن الي يحصل الرقم
 اذا هو موجود يعتبر (Not found) .

Inorder tree: $L < \text{root} < R$

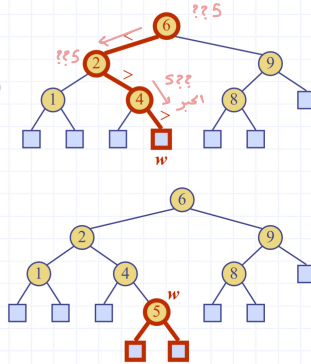
inserting L



Insertion into a BST

Insertion

- ◆ To perform operation `put(k, o)`, we search for key `k` (using `TreeSearch`)
- ◆ Assume `k` is not already in the tree, and let `w` be the leaf reached by the search
- ◆ We insert `k` at node `w` and expand `w` into an internal node
- ◆ Example: insert 5



20

Insertion

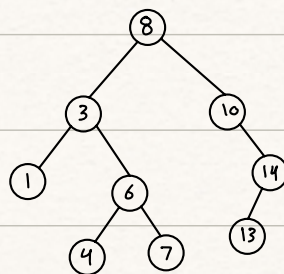
- ◆ Insert the following elements in a BST



© 2014 Goodrich, Tamassia, Goldwasser

Binary Search Trees

22



BST insert: Java implementation

Put. Associate value with key.

```
public void put(Key key, Value val)
{ root = put(root, key, val); }

private Node put(Node root x, Key key, Value val)
{
    if (x == null) return new Node(key, val);
    int cmp = key.compareTo(x.key);
    if (cmp < 0)
        x.left = put(x.left, key, val);
    else if (cmp > 0)
        x.right = put(x.right, key, val);
    else if (cmp == 0)
        x.val = val;
    return x;
}
```

Found, 0 →
right →

concise, but tricky,
recursive code;
read carefully!

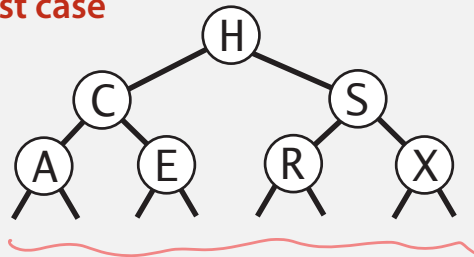
Cost. Number of compares is equal to 1 + depth of node.

Tree shape → linked list representation

- Many BSTs correspond to same set of keys.
- Number of compares for search/insert is equal to 1 + depth of node.

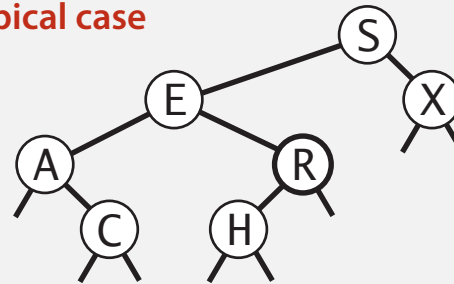
$$O(n) \longrightarrow O(\log_2 n)$$

best case



Proper binary search tree
 $O(\log_2 n)$

typical case



$O(\log_2 n) \sim O(n)$

worst case

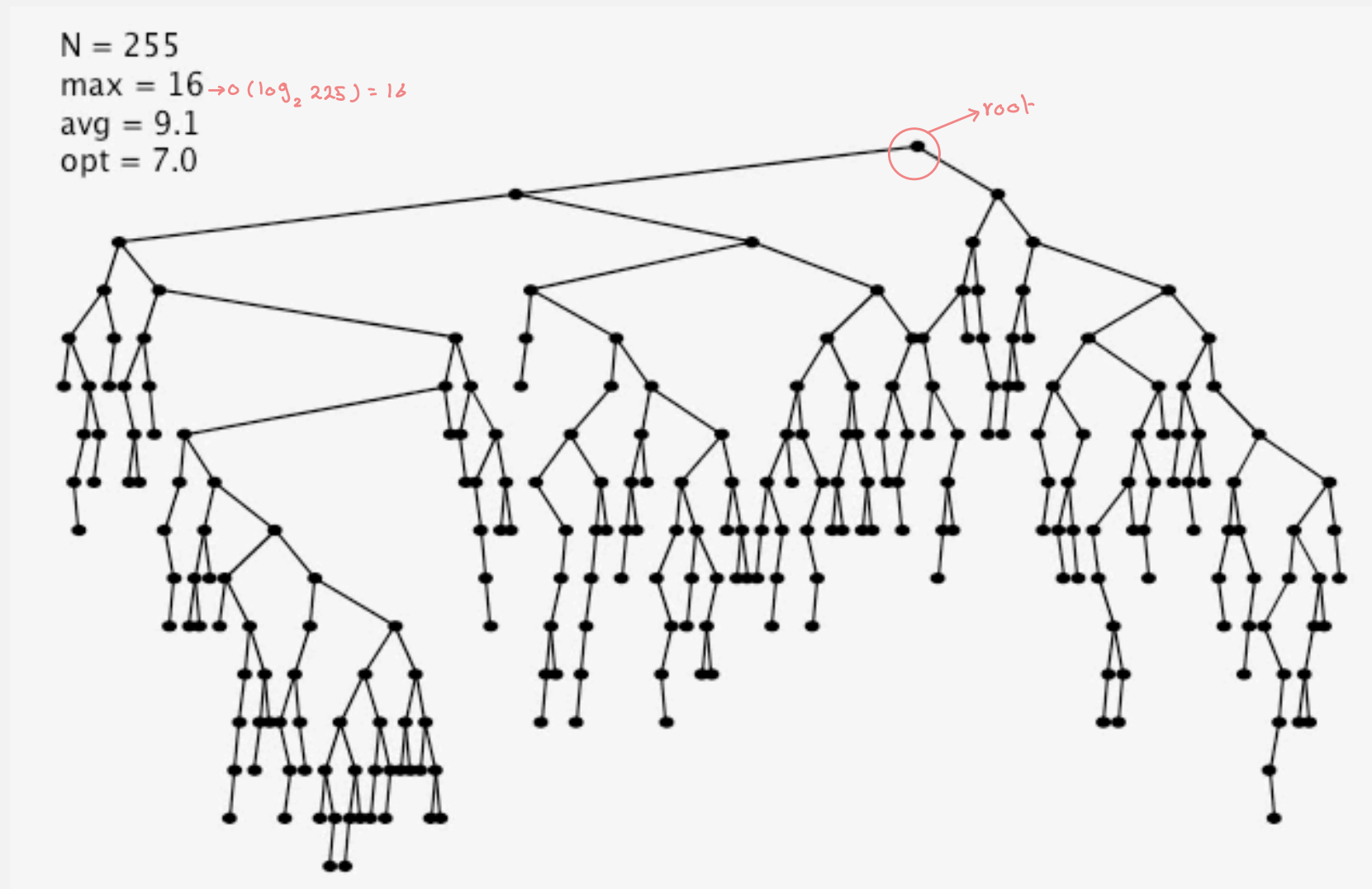


$O(n)$

Bottom line. Tree shape depends on order of insertion.

BST insertion: random order visualization

Ex. Insert keys in random order.

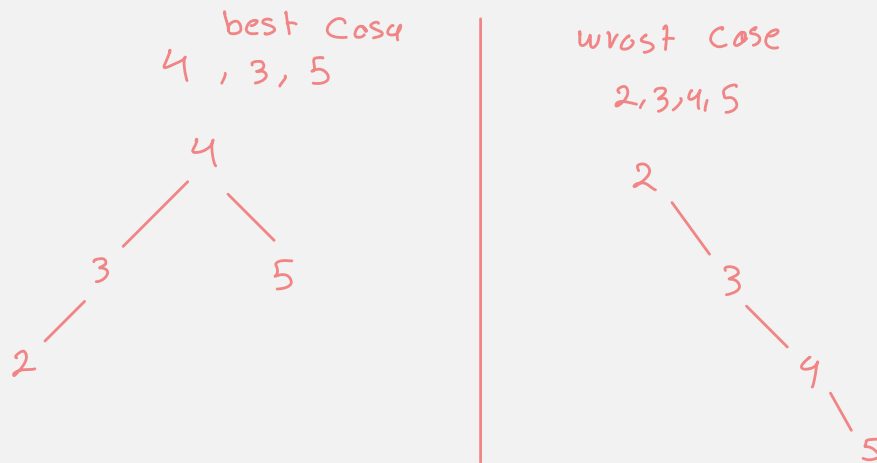


BSTs: mathematical analysis

Proposition. If N distinct keys are inserted into a BST in **random** order, the expected number of compares for a search/insert is $\sim 2 \ln N$.

Pf. 1–1 correspondence with quicksort partitioning.

Proposition. [Reed, 2003] If N distinct keys are inserted in random order, expected height of tree is $\sim 4.311 \ln N$.



How Tall is a Tree?

Bruce Reed
CNRS, Paris, France
reed@moka.ccr.jussieu.fr

ABSTRACT

Let H_n be the height of a random binary search tree on n nodes. We show that there exists constants $\alpha = 4.31107\dots$ and $\beta = 1.95\dots$ such that $\mathbf{E}(H_n) = \alpha \log n - \beta \log \log n + O(1)$. We also show that $\text{Var}(H_n) = O(1)$.

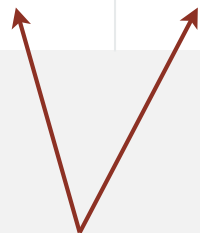
But... Worst-case height is $N - 1$.

[exponentially small chance when keys are inserted in random order]

ST implementations: summary

WCS

implementation	guarantee		average case		operations on keys
	search	insert	search hit	insert	
sequential search (unordered list)	N	N	$\frac{1}{2} N$	N	equals()
binary search (ordered array)	$\lg N$	N	$\lg N$	$\frac{1}{2} N$	compareTo()
BST	N	N	$1.39 \lg N$	$1.39 \lg N$	compareTo()



Why not shuffle to ensure a (probabilistic) guarantee of $4.311 \ln N$?



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- ▶ *deletion*

ST implementations: summary

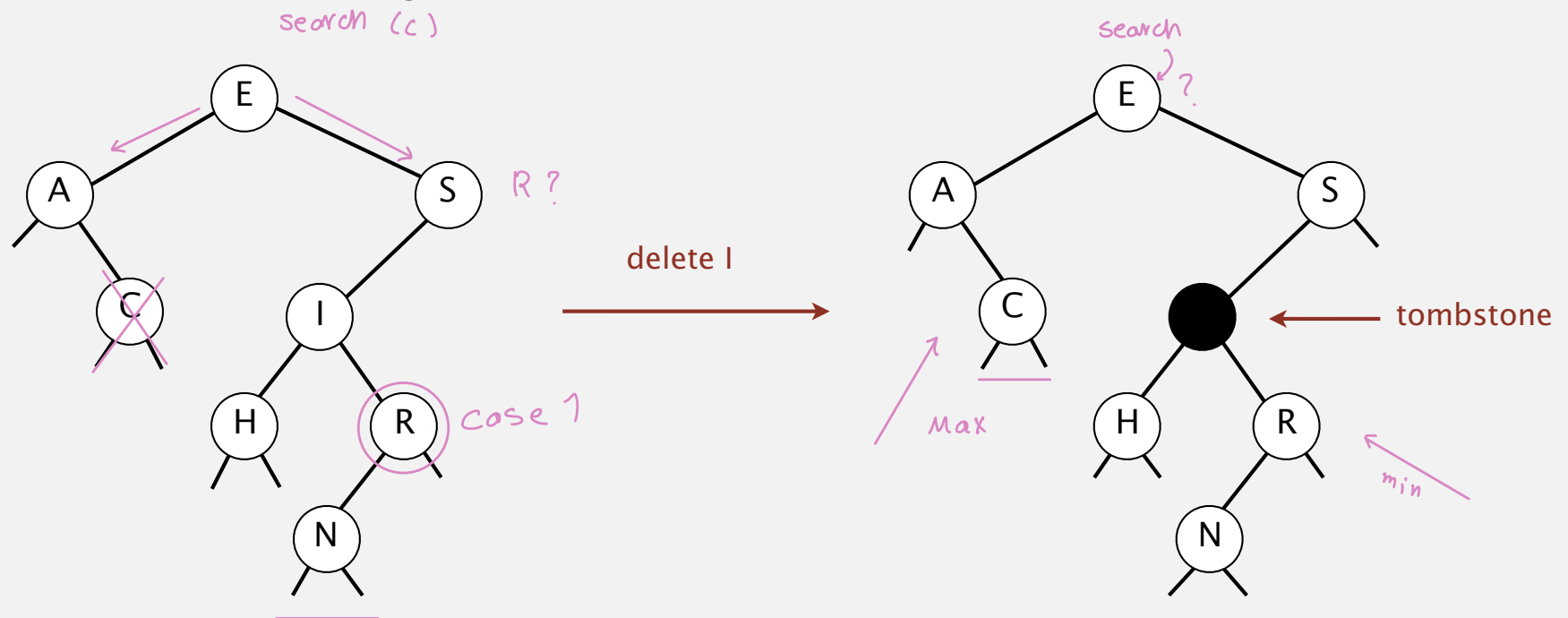
implementation	guarantee			average case			ordered ops?	operations on keys
	search	insert	delete	search hit	insert	delete		
sequential search (linked list)	N	N	N	$\frac{1}{2} N$	N	$\frac{1}{2} N$		<code>equals()</code>
binary search (ordered array)	$\lg N$	N	N	$\lg N$	$\frac{1}{2} N$	$\frac{1}{2} N$	✓	<code>compareTo()</code>
BST	N	N	N	$1.39 \lg N$	$1.39 \lg N$???	✓	<code>compareTo()</code>

Next. Deletion in BSTs.

BST deletion: lazy approach

To remove a node with a given key:

- Set its value to null.
- Leave key in tree to guide search (but don't consider it equal in search).



Cost. $\sim 2 \ln N'$ per insert, search, and delete (if keys in random order), where N' is the number of key-value pairs ever inserted in the BST.

Unsatisfactory solution. Tombstone (memory) overload.

Deletion

◆ Deletion in BST has 3 cases:

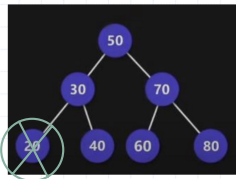
- Node to be deleted is a leaf node has no child
- Node to be deleted has only one child
- Node to be deleted has two children

Deletion

◆ Case 1:

- Delete node with value '20'

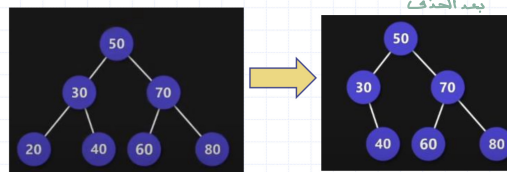
اول شي نبحث عن الـ 20 .
ثاني شي نحدد اولادها.
اذا ما عندها بلغي الـ node .



Deletion

◆ Case 1:

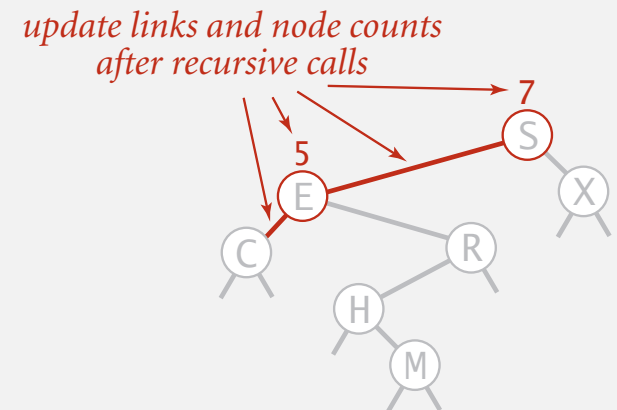
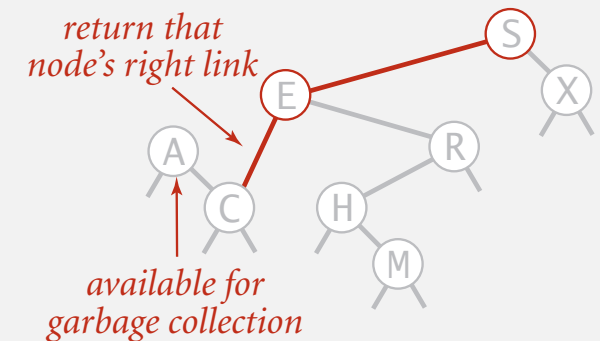
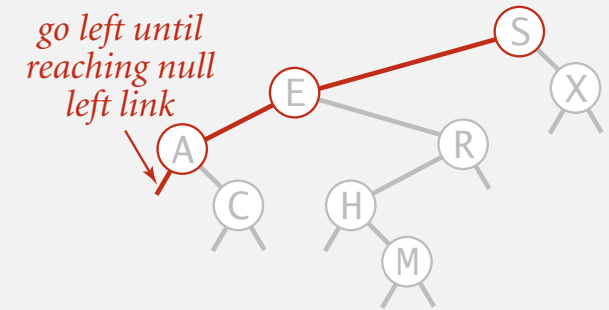
- Delete node with value '20'



Deleting the minimum

To delete the minimum key:

- Go left until finding a node with a null left link.
- Replace that node by its right link.
- Update subtree counts.



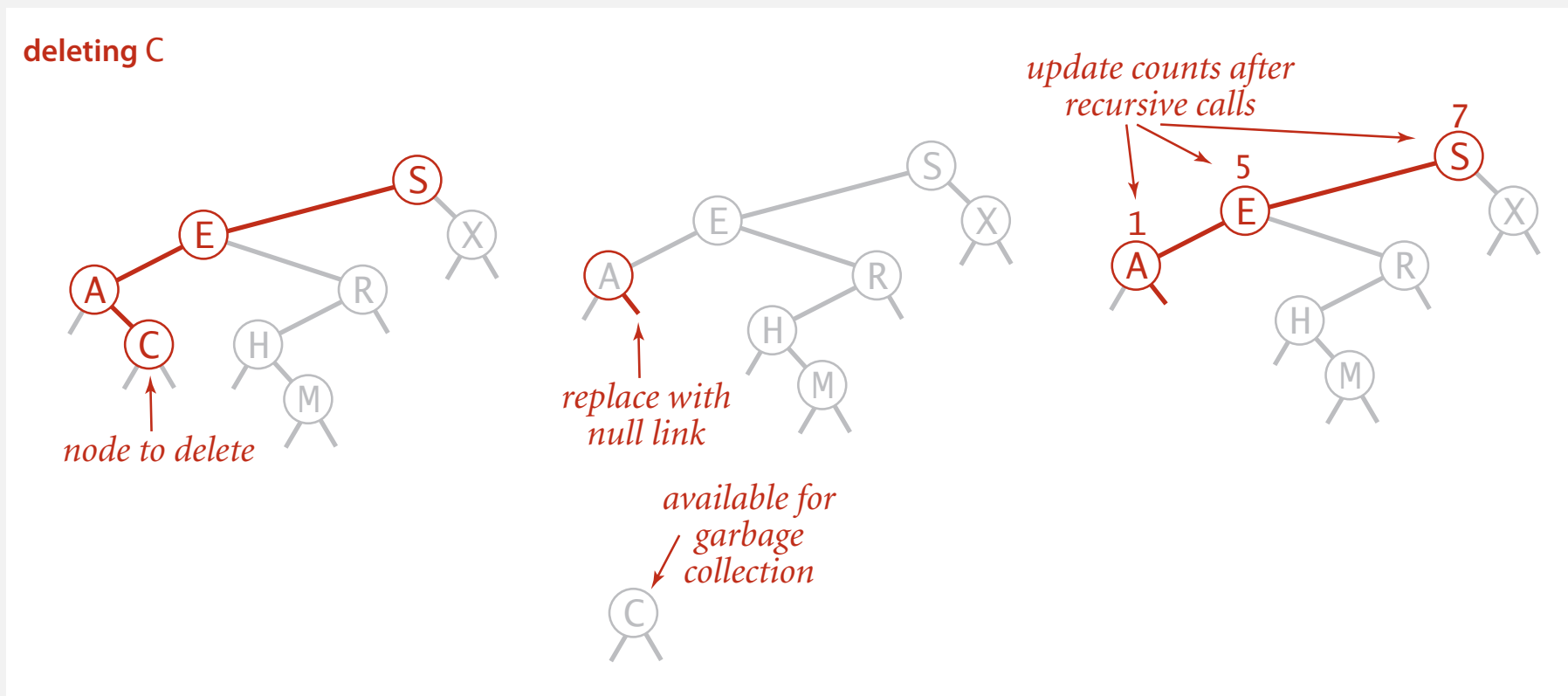
```
public void deleteMin()
{ root = deleteMin(root); }

private Node deleteMin(Node x)
{
    if (x.left == null) return x.right;
    x.left = deleteMin(x.left);
    x.count = 1 + size(x.left) + size(x.right);
    return x;
}
```

Hibbard deletion *Case 2 :*

To delete a node with key k : search for node t containing key k .

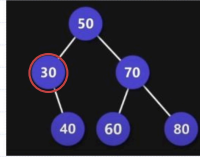
Case 0. [0 children] Delete t by setting parent link to null.



Deletion

Case 2

- Delete node with value '30' →

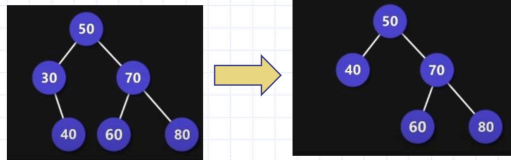


اولاً نريد ان نبحث عن الـ 30
مما يلي سنعد اولاده.
عنده ابن واحد.
سواء يسار او يمين، بمثل الأب بالابن دائماً.

Deletion

Case 2

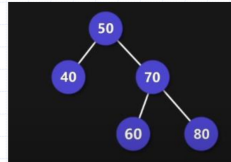
- Delete node with value '30'



Deletion

Case 3

- Delete node with value '50' →

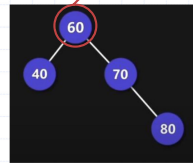
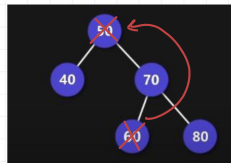


اولاً نحن نبحث عن الـ 50.
ثانياً نعيء كيم مدد الـ 50
منه TwoChild.
ما يجير الـ node الـ مرفوعة.
بوزم يجي واحد يجير مكانه اذا فكيت الـ node راح
تفتح الـ tree.
راح نجيب واحد مناسب يجي مكانه.
— يا باخذ اكبر node من جهة الـ left.
— او ياخذ اصغر node من جهة الـ right.

Deletion

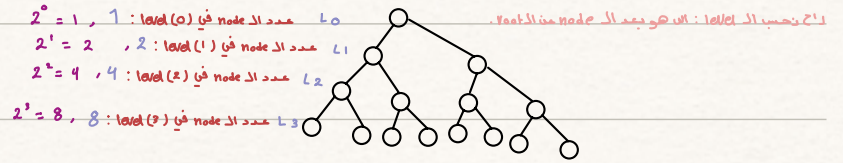
Case 3

- Delete node with value '50' →



صو اخذاك هو الي هو اجغر node
من جهة الـ right.

عدد الـ node في level معين؟



لا ايضاً الملاقة بين الـ level و عدد الـ nodes :

BT : $O(n)$

Level
 2 = numbers of Node
 عدد الـ nodes في level معين .

لا ايضاً هو اقل عدد في الـ nodes : الـ node واحد

لا ايضاً هو الـ height : $E \leftarrow$ اخر $height = 1 + level$

لا ايضاً هو الـ maximum : اتجاه اجتمع

$$2^4 - 1 = 15 \leftarrow 1 + 2 + 4 + 8 = 15$$

height : بعد ما ارتقاها من الارض :

depth : من فوق لتحت .



balance : فرق الـ level بين الـ left و الـ right .

$(0, 1, -1)$ يكون
 left-right
 or
 right-left

$h(f) = 0$
 $h(d) = 0$
 $h(c) = 0$
 $h(e) = 1$
 $h(b) = 2$
 $h(a) = 3$

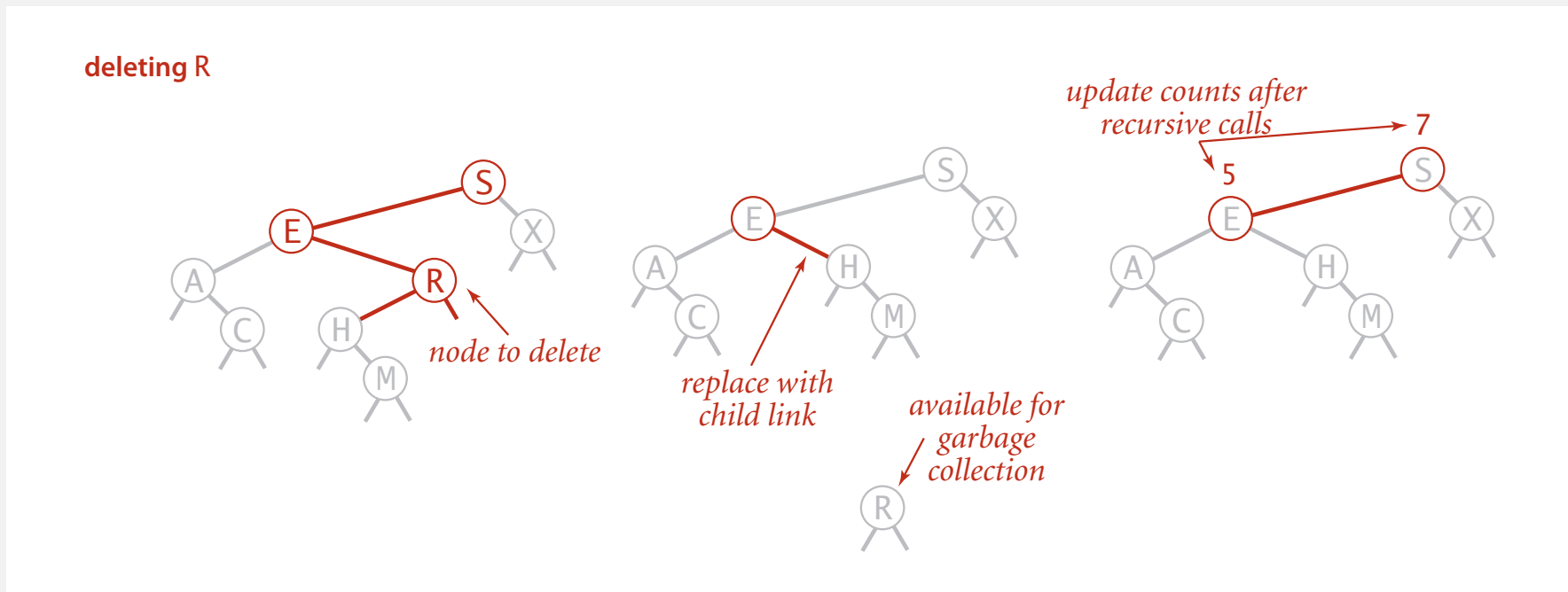
$d_{tree} = 3 \rightarrow h$

عدد الـ edges بعد الـ nodes من الـ root .

Hibbard deletion

To delete a node with key k : search for node τ containing key k .

Case 1. [1 child] Delete τ by replacing parent link.

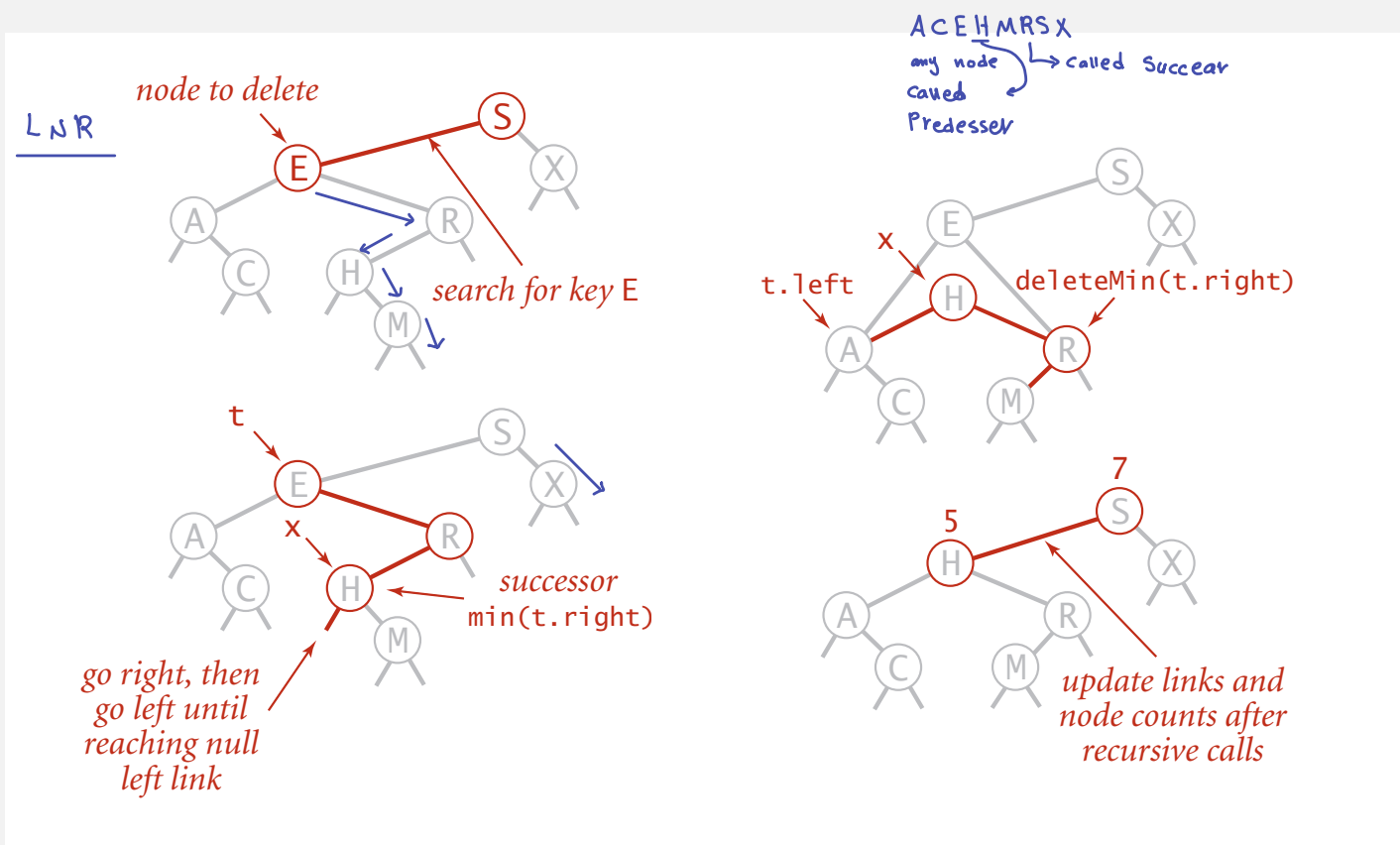


Hibbard deletion

To delete a node with key k : search for node t containing key k .

Case 2. [2 children]

- Find successor x of t . ← x has no left child
- Delete the minimum in t 's right subtree. ← but don't garbage collect x
- ^{replace} Put x in t 's spot. ← still a BST



Hibbard deletion: Java implementation

```
public void delete(Key key)
{ root = delete(root, key); }
```

+ insert start from root.

```
private Node delete(Node x, Key key) {
```

```
    if (x == null) return null;
```

```
    int cmp = key.compareTo(x.key);
```

```
    if (cmp < 0) x.left = delete(x.left, childe key);
```

search for key

```
    else if (cmp > 0) x.right = delete(x.right, key);
```

```
    else {
```

```
        if (x.right == null) return x.left; childe case: (1 childe)
```

no right child

```
        if (x.left == null) return x.right;
```

no left child

element found

```
        Node t = x;
```

```
        x = min(t.right); x = max(t.left)
```

replace with successor

```
        x.right = deleteMin(t.right);
```

```
        x.left = t.left;
```

```
    }
```

```
    update size after delete  
    x.count = size(x.left) + size(x.right) + 1;
```

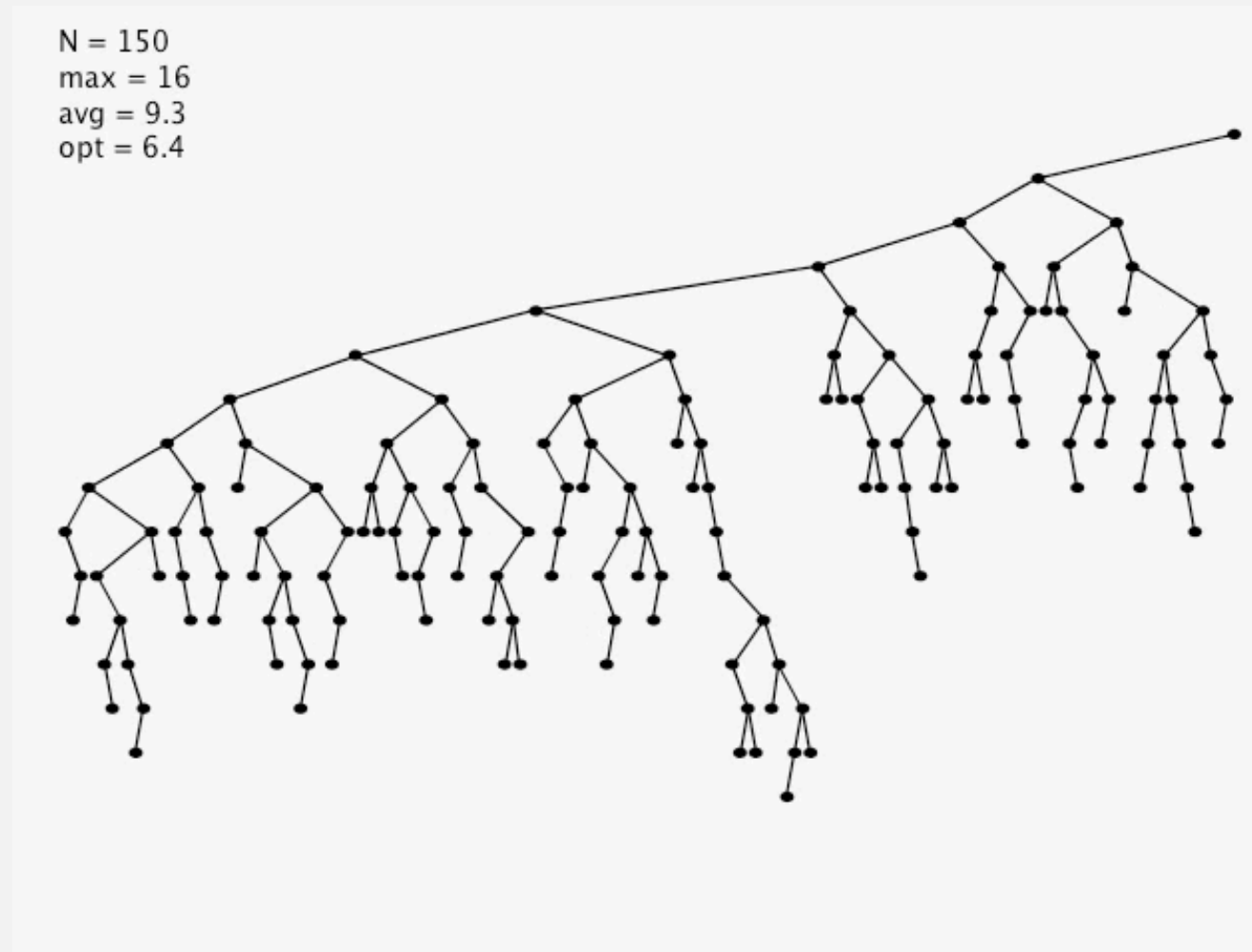
update subtree counts

```
    return x;
```

```
}
```

Hibbard deletion: analysis

Unsatisfactory solution. Not symmetric.



Surprising consequence. Trees not random (!) $\Rightarrow \sqrt{N}$ per op.

Longstanding open problem. Simple and efficient delete for BSTs.

ST implementations: summary

W.C.S (تكون على جهة وحدة)

b.c.s (مرتبه)

$O(n)$

$\star O(\log_2 n)$

implementation	guarantee			average case			ordered ops?	operations on keys
	search	insert	delete	search hit	insert	delete		
sequential search (linked list)	N	N	N	$\frac{1}{2} N$	N	$\frac{1}{2} N$		equals()
binary search (ordered array)	$\lg N$	N	N	$\lg N$	$\frac{1}{2} N$	$\frac{1}{2} N$	✓	compareTo()
BST	N	N	N	$1.39 \lg N$	$1.39 \lg N$	\sqrt{N}	✓	compareTo()

\star search best case : $\log n$

(Preorder, inorder, Postorder) Travers : n

other operations also become \sqrt{N} if deletions allowed

Next lecture. **Guarantee** logarithmic performance for all operations.

Method	Running Time
size, isEmpty	$O(1)$
root, parent, left, right, sibling, children, numChildren	$O(1)$
isInternal, isExternal, isRoot	$O(1)$
addRoot, addLeft, addRight, set, attach, remove	$O(1)$
depth(p)	$O(d_p + 1)$
height	$O(n)$

Table 8.1: Running times for the methods of an n -node binary tree implemented with a linked structure. The space usage is $O(n)$.