## Sorting lists — work and span revisited

15-150

Lecture 8: September 18, 2025

Stephanie Balzer Carnegie Mellon University

#### When and where:

- Thursday, September 25, 11:00am—12:20pm.
- PH 100 (Section A-I), MM Breed Hall (Section J-L).

Be on time; next lecture starts at 12:30pm!

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#### Scope:

- Lectures: 1-8.
- Labs: 1−4 and midterm review section of Lab 5.
- Assignments: Basics, Induction, and Datatypes.

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- Labs: 1−4 and midterm review section of Lab 5.
- Assignments: Basics, Induction, and Datatypes.

#### What you may have on your desk:

- Writing utensils, something to drink/eat, tissues.
- 8.5" x 11" cheatsheet (back and front), handwritten or typeset.
- No cell phones, laptops, or any other smart devices.

Let's get started with sorting: insertion sort

#### Useful datatype:

datatype order = LESS | EQUAL | GREATER

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#### Eg:

```
Int.compare : int * int -> order
String.compare : string * string -> order
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$$[..., \times, ..., y, ...]$$

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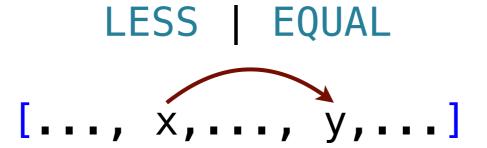
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   REQUIRES: L is sorted
   ENSURES: ins(x, L) evaluates to sorted permutation of x::L
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W_{ins}(n) = c_2, for second case clause
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Work:  $W_{ins}(n)$  with n the list length.

#### Equations:

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W_{ins}(0) = c_0

W_{ins}(n) = c_1 + W_{ins}(n-1), for first case clause

W_{ins}(n) = c_2, for second case clause
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#### Consequently:

Work:  $W_{ins}(n)$  with n the list length.

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W_{ins}(n) = c_1 + W_{ins}(n-1), for first case clause

W_{ins}(n) = c_2, for second case clause

Consequently: W_{ins}(n) is O(n).
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Work:  $W_{ins}(n)$  with n the list length.

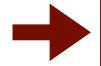
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Note: no opportunity for parallelism.

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fun isort ([]: int list): int list = []
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Work: W<sub>isort</sub>(n) with n the list length.
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Work:  $W_{isort}(n)$  with n the list length.

#### Equations:

$$\begin{aligned} &W_{isort}(0) = c_0 \\ &W_{isort}(n) = c_1 + W_{isort}(n-1) + W_{ins}(n-1) \end{aligned}$$

b/c spec asserts permutation

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So: W<sub>isort</sub>(n) \le C<sub>1</sub> + C<sub>2</sub> \cdot n + W<sub>isort</sub>(n-1)
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fun isort ([]: int list): int list = [] | isort (x::L) = ins (x, isort L) | Work: W_{isort}(n) with n the list length. Equations: W_{isort}(0) = C_0W_{isort}(n) = C_1 + W_{isort}(n-1) + W_{ins}(n-1)So: W_{isort}(n) \le C_1 + C_2 \cdot n + W_{isort}(n-1)
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#### Consequently:

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So: W_{isort}(n) \leq C_1 + C_2 \cdot n + W_{isort}(n-1)
Consequently: W_{isort}(n) is O(n^2).
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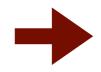
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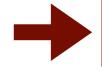
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Can we do better?

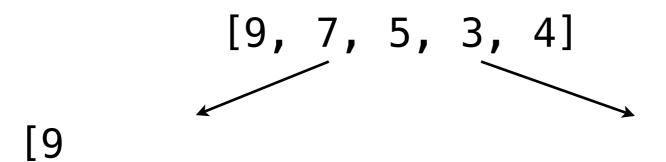
Divide and conquer: mergesort

Suppose, I want to **sort** the list

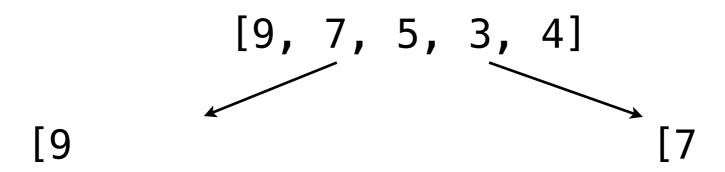
Suppose, I want to **sort** the list

[9, 7, 5, 3, 4]

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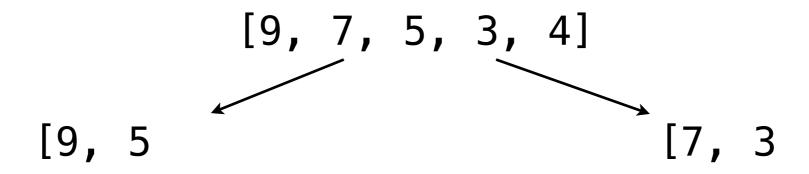


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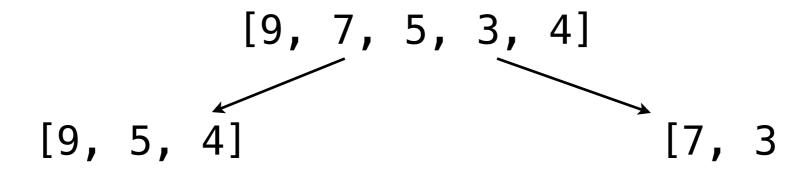


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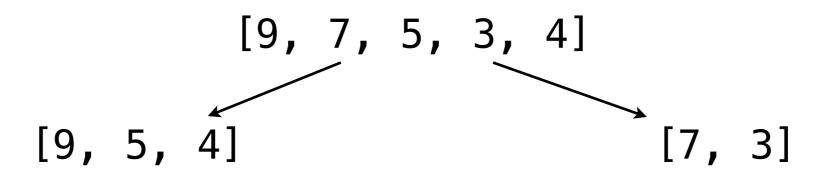
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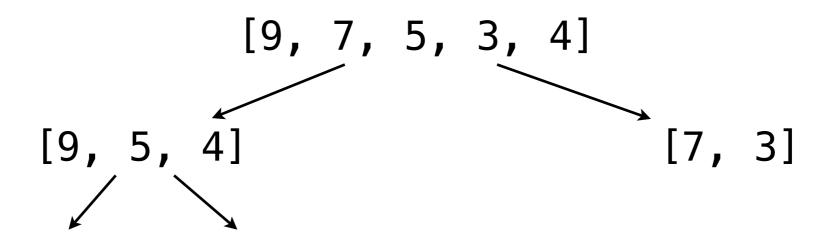
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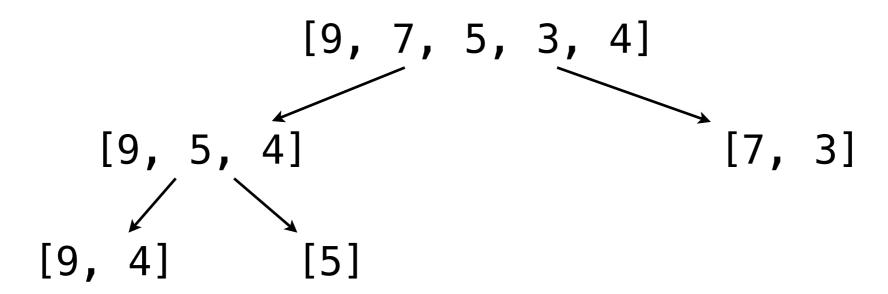
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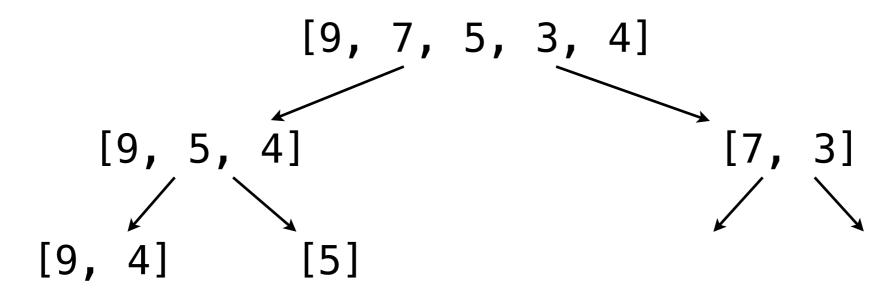
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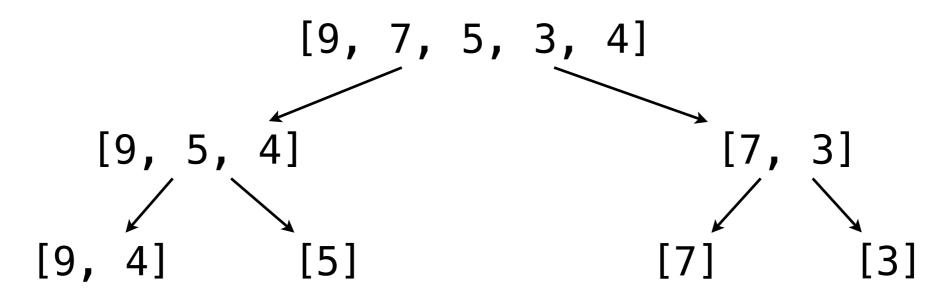
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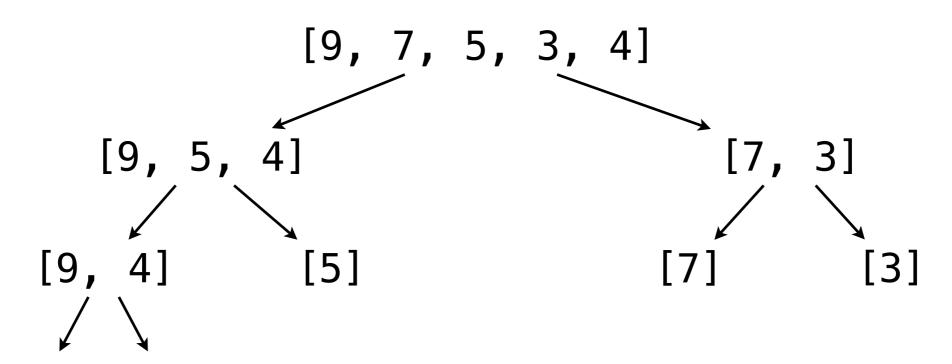
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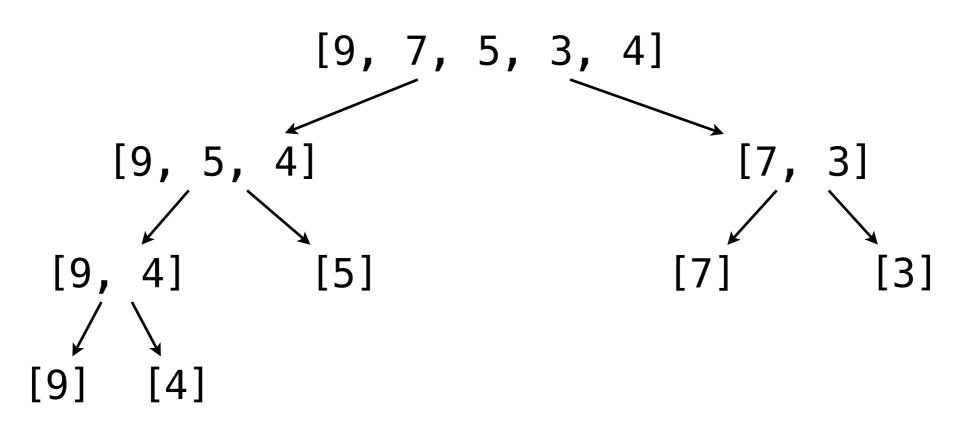
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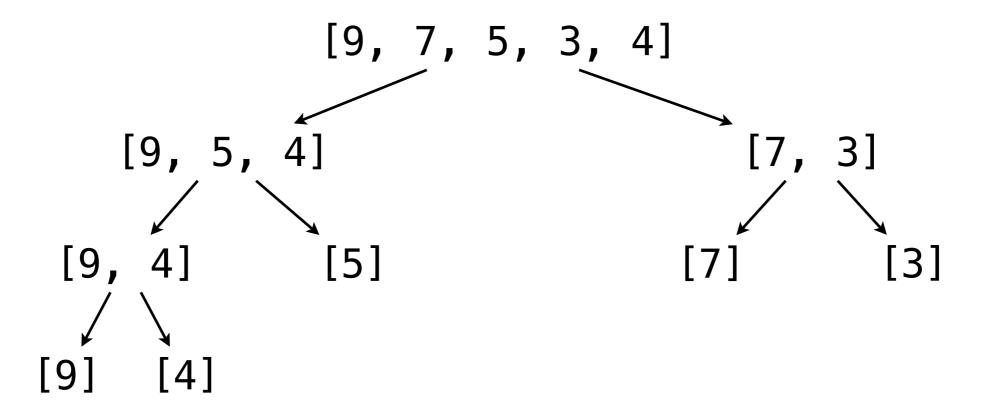


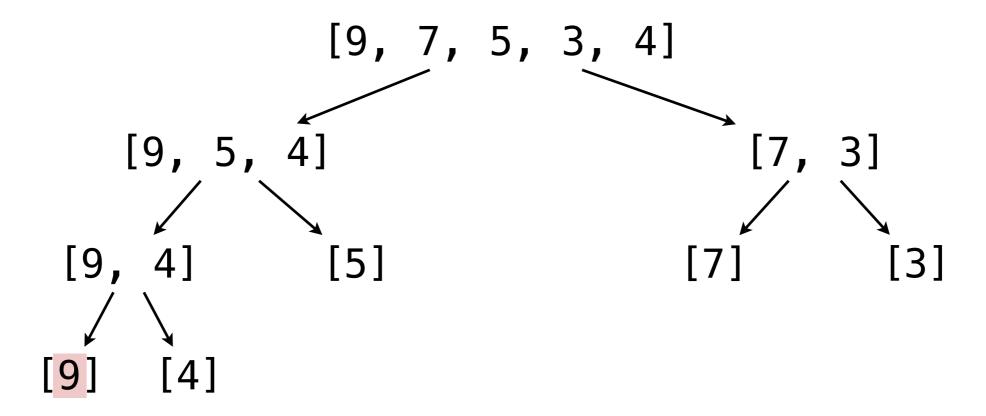
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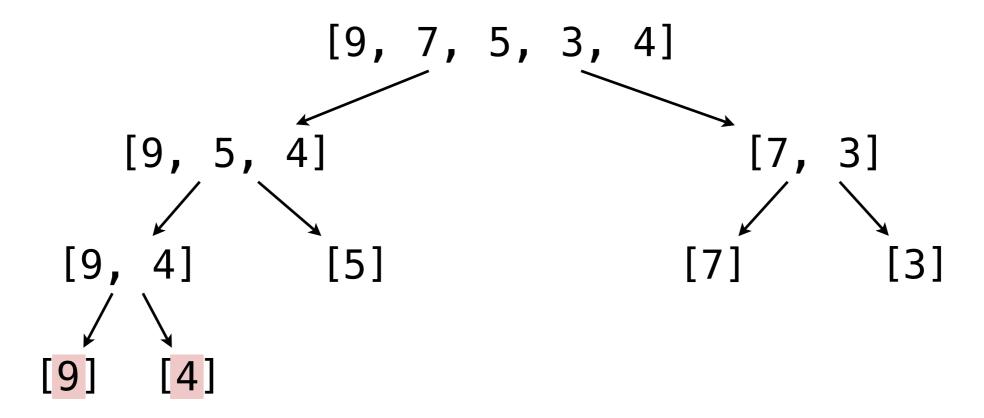


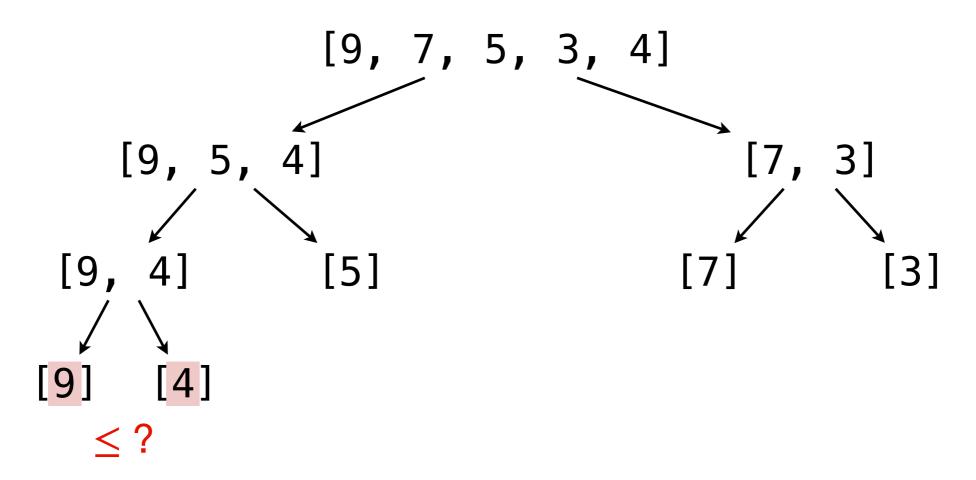
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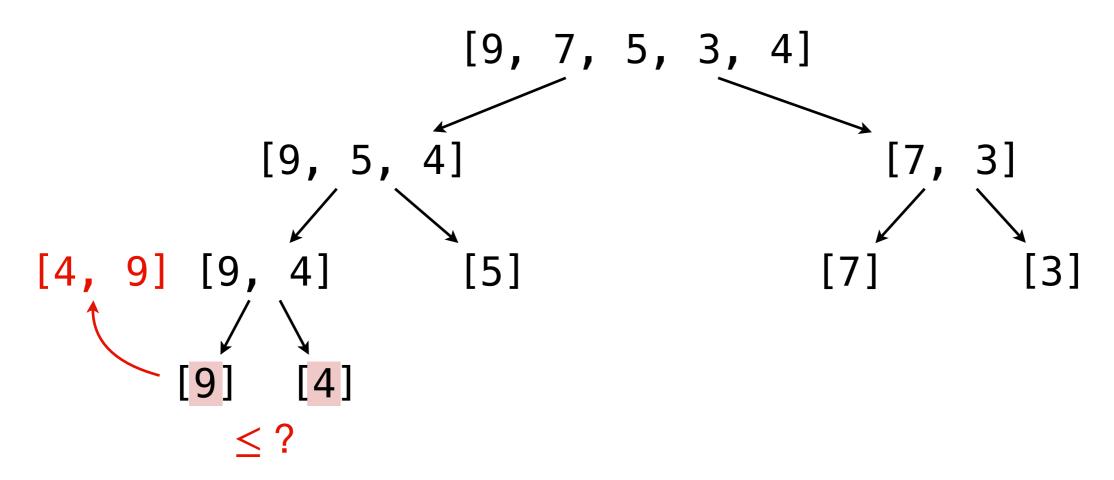


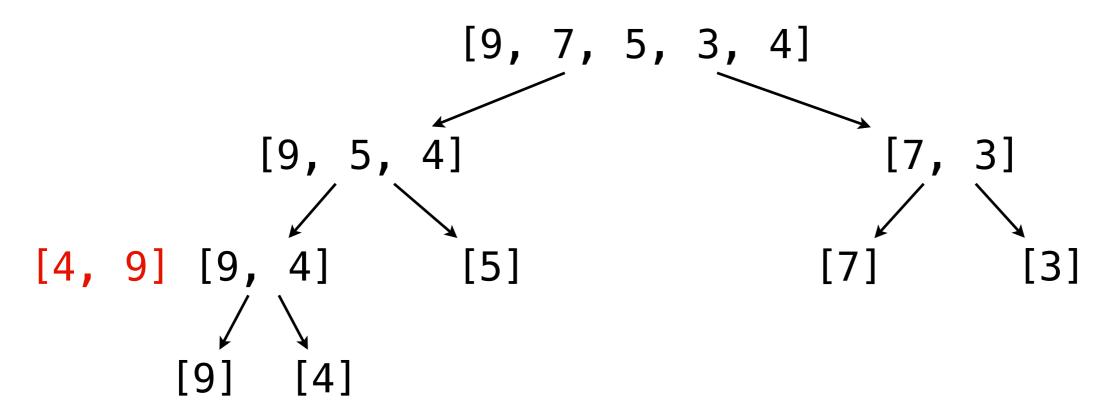


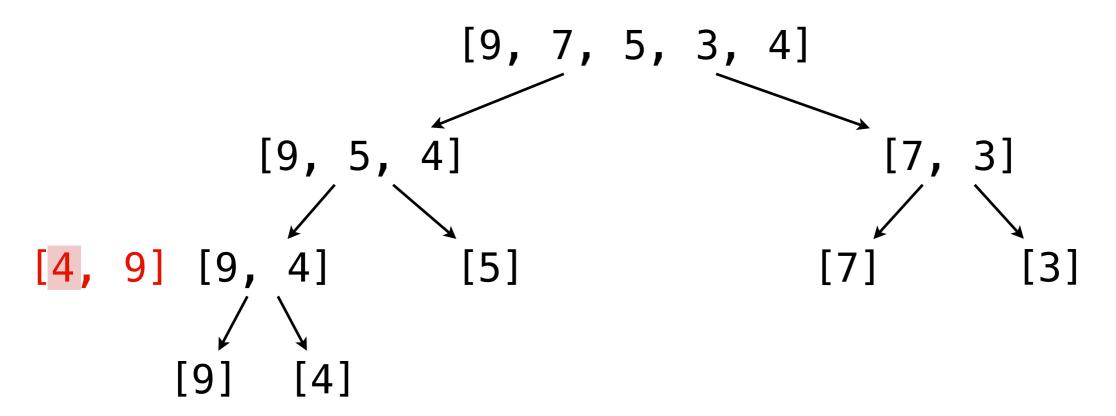


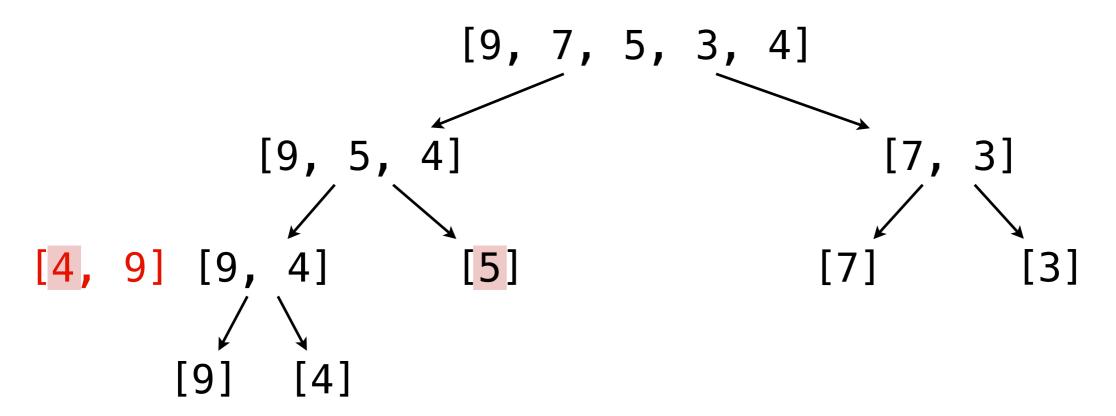


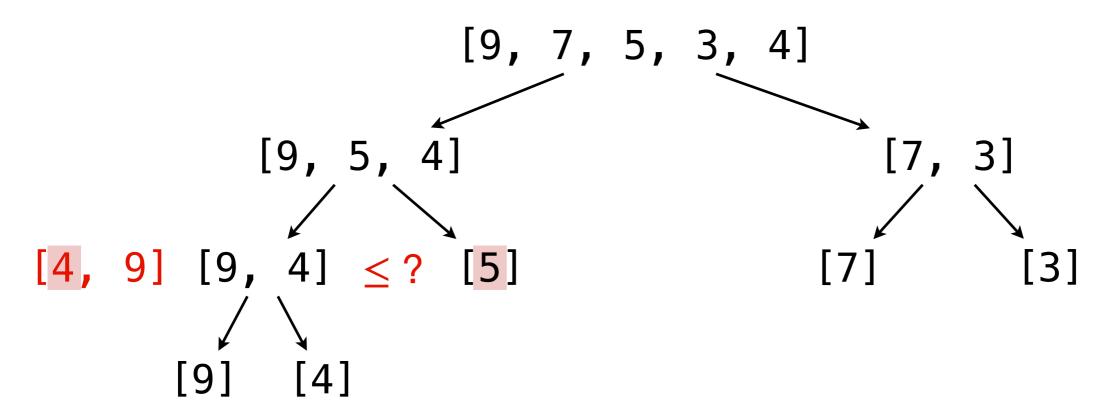


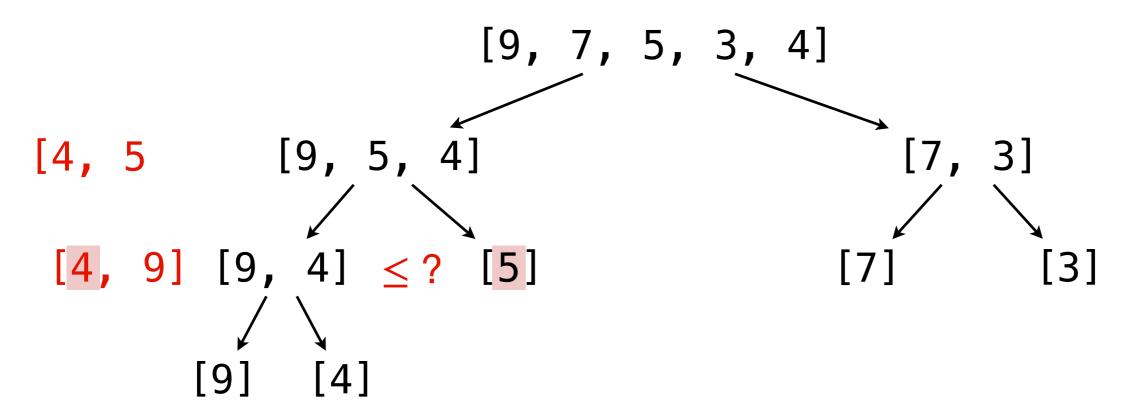


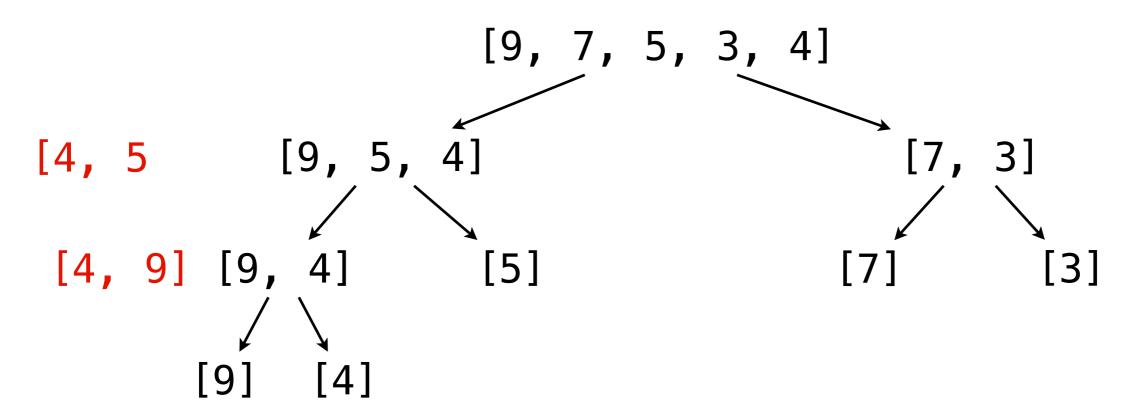


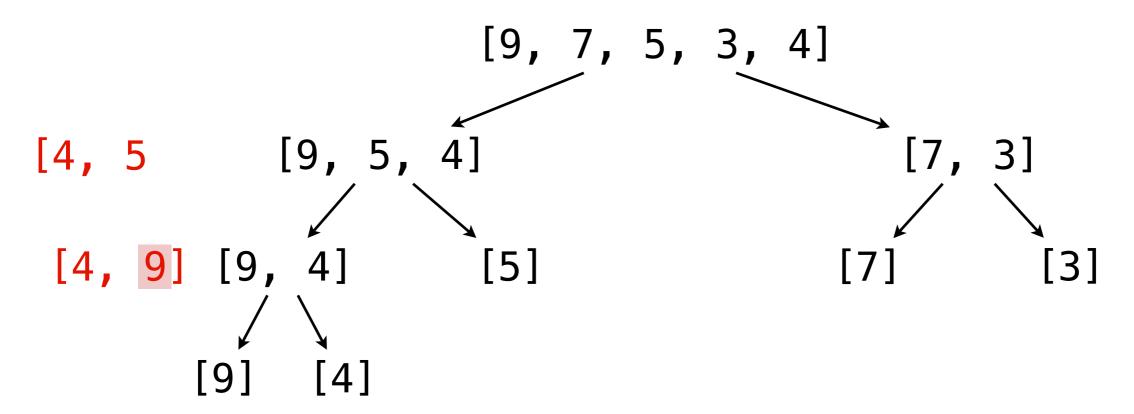


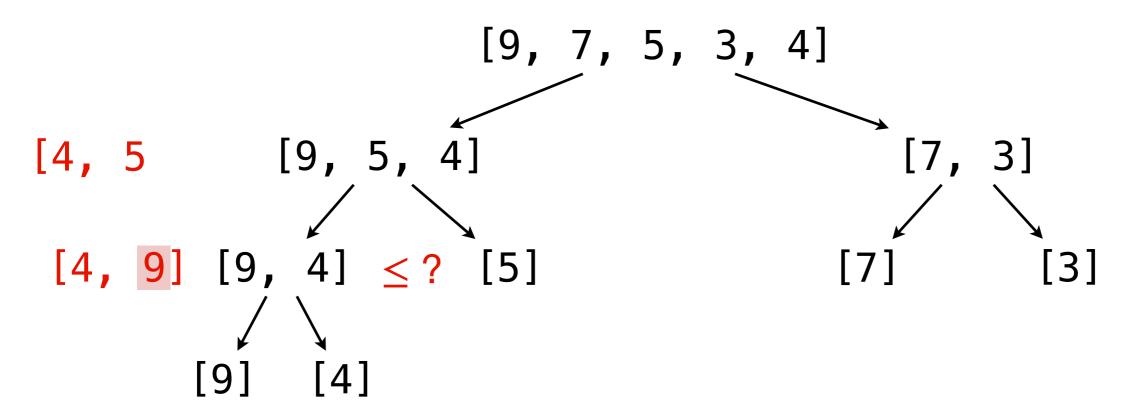


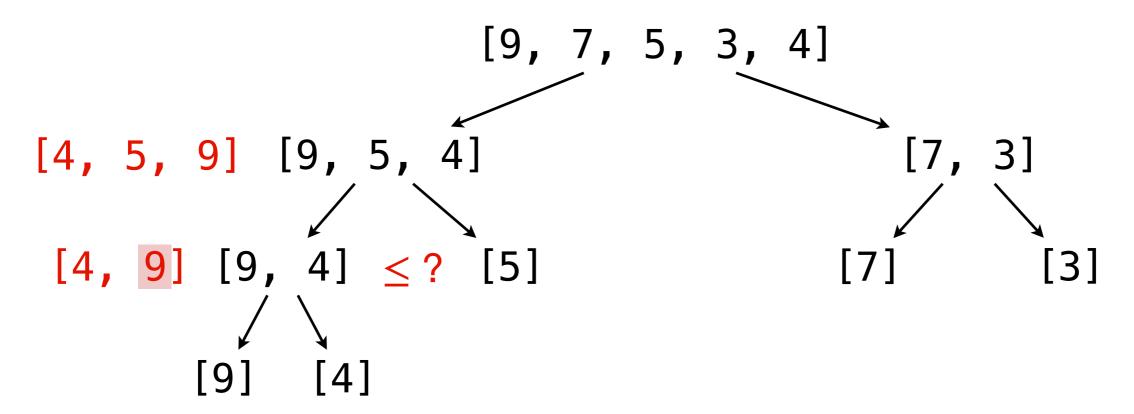


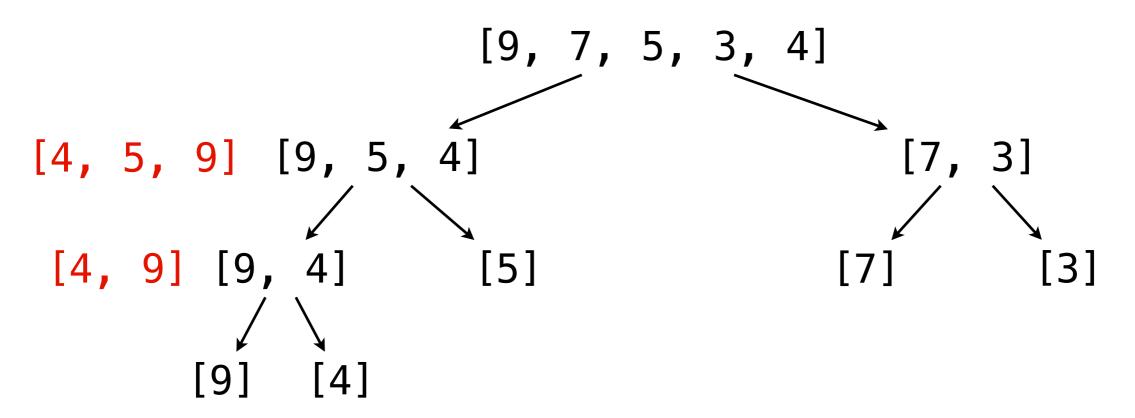


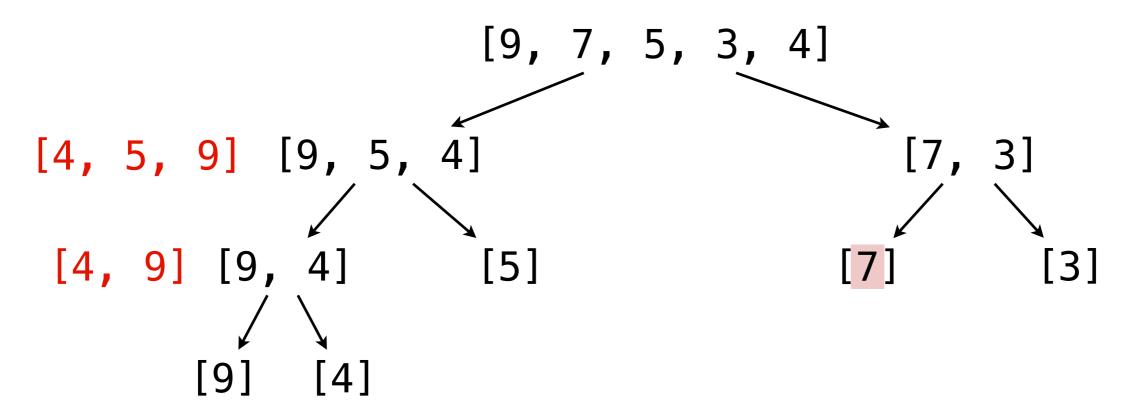


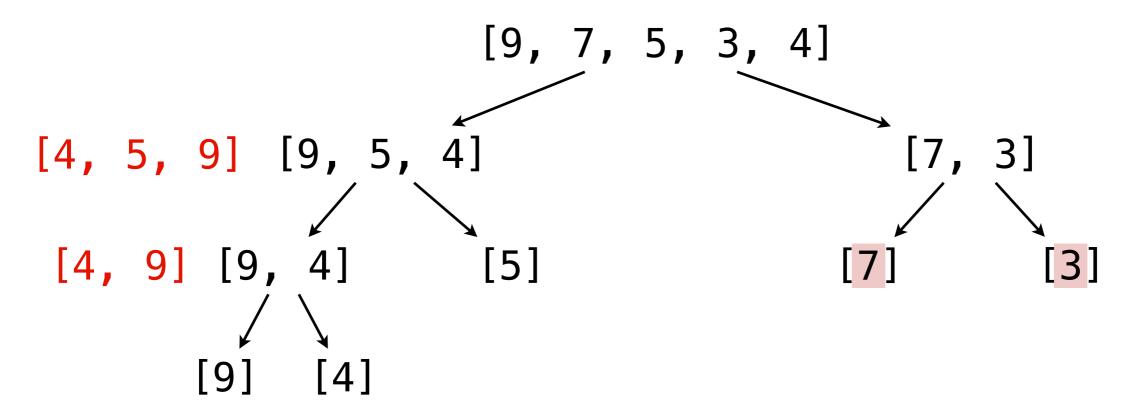


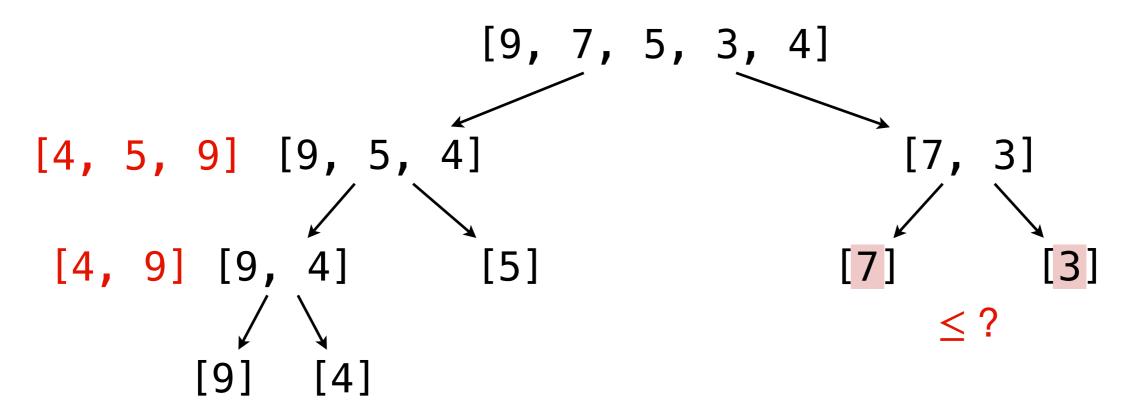


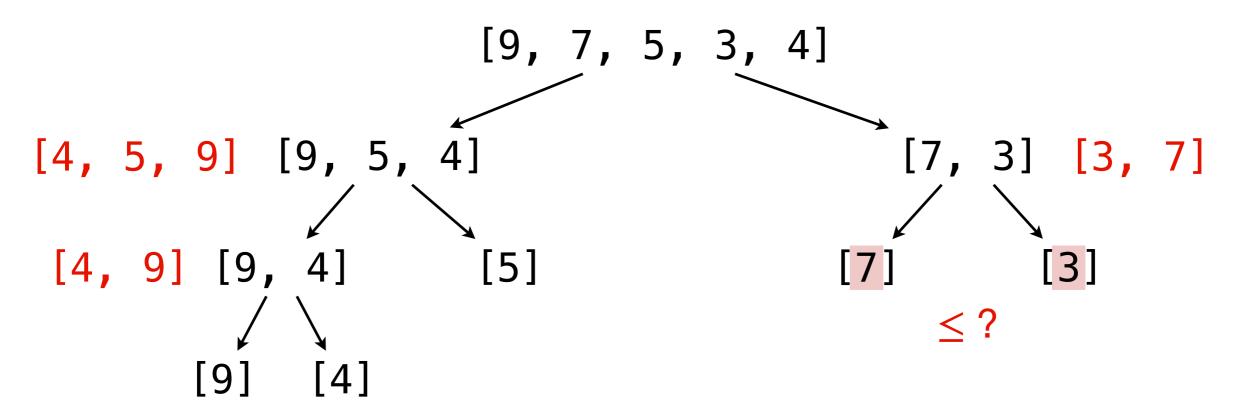


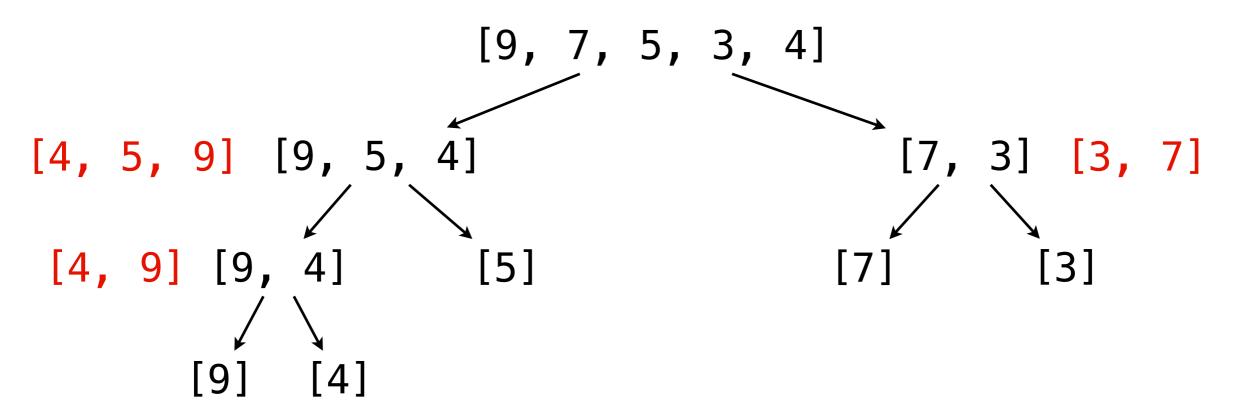


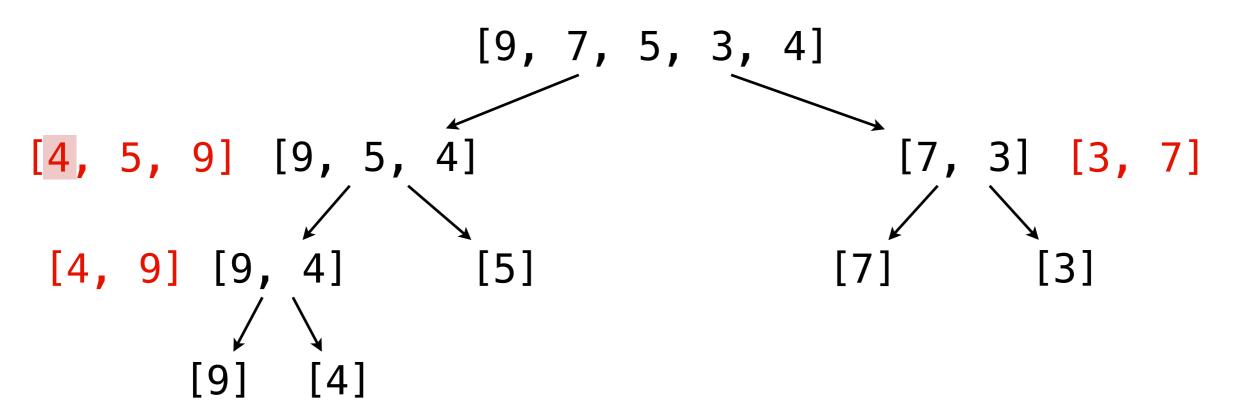


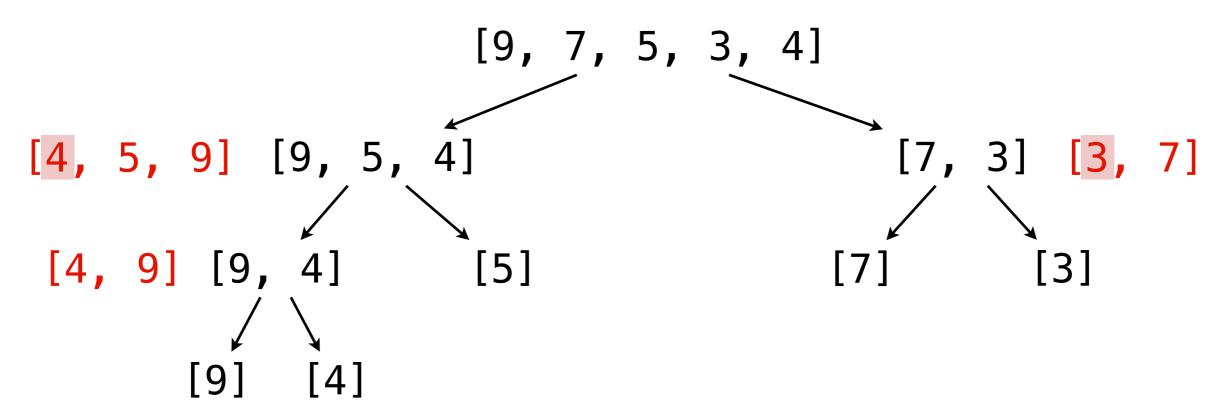


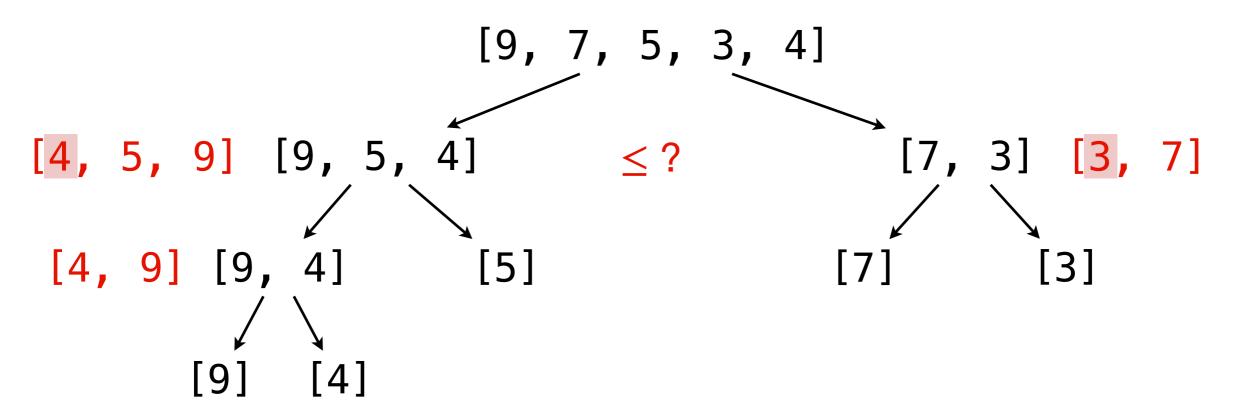


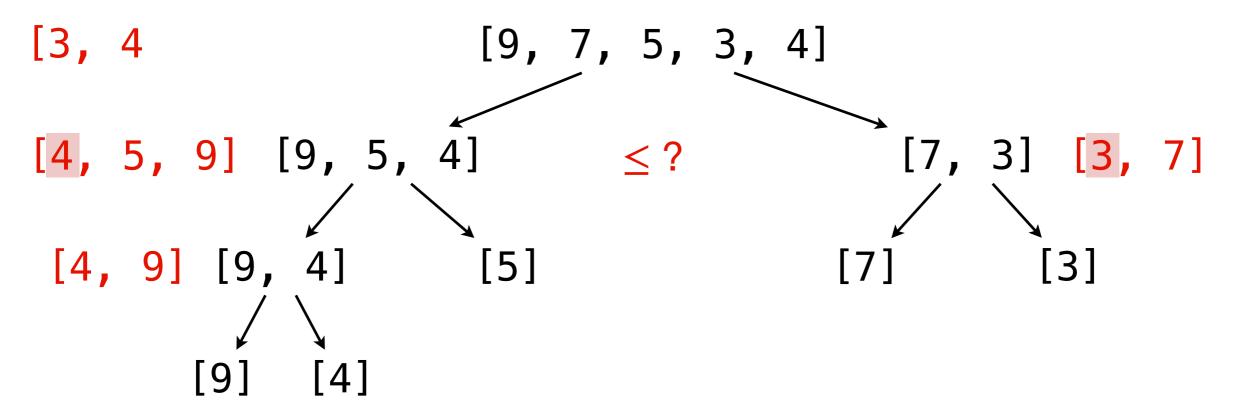


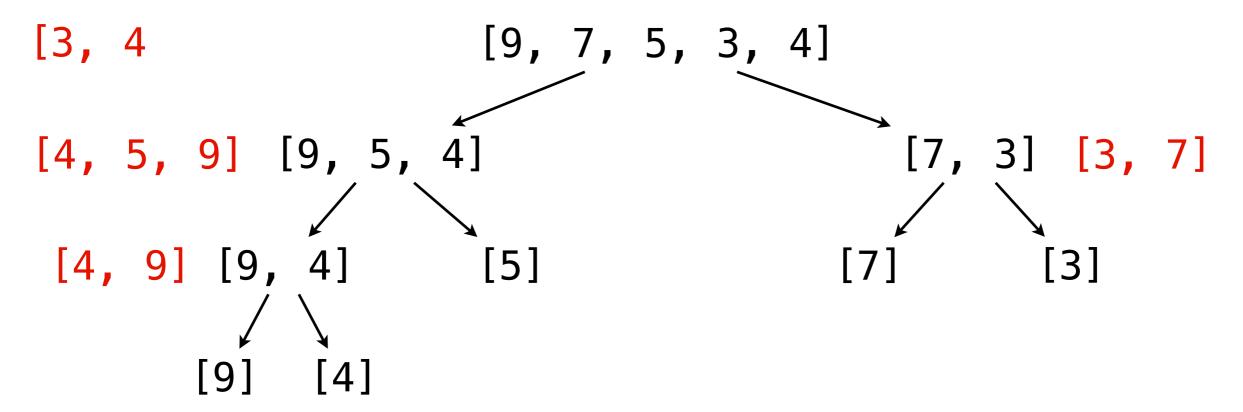


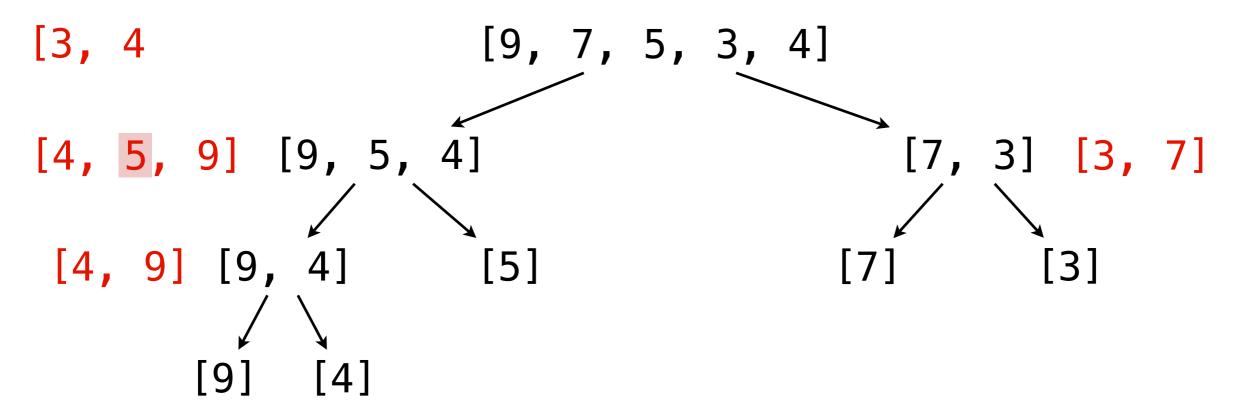


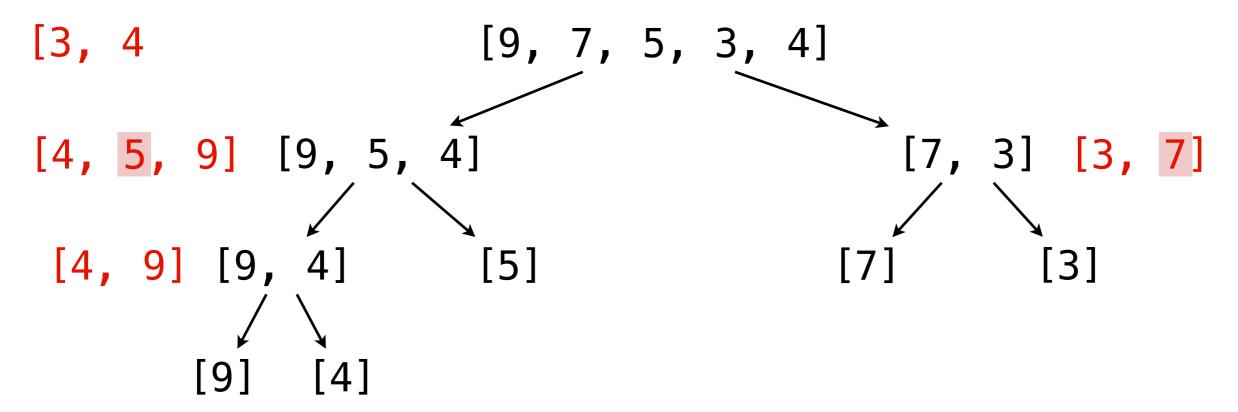


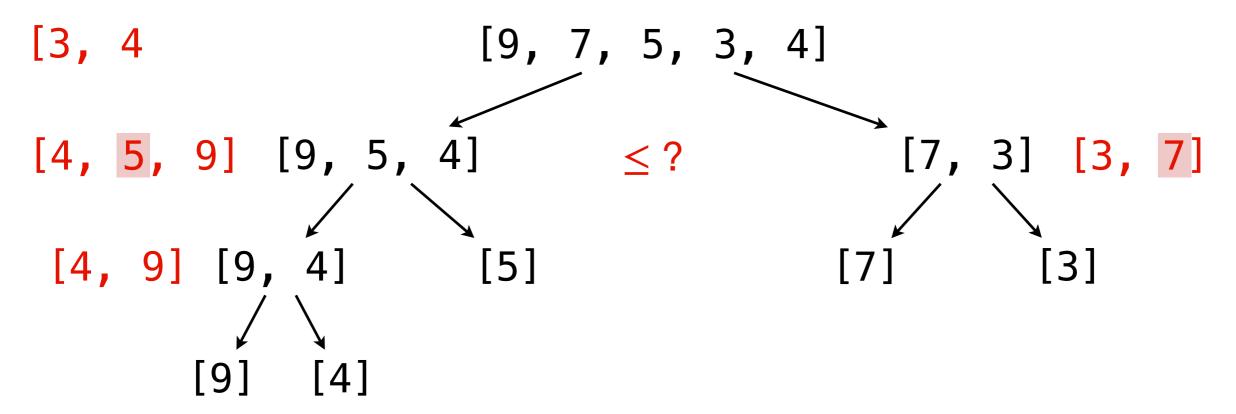


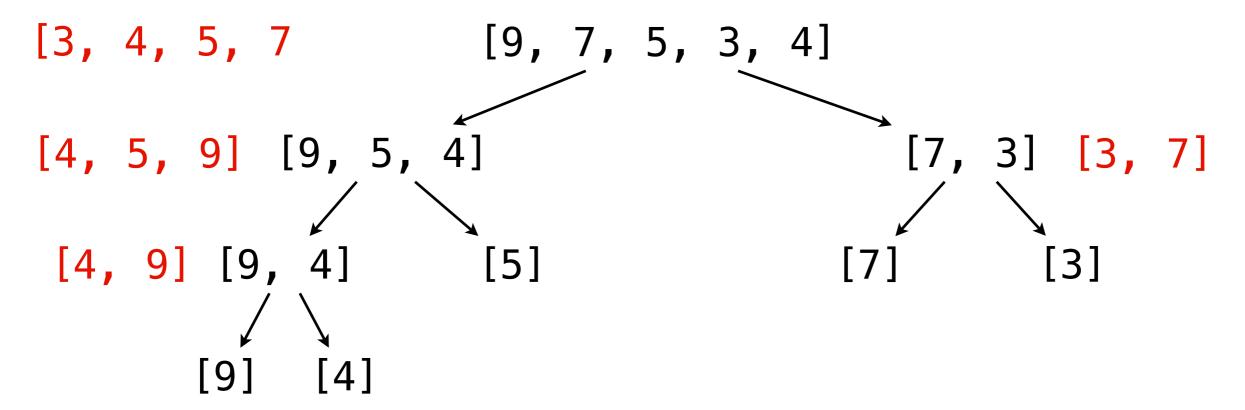


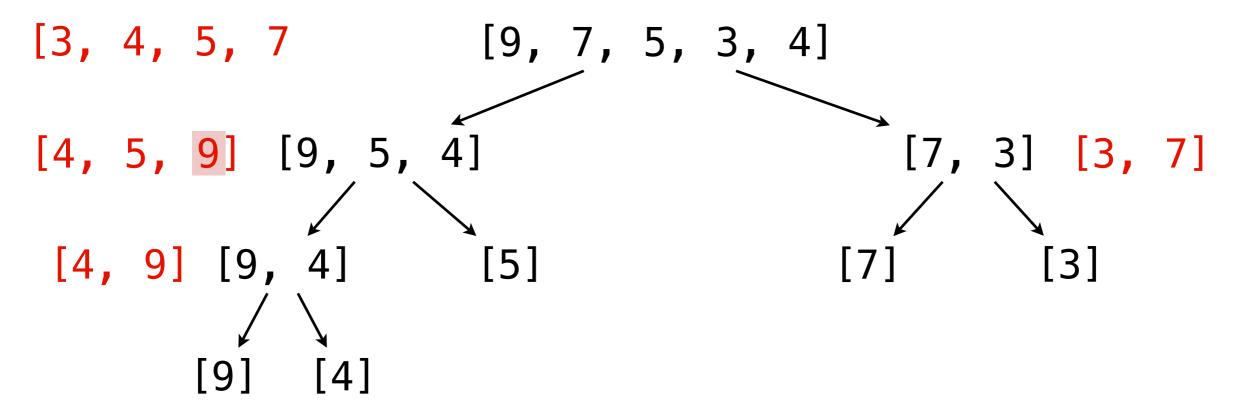


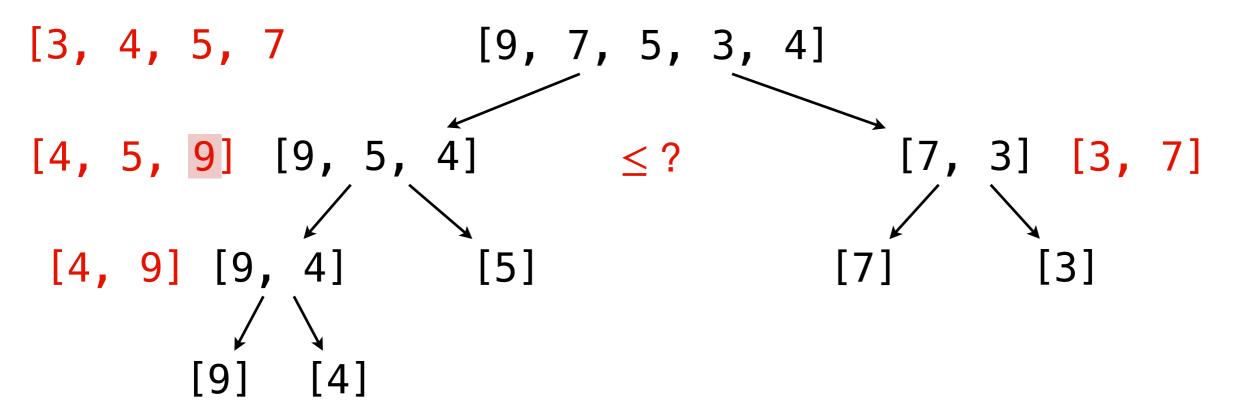


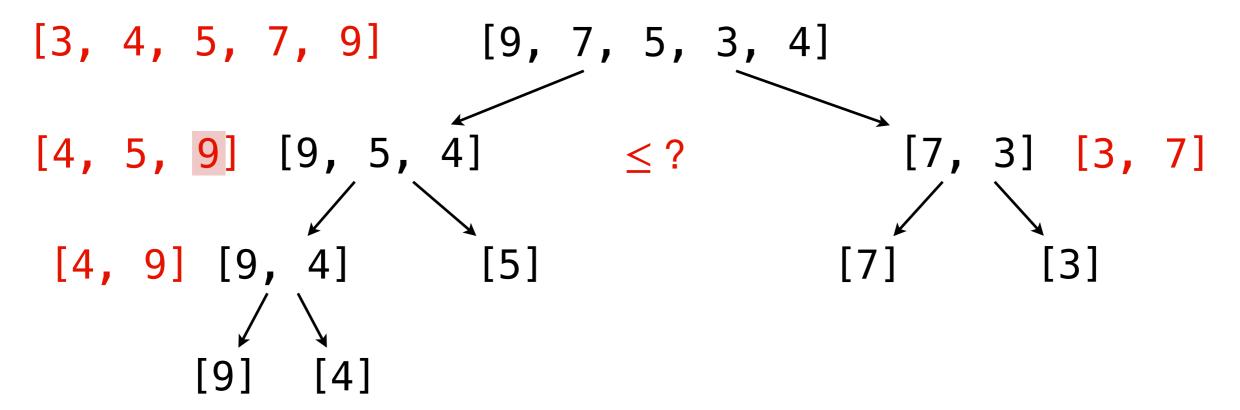




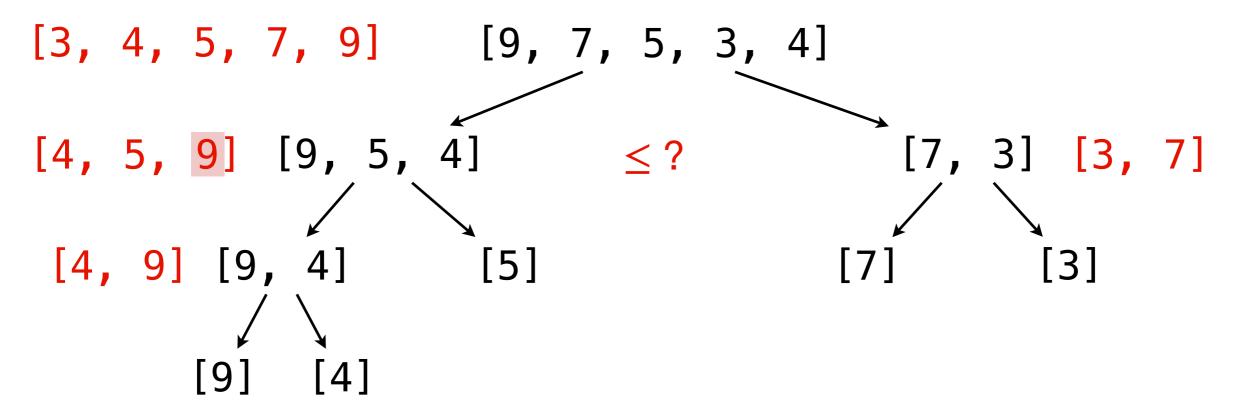






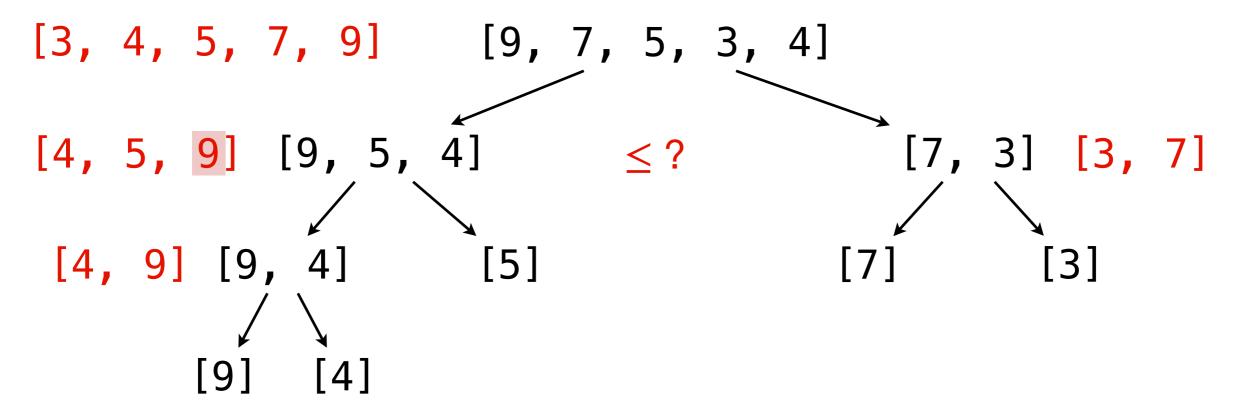


Now, let's **merge**:





Note, we use a list here.



- **→**
- Note, we use a list here.
- But there is almost a tree emerging...

```
(* msort : int list -> int list
   REQUIRES: true
   ENSURES: msort(L) evaluates to a sorted
             permutation of L.
*)
fun msort ([] : int list) : int list = []
   msort[x] = [x]
    msort L =
      let
         val
      in
      end
```

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    msort L =
      let
         val(A, B) = split L
      in
      end
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   REQUIRES: true
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   msort[x] = [x]
    msort L =
      let
         val(A, B) = split L
      in
         merge(msort A, msort B)
      end
```

```
(* split : int list -> int list * int list
   REQUIRES: true
   ENSURES: split(L) evaluates to a pair of lists (A, B)
             such that length(A) and length(B) differ by
             at most 1, and A@B is a permutation of L.
*)
fun split ([] : int list) : int list * int list = ([], [])
   split [x] = ([x], [])
   split (x::y::L) =
       let
          val
       in
       end
```

```
(* split : int list -> int list * int list
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       in
          (x::A, y::B)
       end
```

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            split(L) evaluates to a pair of lists (A, B)
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   split (x::y::L) =
       let
                                              Have we
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                                          established post-
       in
                                             condition?
          (x::A, y::B)
       end
```

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       in
                                             condition?
          (x::A, y::B)
       end
```

Prove in your head as you write code!

```
fun split ([] : int list) : int list * int list = ([], [])
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    | split (x::y::L) =
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            (x::A, y::B)
        end
```

Work:  $W_{split}(n)$  with n the list length.

Equations:

 $W_{split}(0) =$ 

```
fun split ([] : int list) : int list * int list = ([], [])
    split [x] = ([x], [])
    split (x::y::L) =
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       in
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Work: W_{split}(n) with n the list length.
Equations:
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       end
```

Work:  $W_{split}(n)$  with n the list length.

#### Equations:

$$W_{split}(0) = c_0$$

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fun split ([] : int list) : int list * int list = ([], [])
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Work:  $W_{split}(n)$  with n the list length.

$$W_{split}(0) = C_0$$
  
 $W_{split}(1) =$ 

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W_{split}(0) = C_0

W_{split}(1) = C_1

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```

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```

Work:  $W_{split}(n)$  with n the list length.

```
\begin{split} &W_{\text{split}}(0) = c_0 \\ &W_{\text{split}}(1) = c_1 \\ &W_{\text{split}}(n) = c_2 + W_{\text{split}}(n-2), \text{ for } n \geq 2 \end{split}
```

```
fun split ([] : int list) : int list * int list = ([], [])
  | split [x] = ([x], [])
  | split (x::y::L) =
        let
            val (A, B) = split L
        in
            (x::A, y::B)
        end
```

Work:  $W_{split}(n)$  with n the list length.

```
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```

```
(* merge : int list * int list -> int list
   REQUIRES: A and B are sorted lists.
   ENSURES: merge(A,B) evaluates to a sorted
        permutation of A@B.
*)

fun merge ([] : int list, B : int list) : int list = B
        | merge (A, []) =
```

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        permutation of A@B.
*)

fun merge ([] : int list, B : int list) : int list = B
   | merge (A, []) = A
   | merge (x::A, y::B) =
```

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   merge (x::A, y::B) = (case compare(x,y) of
                              LESS => x :: merge(A, y::B)
                            | EQUAL => x::y::merge(A, B)
                              GREATER =>
```

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                              LESS => x :: merge(A, y::B)
                            | EQUAL => x::y::merge(A, B)
                            | GREATER => y :: merge(x::A, B))
```

Work:  $W_{merge}(n,m)$  for merge(A,B) with n, m the length of A, B, resp.

#### Equations:

 $W_{\text{merge}}(0, m) = c_0$ , for all  $m \ge 0$ 

Work:  $W_{merge}(n,m)$  for merge(A,B) with n, m the length of A, B, resp.

```
W_{\text{merge}}(0,m) = c_0, for all m \ge 0

W_{\text{merge}}(n,0) =
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Work:  $W_{merge}(n,m)$  for merge(A,B) with n, m the length of A, B, resp.

```
\begin{aligned} &W_{merge}(0,m)=c_0, \text{ for all } m\geq 0\\ &W_{merge}(n,0)=c_1, \text{ for all } n\geq 0\\ &W_{merge}(n,m)=k_1+W_{merge}(n-1,m), \text{ for } n,\, m>0 \text{ and case LESS} \end{aligned}
```

Work:  $W_{merge}(n,m)$  for merge(A,B) with n, m the length of A, B, resp.

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\begin{split} &W_{merge}(0,m)=c_0, \text{ for all } m \geq 0\\ &W_{merge}(n,0)=c_1, \text{ for all } n \geq 0\\ &W_{merge}(n,m)=k_1+W_{merge}(n-1,m), \text{ for } n, \, m>0 \text{ and case LESS}\\ &W_{merge}(n,m)=\end{split}
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```

Work:  $W_{merge}(n,m)$  for merge(A,B) with n, m the length of A, B, resp.

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```

Work:  $W_{merge}(n,m)$  for merge(A,B) with n, m the length of A, B, resp.

```
\begin{aligned} &W_{merge}(0,m)=c_0, \text{ for all } m \geq 0\\ &W_{merge}(n,0)=c_1, \text{ for all } n \geq 0\\ &W_{merge}(n,m)=k_1+W_{merge}(n-1,m), \text{ for } n, m>0 \text{ and case LESS}\\ &W_{merge}(n,m)=k_2+W_{merge}(n-1,m-1), \text{ for } n, m>0 \text{ and case EQUAL}\\ &W_{merge}(n,m)=k_3+W_{merge}(n,m-1), \text{ for } n, m>0 \text{ and case GREATER} \end{aligned}
```

### Work for merge

Work:  $W_{merge}(n,m)$  for merge(A,B) with n, m the length of A, B, resp.

#### Equations:

```
\begin{split} &W_{merge}(\textbf{0},\textbf{m})=c_0, \text{ for all } m\geq 0\\ &W_{merge}(\textbf{n},\textbf{0})=c_1, \text{ for all } n\geq 0\\ &W_{merge}(\textbf{n},\textbf{m})=k_1+W_{merge}(\textbf{n}-\textbf{1},\textbf{m}), \text{ for } n, \, m>0 \text{ and case LESS}\\ &W_{merge}(\textbf{n},\textbf{m})=k_2+W_{merge}(\textbf{n}-\textbf{1},\textbf{m}-\textbf{1}), \text{ for } n, \, m>0 \text{ and case EQUAL}\\ &W_{merge}(\textbf{n},\textbf{m})=k_3+W_{merge}(\textbf{n},\textbf{m}-\textbf{1}), \text{ for } n, \, m>0 \text{ and case GREATER} \end{split}
```

Consequently:  $W_{merge}(n,m)$  is O(n+m).

#### Work for merge

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Consequently:  $W_{merge}(n,m)$  is O(n+m).



Note: again, no opportunity for parallelism.

```
fun msort ([] : int list) : int list = []
  | msort [x] = [x]
  | msort L =
        let
        val (A, B) = split L
        in
        merge(msort A, msort B)
        end
```

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fun msort ([] : int list) : int list = []
    msort [x] = [x]
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      let
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Work: W_{msort}(n) with n the list length.
Equations:
W_{msort}(0) =
```

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fun msort ([] : int list) : int list = []
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          merge(msort A, msort B)
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Work: W_{msort}(n) with n the list length.
Equations:
W_{msort}(0) = C_0
```

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Work: W_{msort}(n) with n the list length.
Equations:
W_{msort}(0) = C_0
W_{msort}(1) =
```

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Work: W_{msort}(n) with n the list length.
Equations:
W_{msort}(0) = C_0
W_{msort}(1) = C_1
W_{msort}(n) = c_2 + W_{split}(n) +
```

 $n \geq 2$ 

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Work: W_{msort}(n) with n the list length.
Equations:
W_{msort}(0) = C_0
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W_{msort}(n) = C_2 + W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b)
                                                      n \geq 2
```

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fun msort ([] : int list) : int list = []
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Work: W_{msort}(n) with n the list length.
Equations:
W_{msort}(0) = C_0
W_{msort}(1) = C_1
W_{msort}(n) = c_2 + W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b)
                + W_{merge}(n_a, n_b), for n = n_a + n_b and n \ge 2
```

Work:  $W_{msort}(n)$  with n the list length.

```
\begin{split} W_{msort}(0) &= c_0 \\ W_{msort}(1) &= c_1 \\ W_{msort}(n) &= c_2 + W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b) \\ &+ W_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n \geq 2 \end{split}
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Work:  $W_{msort}(n)$  with n the list length.

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\begin{split} W_{msort}(0) &= c_0 \\ W_{msort}(1) &= c_1 \\ W_{msort}(n) &= c_2 + W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b) \\ &+ W_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n \geq 2 \end{split}
```

Work:  $W_{msort}(n)$  with n the list length.

```
\begin{split} W_{msort}(0) &= c_0 \\ W_{msort}(1) &= c_1 \\ W_{msort}(n) &= c_2 + \frac{W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b)}{+ W_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n \geq 2 \end{split}
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\begin{split} W_{msort}(0) &= c_0 \\ W_{msort}(1) &= c_1 \\ W_{msort}(n) &= c_2 + \frac{W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b) \\ &+ W_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n \geq 2 \end{split}
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Work:  $W_{msort}(n)$  with n the list length.

```
\begin{split} W_{msort}(0) &= c_0 \\ W_{msort}(1) &= c_1 \\ W_{msort}(n) &= c_2 + \frac{W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b)}{+ W_{merge}(n_a, n_b)}, \text{ for } n = n_a + n_b \text{ and } n \geq 2 \end{split}
```

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Work:  $W_{msort}(n)$  with n the list length.

Equations: 
$$W_{msort}(0) = c_0 \qquad \qquad = \lfloor n/2 \rfloor \qquad = \lceil n/2 \rceil$$

$$W_{msort}(1) = c_1 \qquad \qquad = \lfloor n/2 \rfloor \qquad = \lceil n/2 \rceil$$

$$W_{msort}(n) = c_2 + W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b) + W_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n \geq 2$$

$$c_1 + c'_1 = c_2 + c'_1 = c_3 + c_3 + c_4 + c'_1 = c_3 + c_4 + c'_1 = c_3 + c_4 + c'_1 = c_4$$

Work:  $W_{msort}(n)$  with n the list length.

#### Equations:

 $W_{msort}(n) < c_2 + c_3 n + 2 W_{msort}(n/2)$ 

Work:  $W_{msort}(n)$  with n the list length.

Equations: 
$$W_{msort}(0) = c_0$$
 
$$= \lfloor n/2 \rfloor$$
 
$$= \lceil n/2 \rceil$$
 
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$$W_{msort}(n) = c_2 + \frac{W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b)}{+ W_{merge}(n_a, n_b)}, \text{ for } n = n_a + n_b \text{ and } n \geq 2$$
 
$$c \ n + c' \ n = (c + c') \ n = c_3 \ n$$

$$W_{msort}(n) \le c_2 + c_3 n + 2 W_{msort}(n/2)$$
  
 $W_{msort}(n) \le c_4 n + 2 W_{msort}(n/2)$ 

Work:  $W_{msort}(n)$  with n the list length.

#### Equations:

$$\begin{aligned} &\mathsf{W}_{\mathsf{msort}}(0) = \mathsf{C}_0 \\ &\mathsf{W}_{\mathsf{msort}}(1) = \mathsf{C}_1 \\ &\mathsf{W}_{\mathsf{msort}}(\mathsf{n}) = \mathsf{C}_2 + \mathsf{W}_{\mathsf{split}}(\mathsf{n}) + \mathsf{W}_{\mathsf{msort}}(\mathsf{n}_{\mathsf{a}}) + \mathsf{W}_{\mathsf{msort}}(\mathsf{n}_{\mathsf{b}}) \\ &+ \mathsf{W}_{\mathsf{merge}}(\mathsf{n}_{\mathsf{a}},\mathsf{n}_{\mathsf{b}}), \text{ for } \mathsf{n} = \mathsf{n}_{\mathsf{a}} + \mathsf{n}_{\mathsf{b}} \text{ and } \mathsf{n} \geq 2 \end{aligned}$$

$$W_{msort}(n) \le c_2 + c_3 n + 2 W_{msort}(n/2)$$
  
 $W_{msort}(n) \le c_4 n + 2 W_{msort}(n/2)$ 



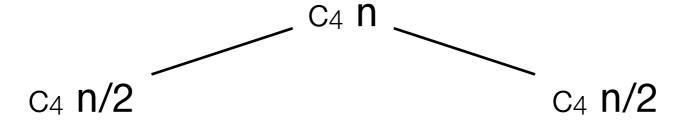
Let's look at the tree method to find a closed form.

$$W_{msort}(n) \leq c_4 n + 2 W_{msort}(n/2)$$

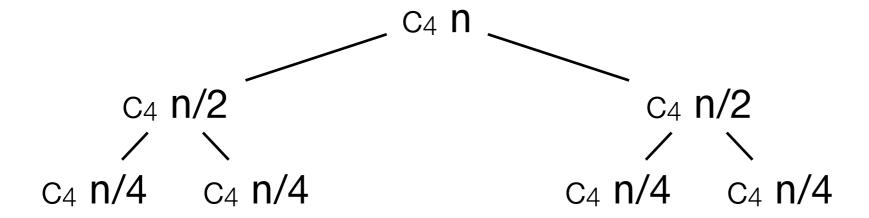
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C<sub>4</sub> n

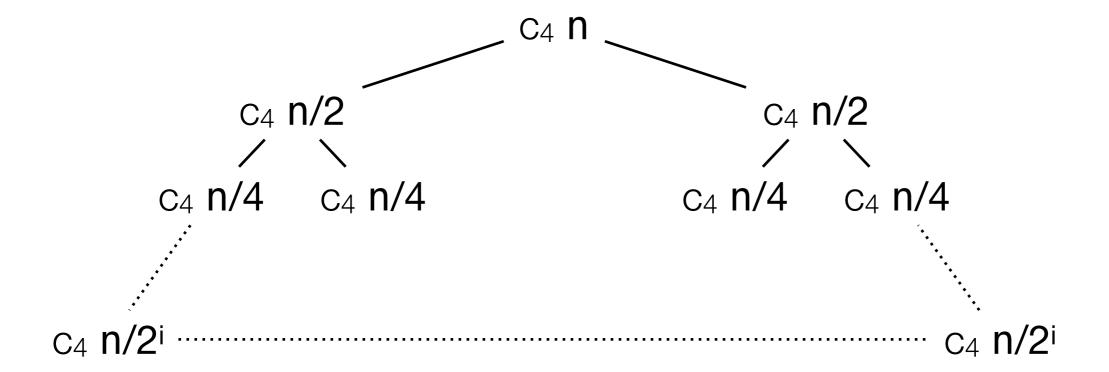
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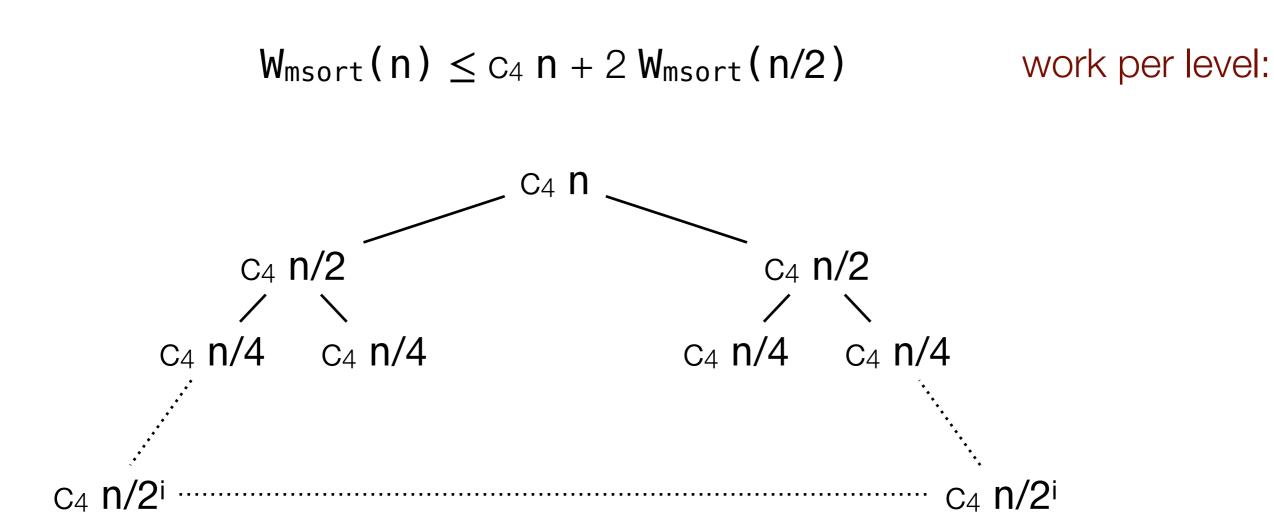


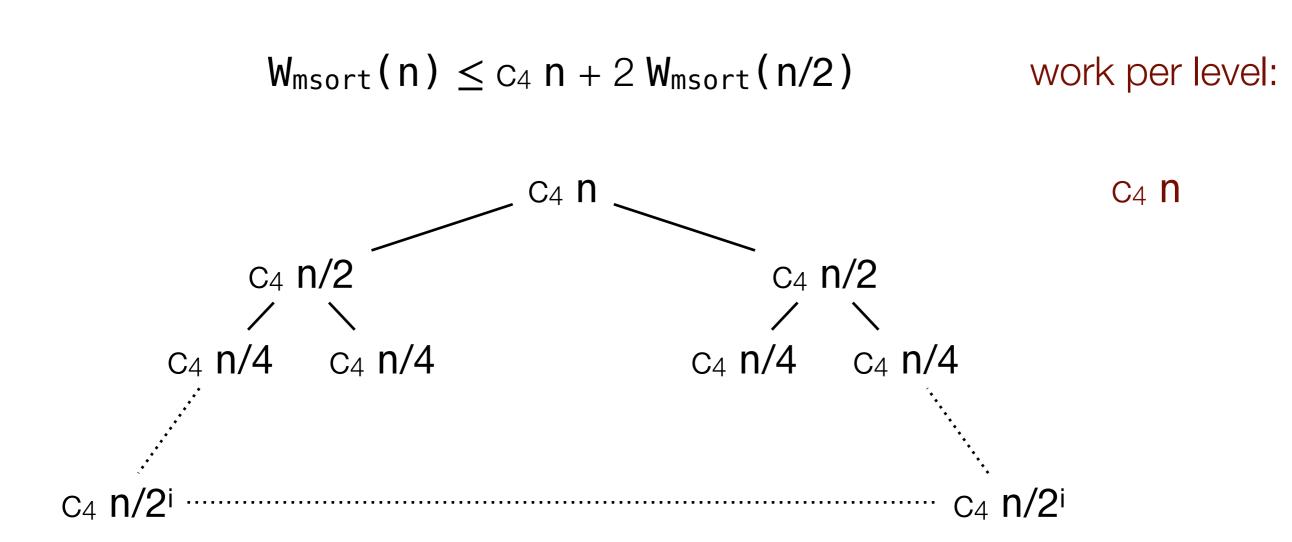
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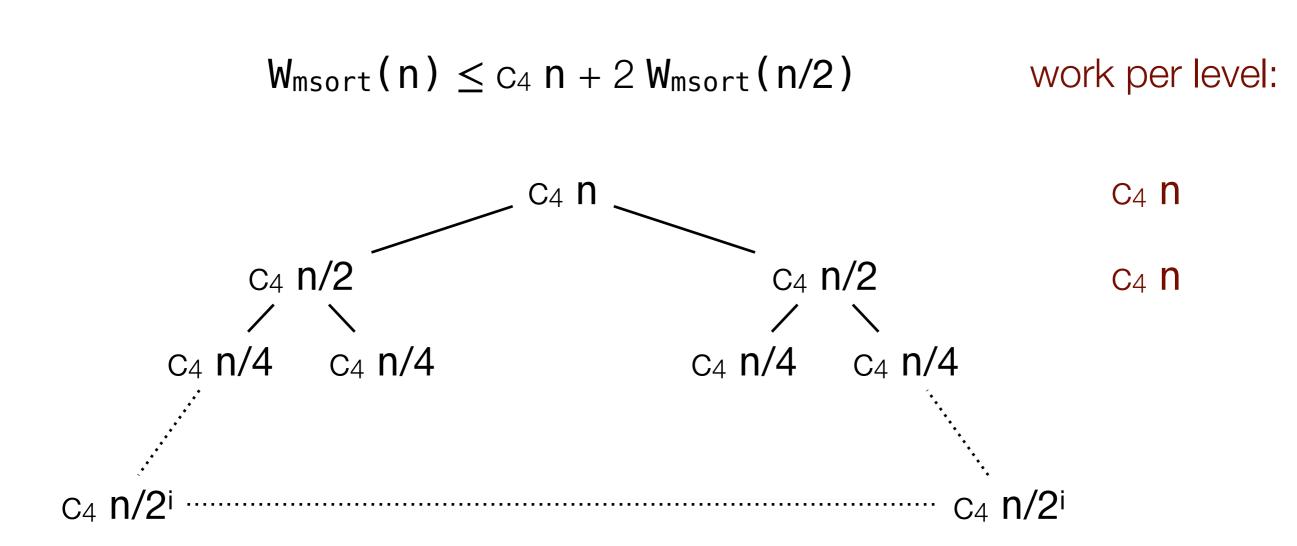


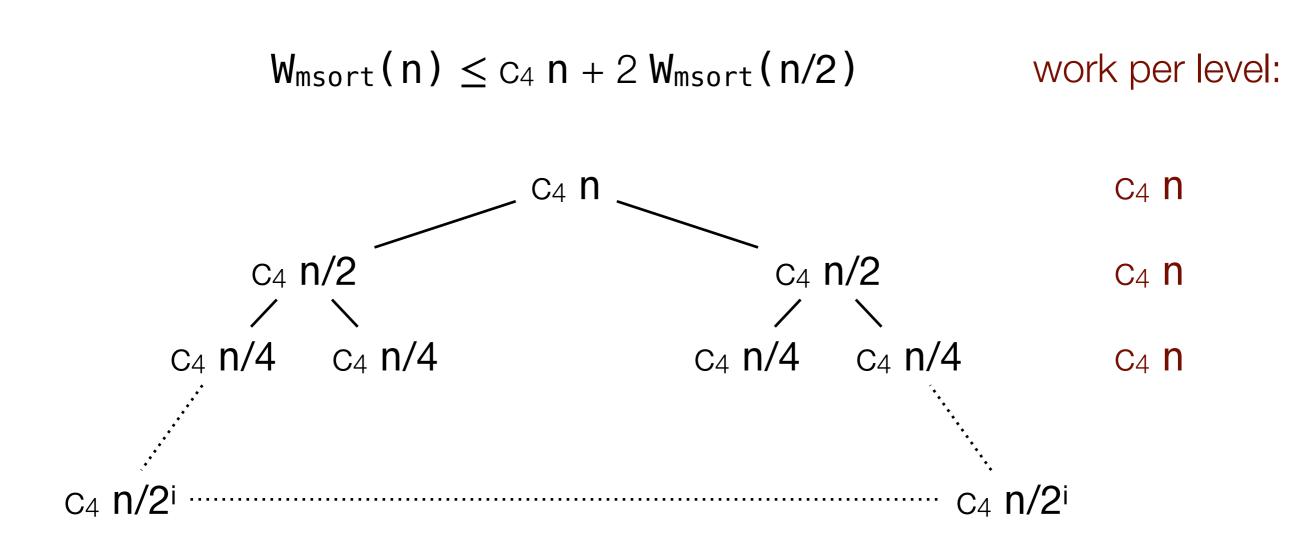
 $W_{msort}(n) \leq c_4 n + 2 W_{msort}(n/2)$ 

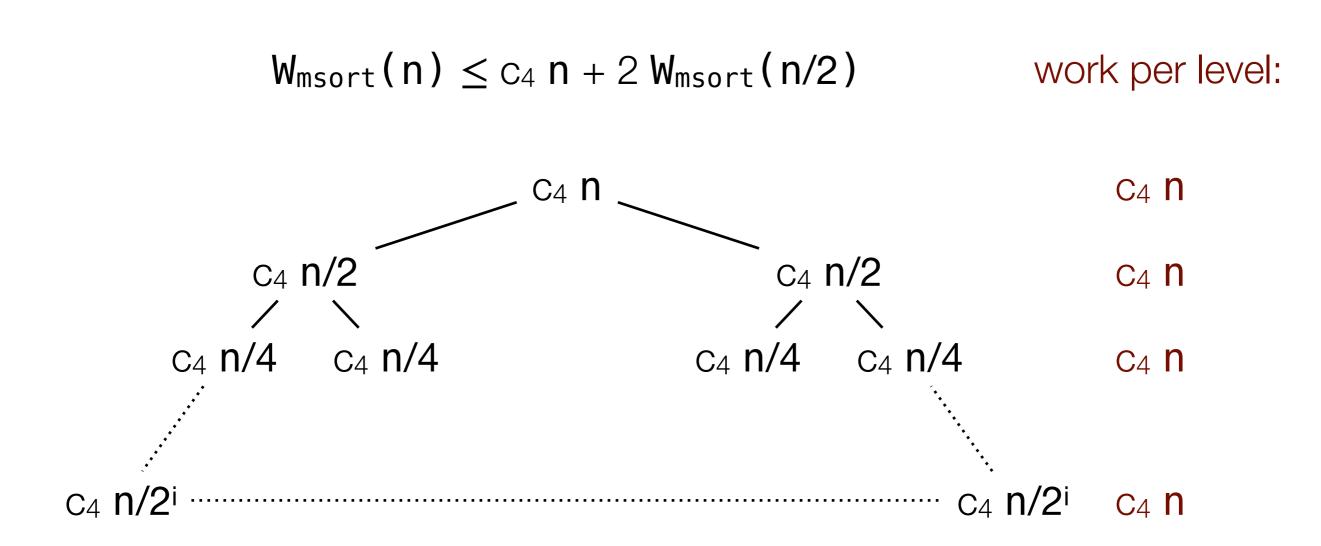


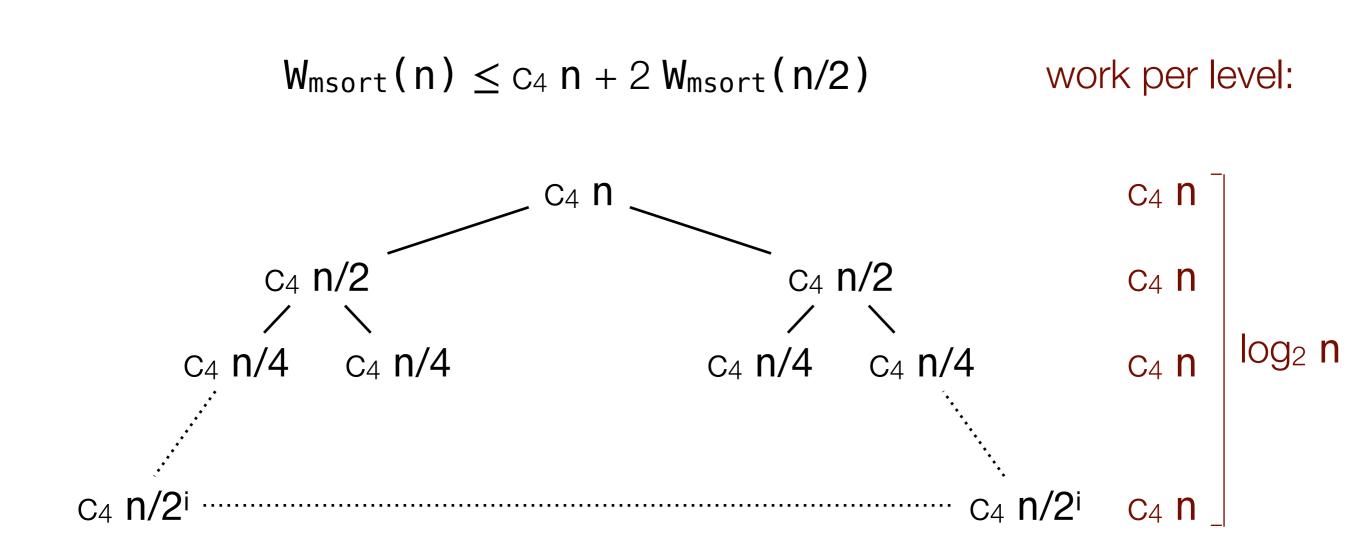


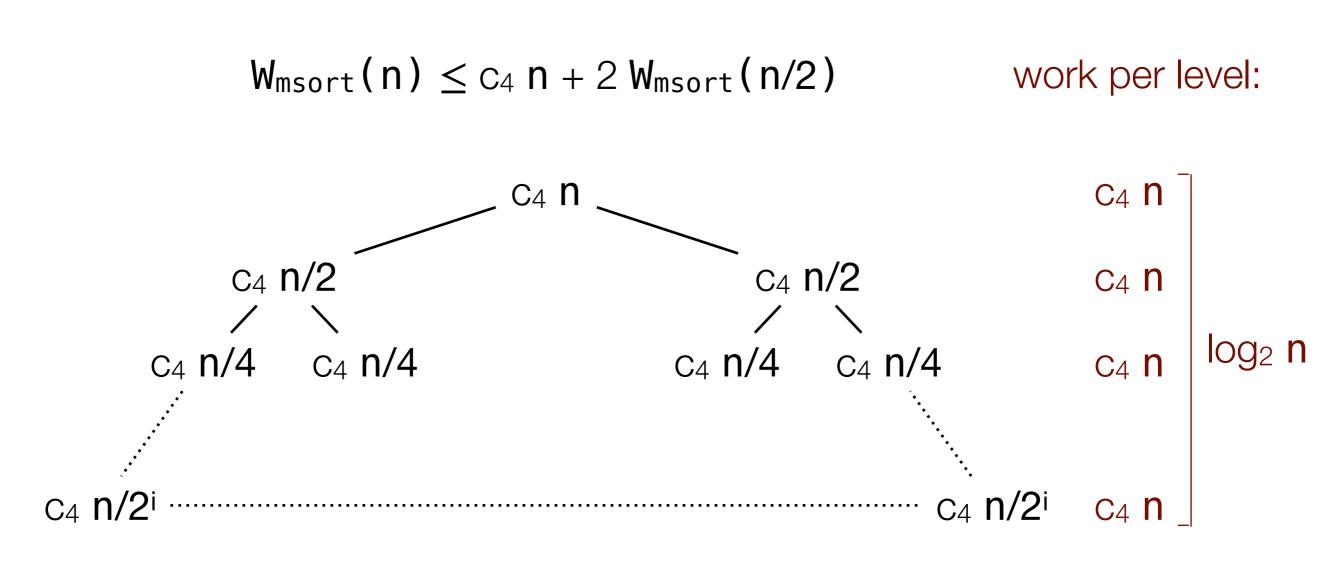




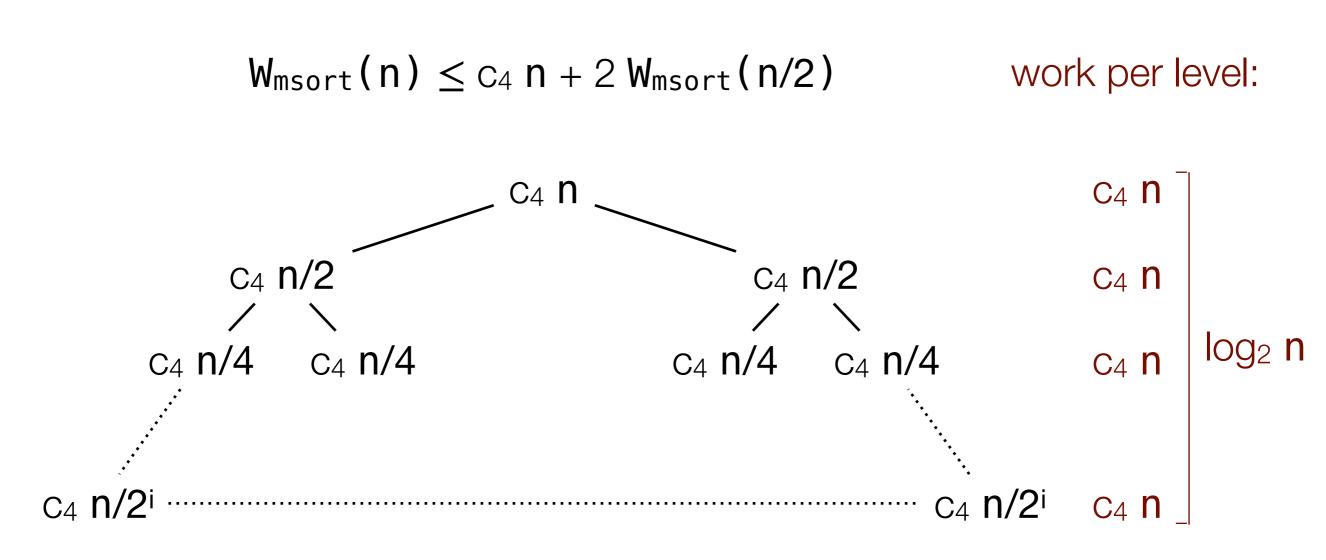


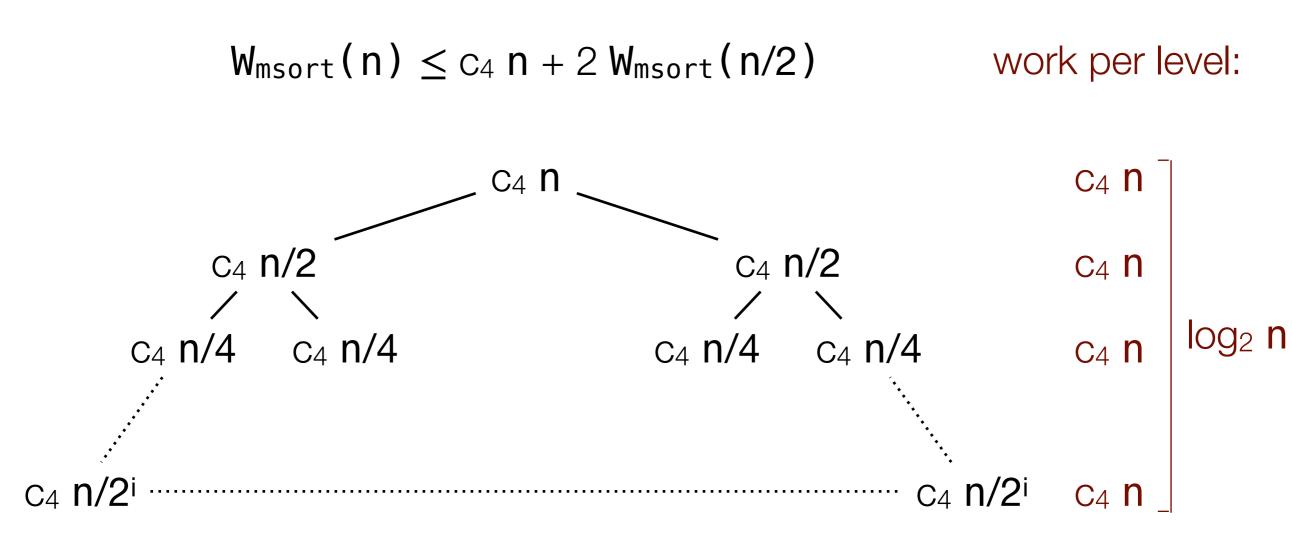




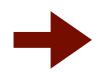


Consequently:





Consequently:  $W_{msort}(n)$  is 0(n log n).



Is there an opportunity for parallelism?

Recall work:  $W_{msort}(n)$  with n the list length.

#### Equations:

```
\begin{split} W_{msort}(0) &= c_0 \\ W_{msort}(1) &= c_1 \\ W_{msort}(n) &= c_2 + W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b) \\ &+ W_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n \geq 2 \end{split}
```

$$W_{msort}(n) \le c_2 + c_3 n + 2 W_{msort}(n/2)$$
  
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Recall work:  $W_{msort}(n)$  with n the list length.

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```

$$W_{msort}(n) \le c_2 + c_3 n + 2 W_{msort}(n/2)$$
  
 $W_{msort}(n) \le c_4 n + 2 W_{msort}(n/2)$ 

Recall work:  $W_{msort}(n)$  with n the list length.

#### Equations:

$$W_{\mathsf{msort}}(0) = C_0$$

$$W_{msort}(1) = C_1$$

$$W_{msort}(n) = c_2 + W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b) + W_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n \geq 2$$

$$W_{msort}(n) \le c_2 + c_3 n + 2 W_{msort}(n/2)$$
  
 $W_{msort}(n) \le c_4 n + 2 W_{msort}(n/2)$ 

parallelize recursive calls on sub-lists

Recall work:  $W_{msort}(n)$  with n the list length. Equations:  $W_{msort}(0) = C_0$   $W_{msort}(1) = C_1$   $W_{msort}(n) = C_2 + W_{split}(n) + W_{msort}(n_a) + W_{msort}(n_b) + W_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n > 2$ 

$$W_{msort}(n) \le c_2 + c_3 n + 2 W_{msort}(n/2)$$
  
 $W_{msort}(n) \le c_4 n + 2 W_{msort}(n/2)$ 

Span:  $S_{msort}(n)$  with n the list length. Equations:  $S_{msort}(0) = C_0$   $S_{msort}(1) = C_1$   $S_{msort}(n) = C_2 + S_{split}(n) + \max(S_{msort}(n_a), S_{msort}(n_b)) + S_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n \geq 2$ 

$$W_{msort}(n) \le c_2 + c_3 n + 2 W_{msort}(n/2)$$
  
 $W_{msort}(n) \le c_4 n + 2 W_{msort}(n/2)$ 

```
Span: S_{msort}(n) with n the list length. Equations: S_{msort}(0) = C_0 S_{msort}(1) = C_1 S_{msort}(n) = C_2 + S_{split}(n) + \max(S_{msort}(n_a), S_{msort}(n_b)) + S_{merge}(n_a, n_b), \text{ for } n = n_a + n_b \text{ and } n \geq 2
```

$$W_{msort}(n) \le c_2 + c_3 n + 2 W_{msort}(n/2)$$
  
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```

$$S_{msort}(n) \le c_2 + c_3 n + S_{msort}(n/2)$$
  
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Span:  $S_{msort}(n)$  with n the list length.

#### Equations:

$$S_{msort}(0) = C_0$$

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$$S_{msort}(n) = c_2 + S_{split}(n) + \max(S_{msort}(n_a), S_{msort}(n_b)) + S_{merge}(n_a, n_b),$$
 for  $n = n_a + n_b$  and  $n \ge 2$ 

max!

$$\begin{split} S_{msort}(n) &\leq c_2 + c_3 n + S_{msort}(n/2) \\ S_{msort}(n) &\leq c_4 n + S_{msort}(n/2) \end{split}$$



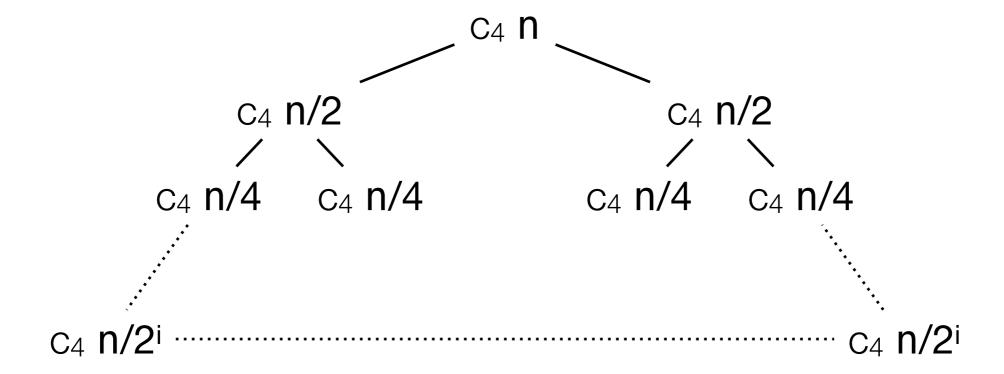
Let's look at the tree method to find a closed form.

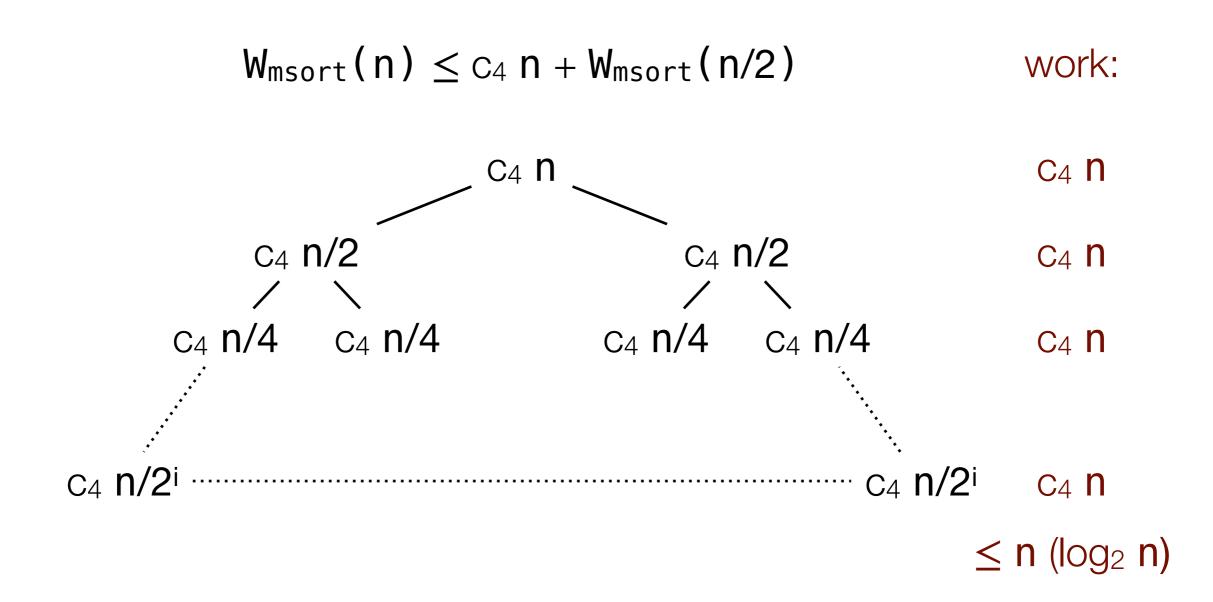
parallelize recursive

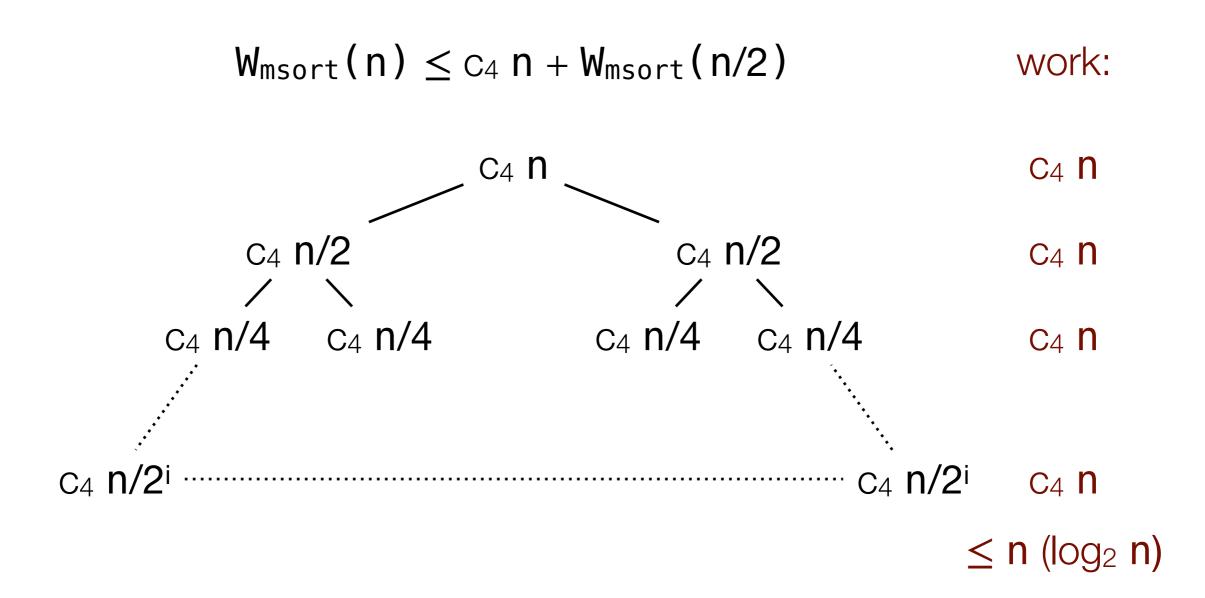
calls on sub-lists

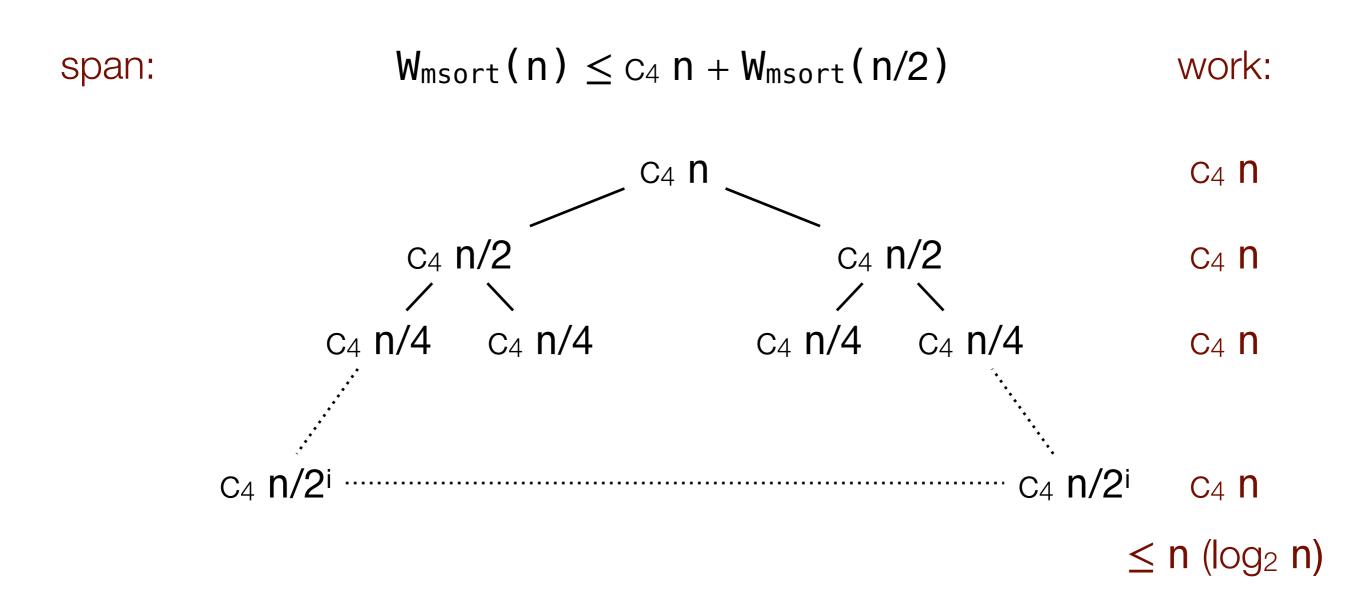
$$W_{msort}(n) \leq c_4 n + W_{msort}(n/2)$$

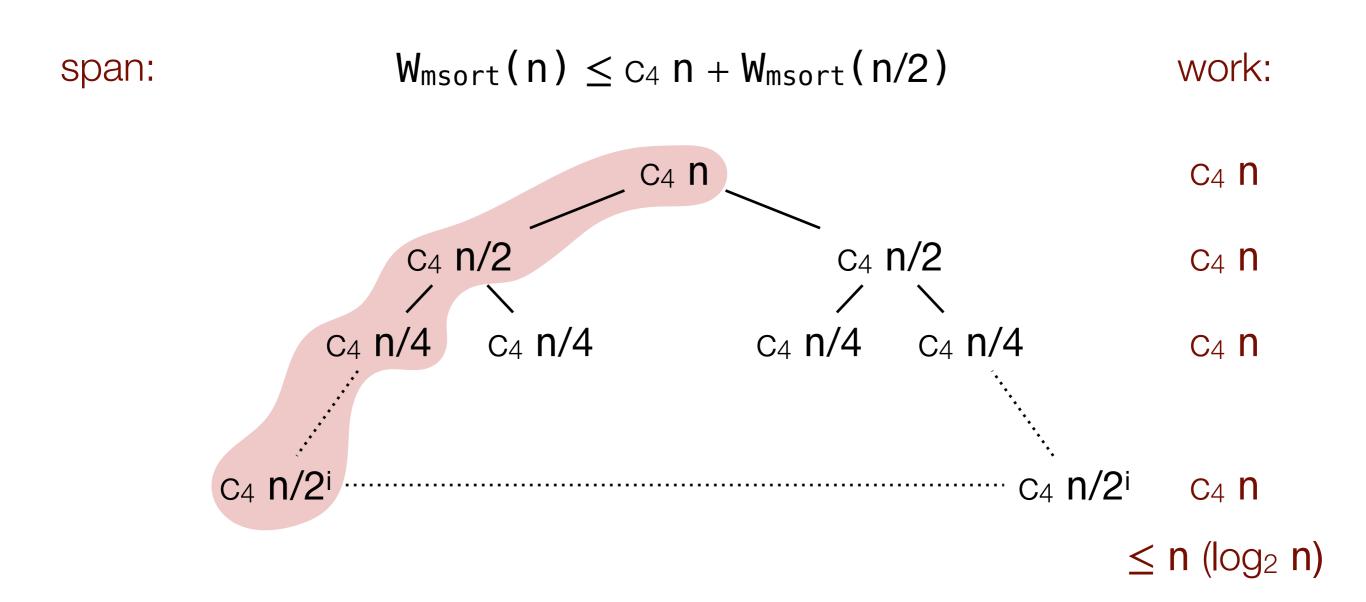
 $W_{msort}(n) \leq c_4 n + W_{msort}(n/2)$ 

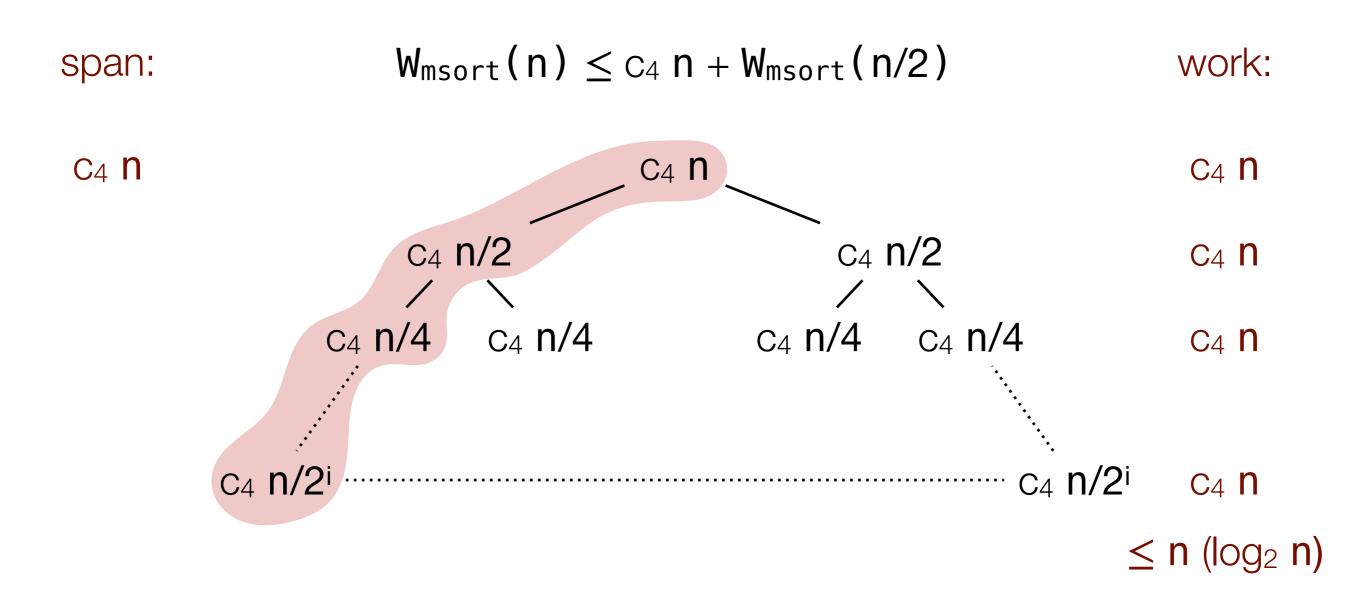


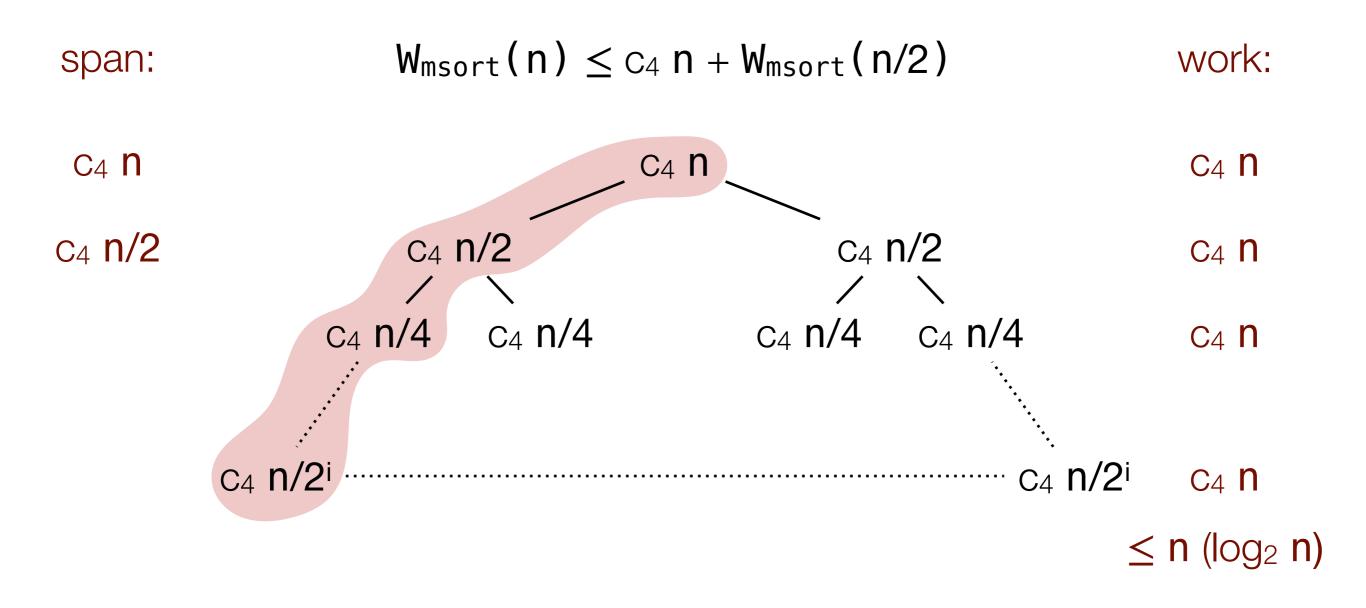


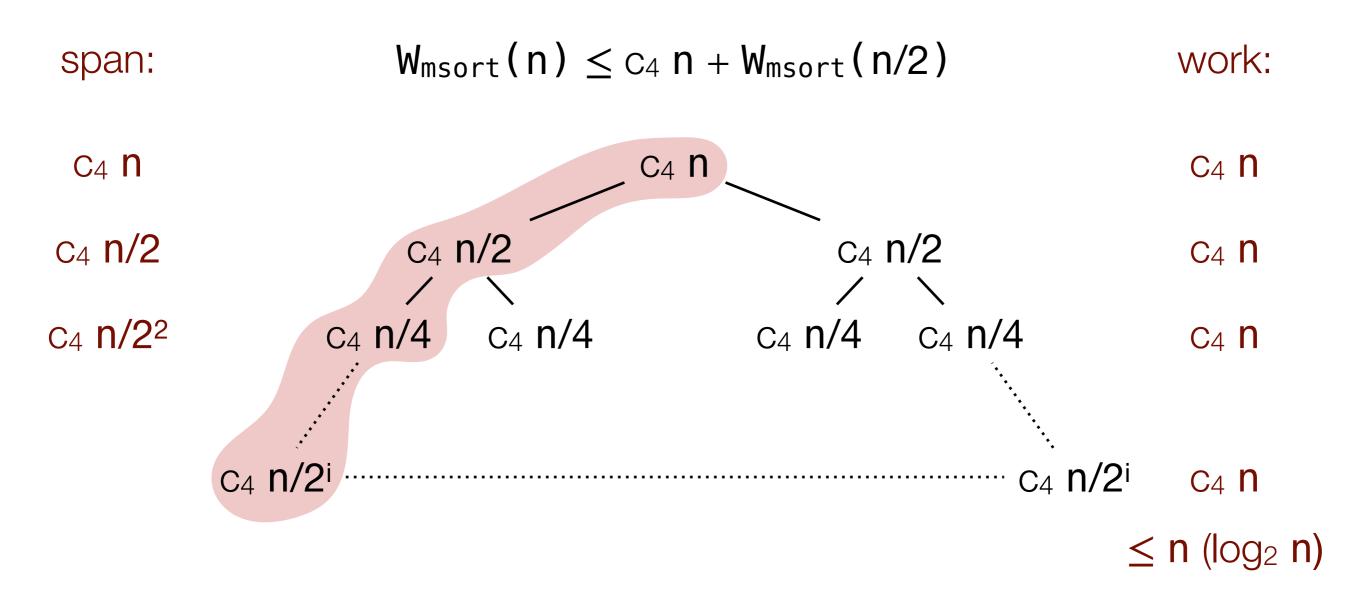


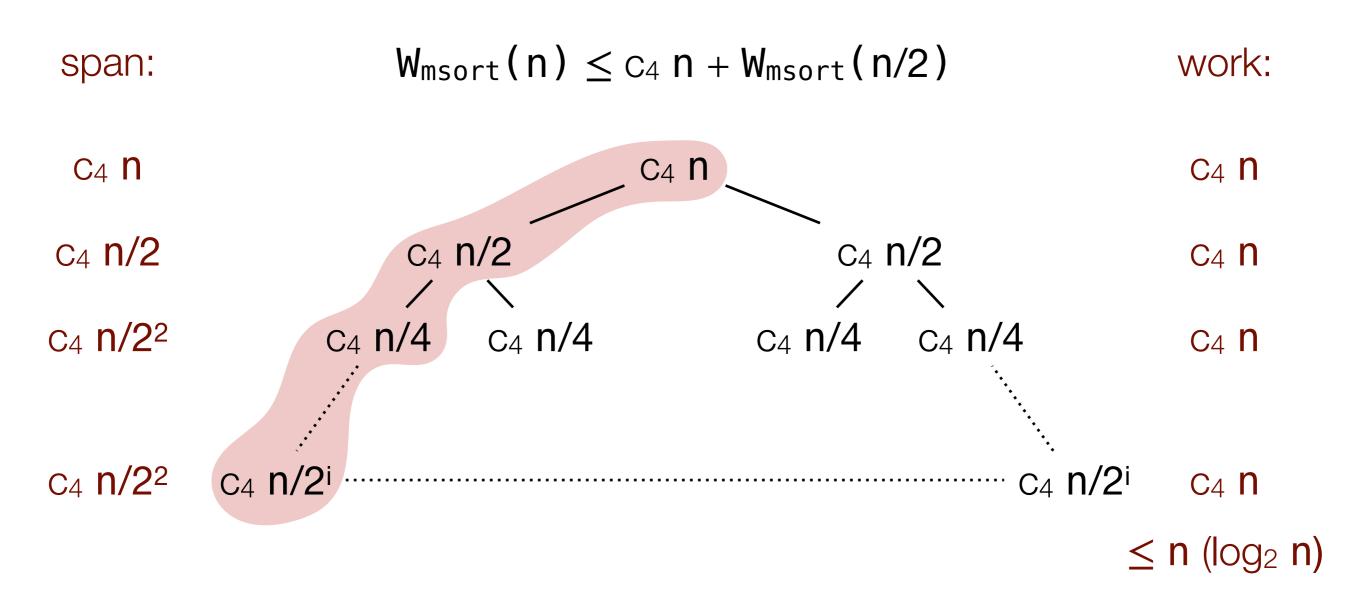


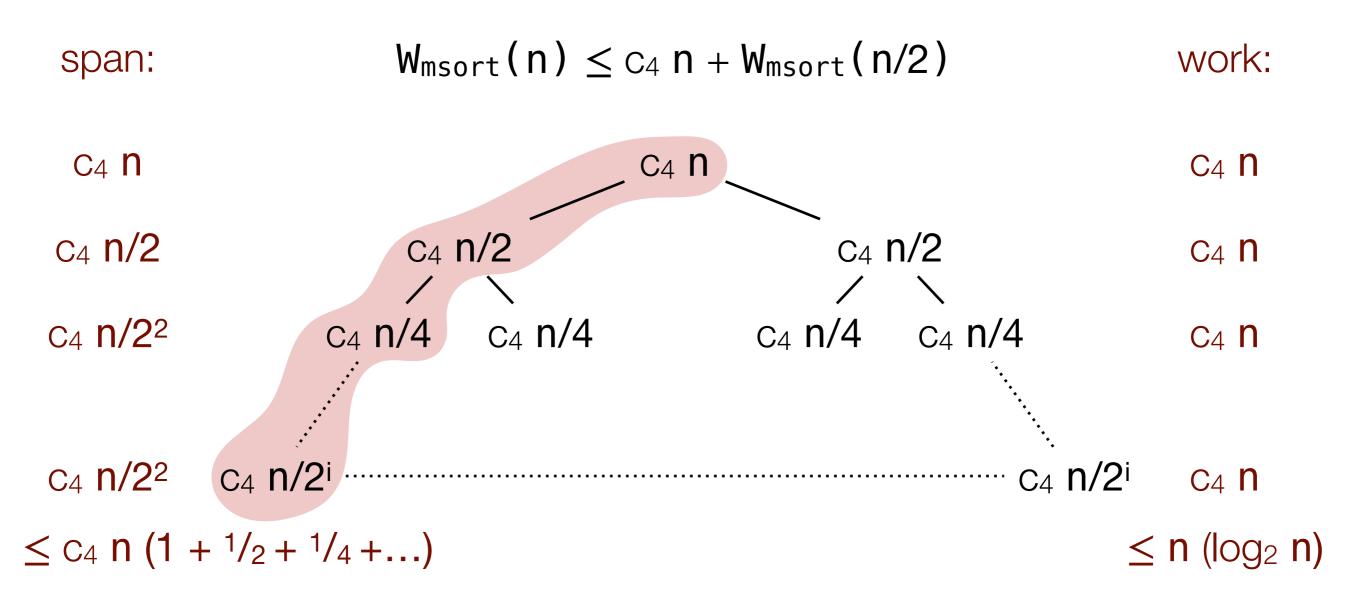


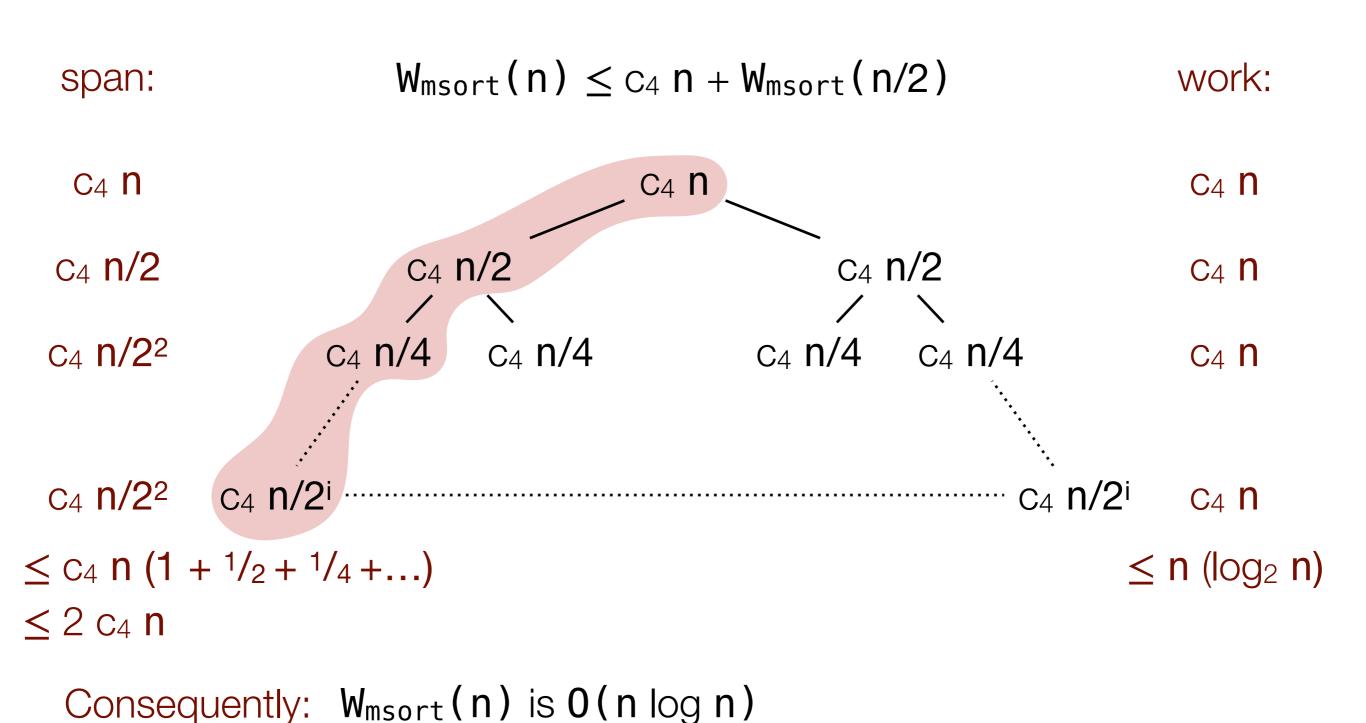




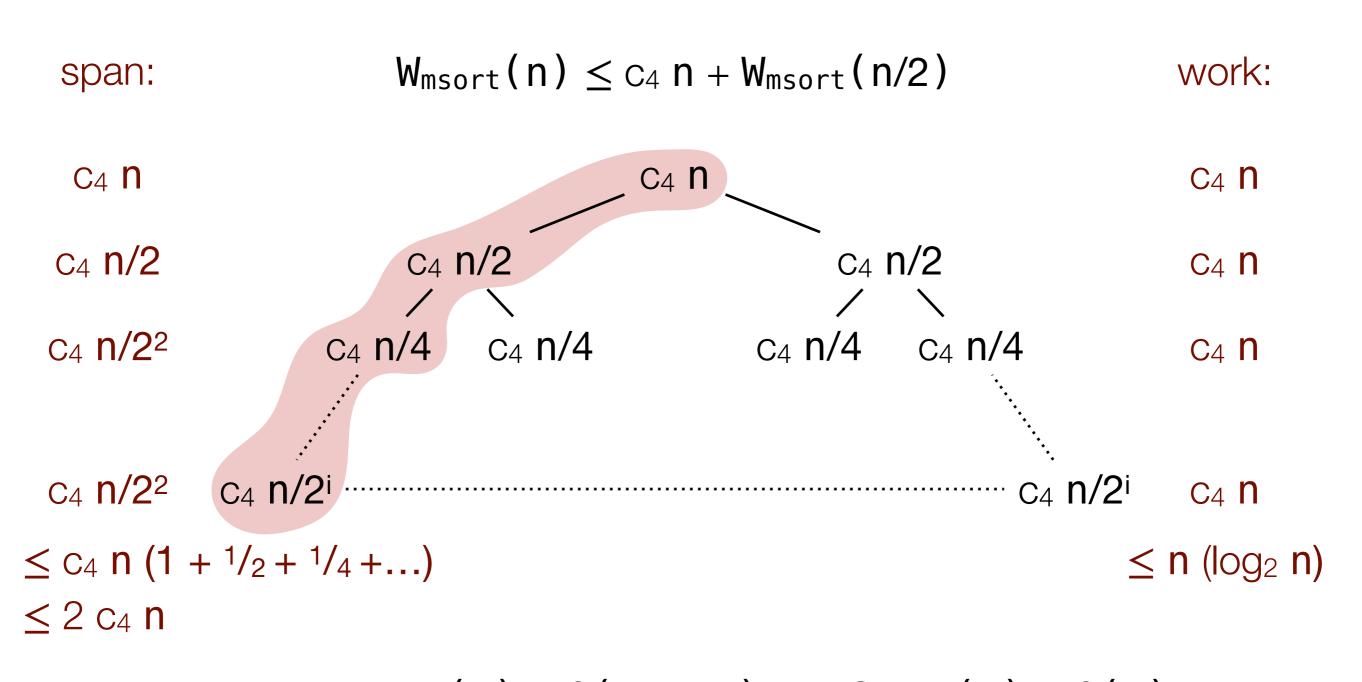




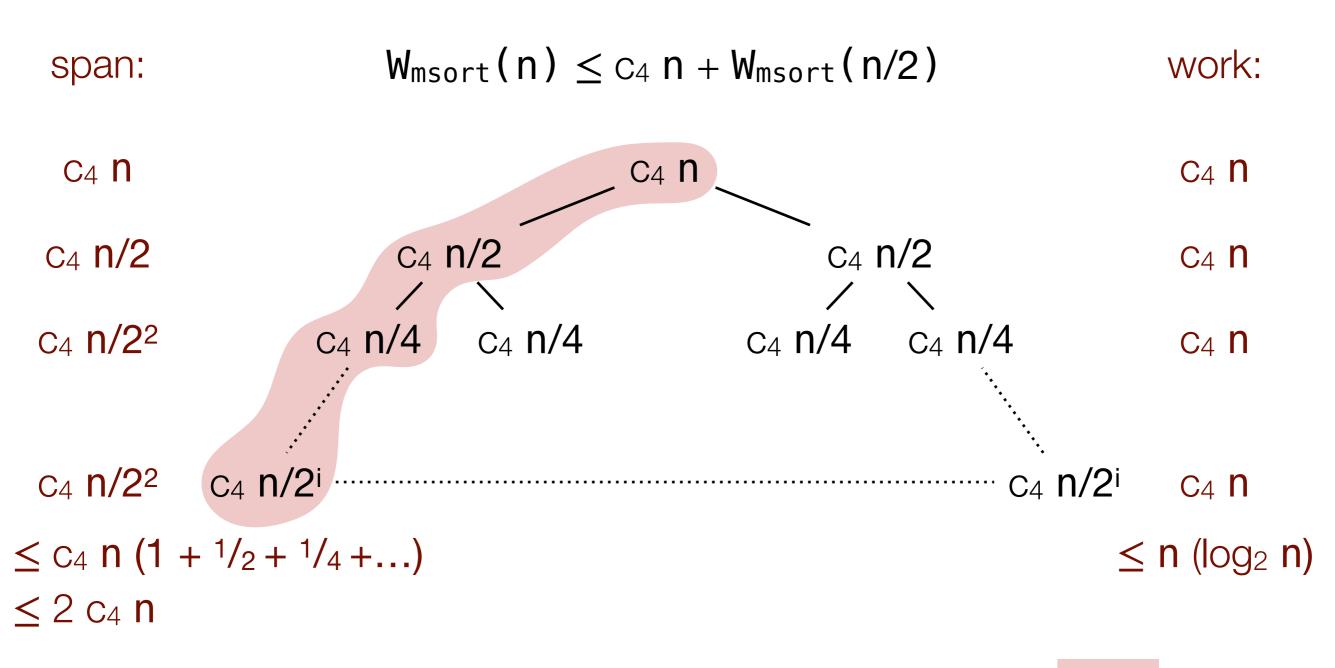




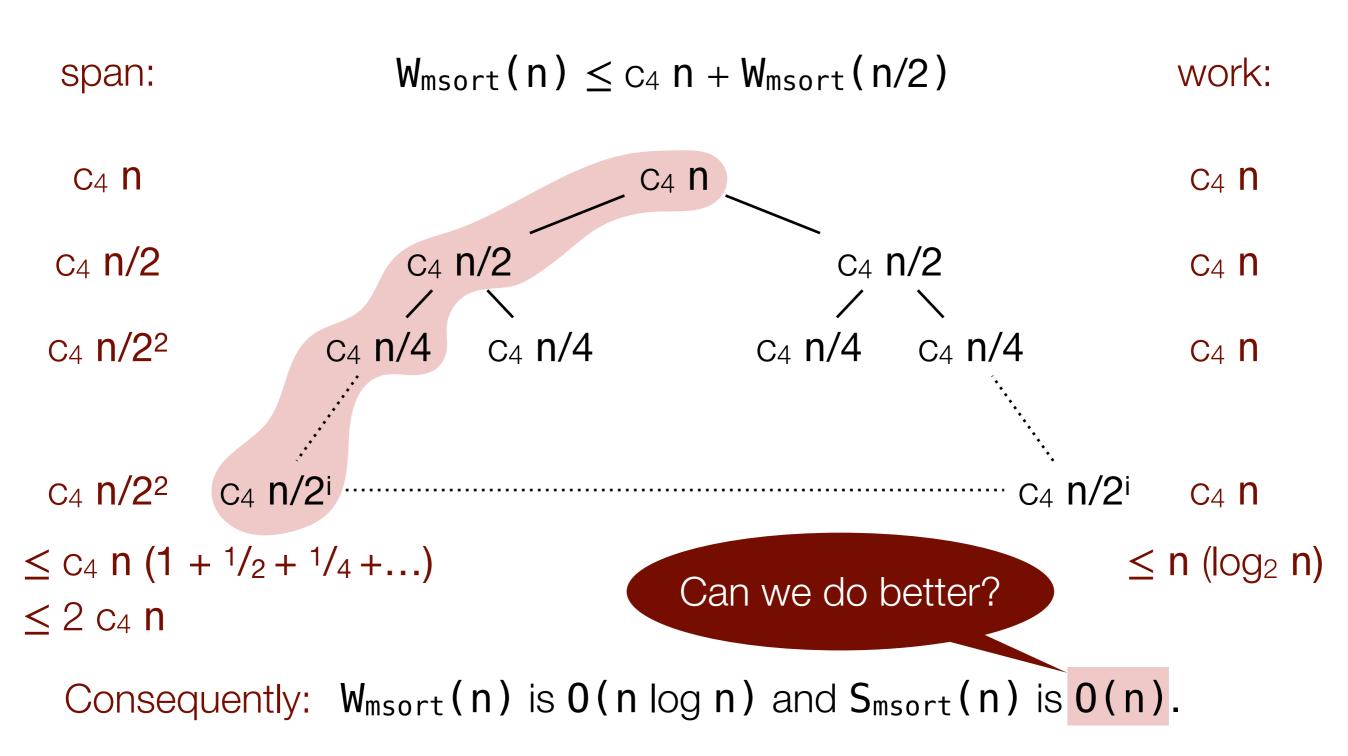
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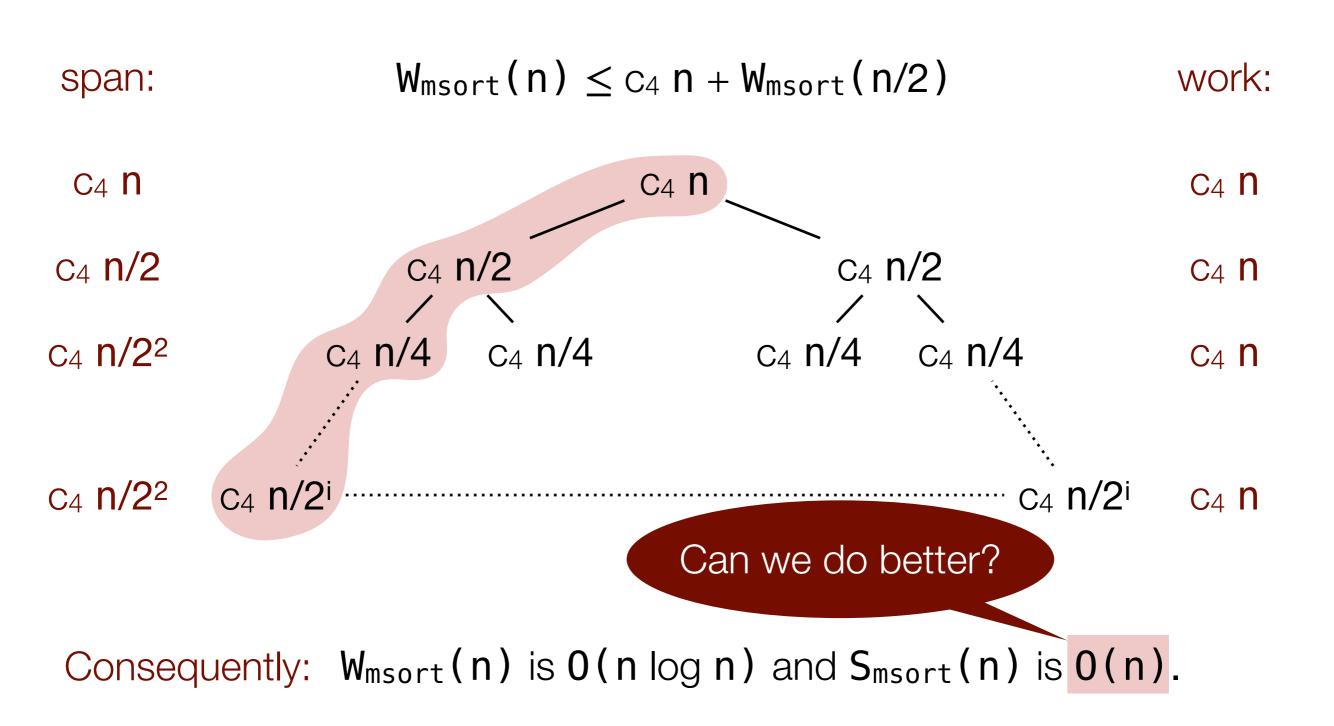


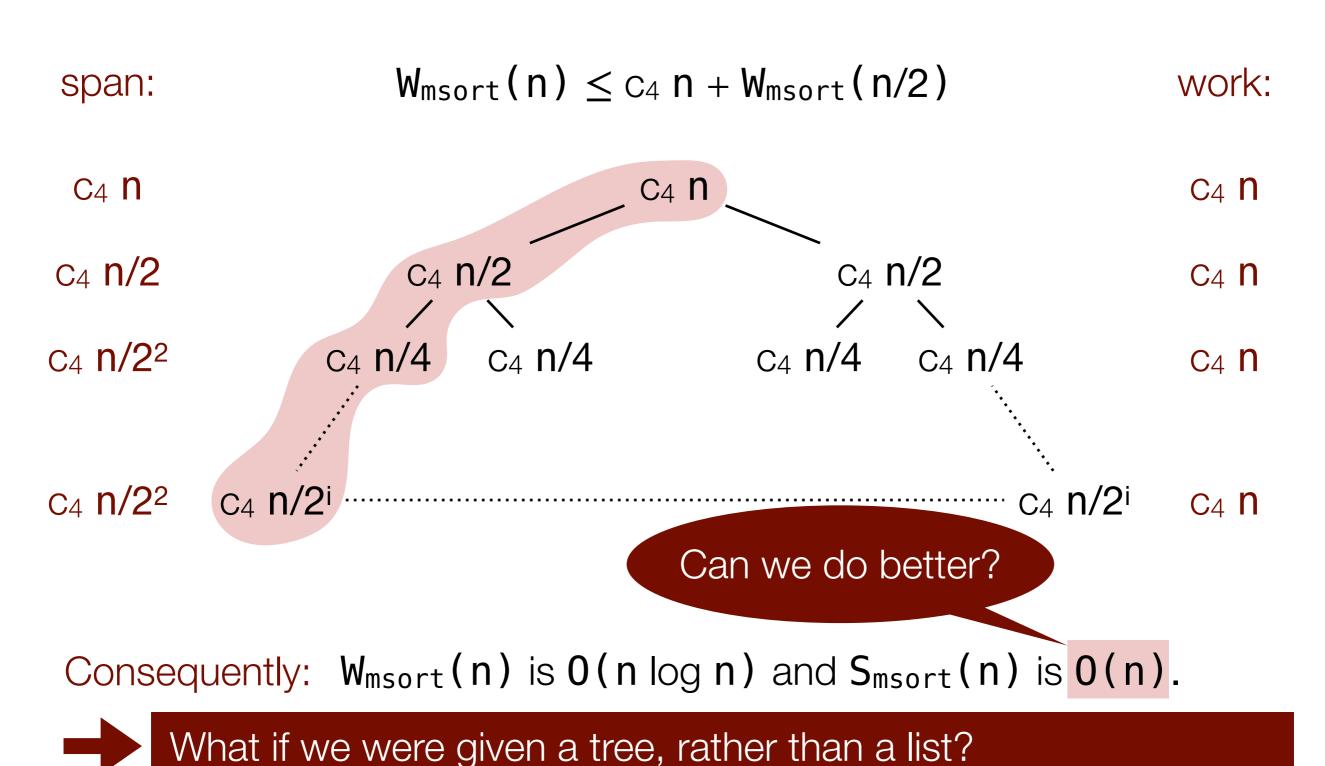
Consequently:  $W_{msort}(n)$  is  $O(n \log n)$  and  $S_{msort}(n)$  is O(n).



Consequently:  $W_{msort}(n)$  is  $O(n \log n)$  and  $S_{msort}(n)$  is O(n).







That's all for today. Have a good weekend!