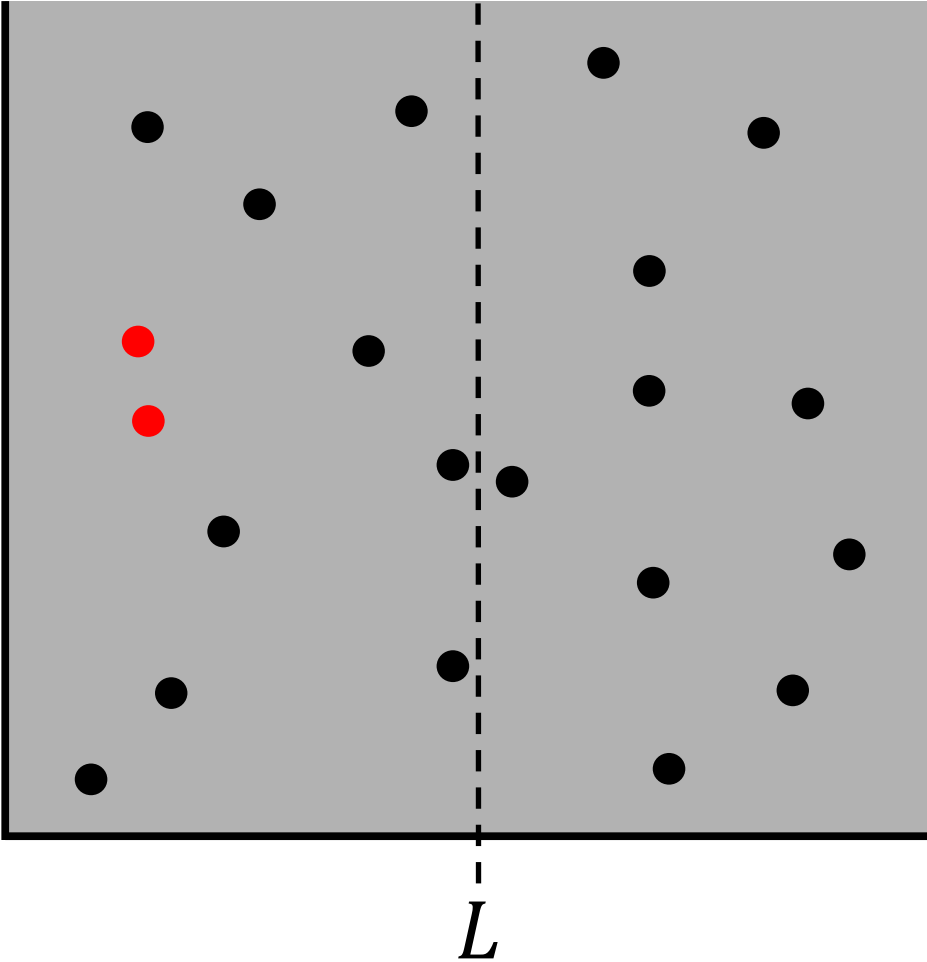


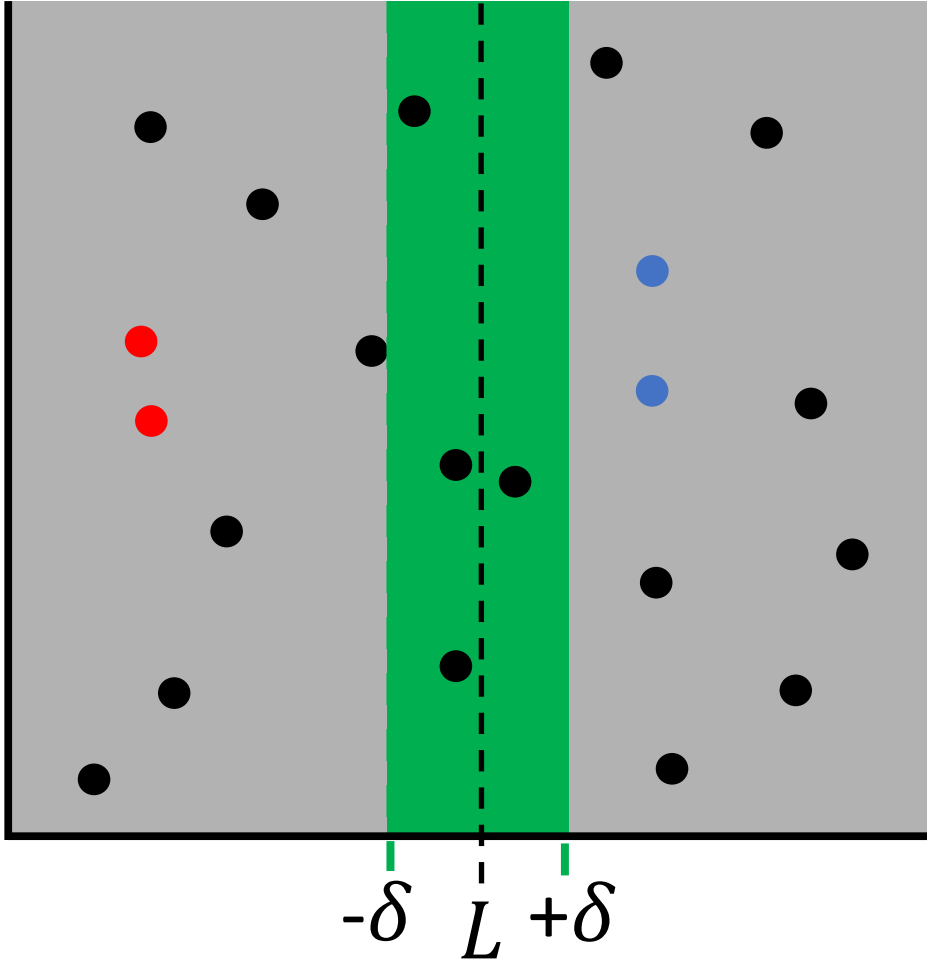
# Closest Pair of Points

## CSCI 532

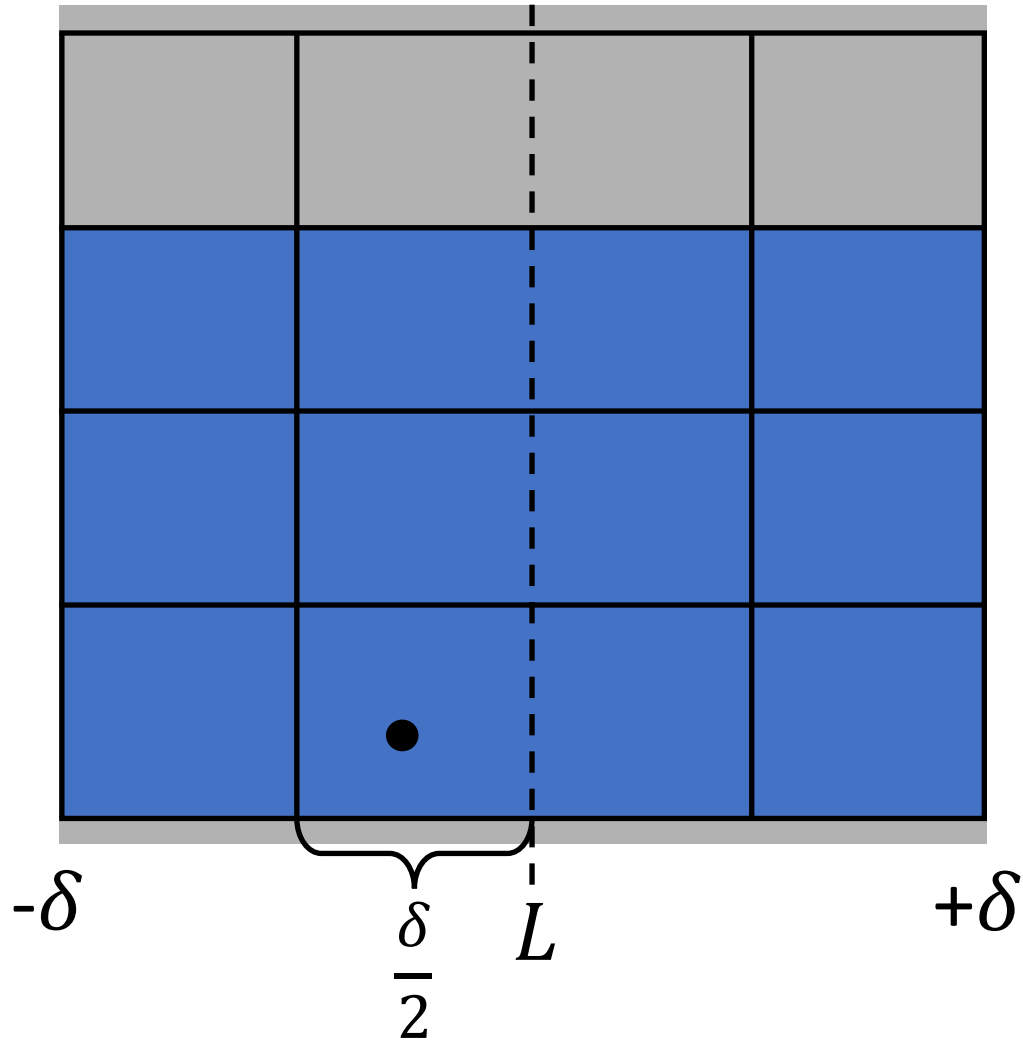
# Closest Pair Problem – Divide and Conquer



# Closest Pair Problem – Divide and Conquer



# Closest Pair Problem – Divide and Conquer



Only care about certain boxes

+ At most one point per box

---

Fixed number of points to check

Straddle point hunting:

$$O(n^2) \rightarrow O(n \log n)$$

# Closest Pair Problem – Algorithm

`findClosestPair( $P$ ):`

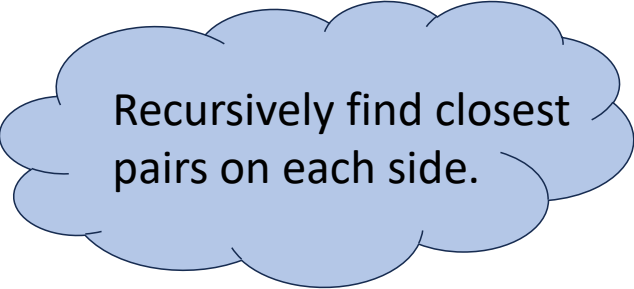
1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}$ ,  $P_{\text{right}}$ .
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .
3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .
4. Let  $S$  be straddle points within  $\delta$  of  $L$ .
5. Sort  $S$  by  $y$ -coord.
6. Compare points in  $S$  to next 11 points and update  $\delta$ .
7. Return  $\delta$ .

# Closest Pair Problem – Algorithm

**findClosestPair( $P$ ):**

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}$ ,  $P_{\text{right}}$ .

**2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .**



Recursively find closest pairs on each side.

3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .

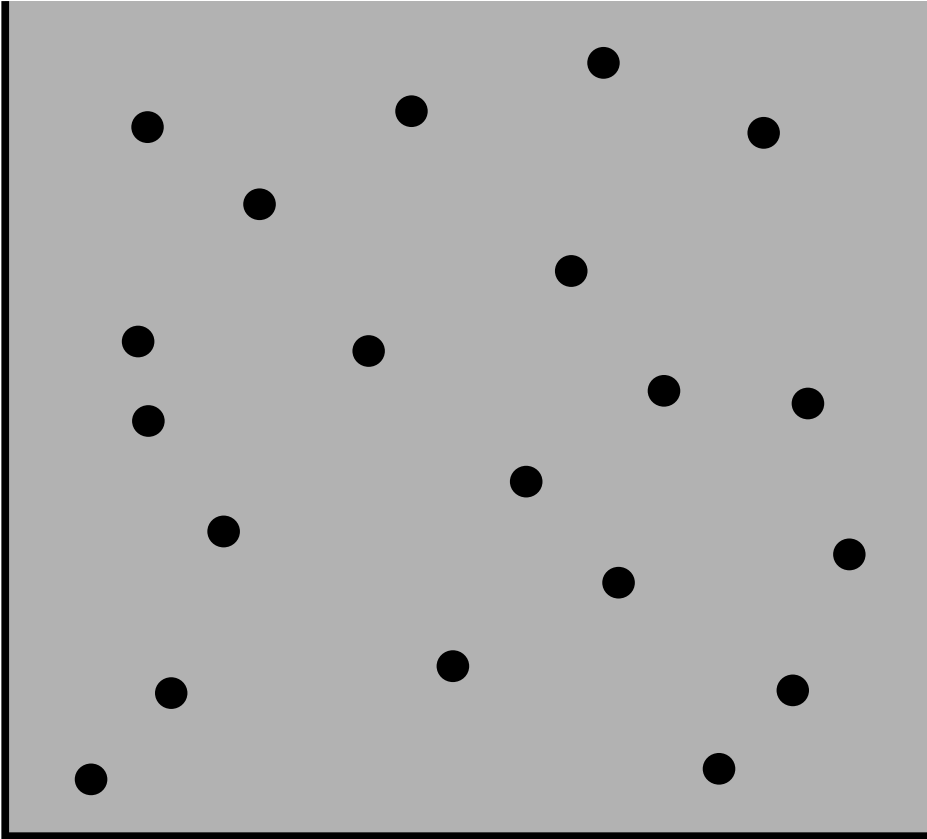
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6. Compare points in  $S$  to next 11 points and update  $\delta$ .

7. Return  $\delta$ .

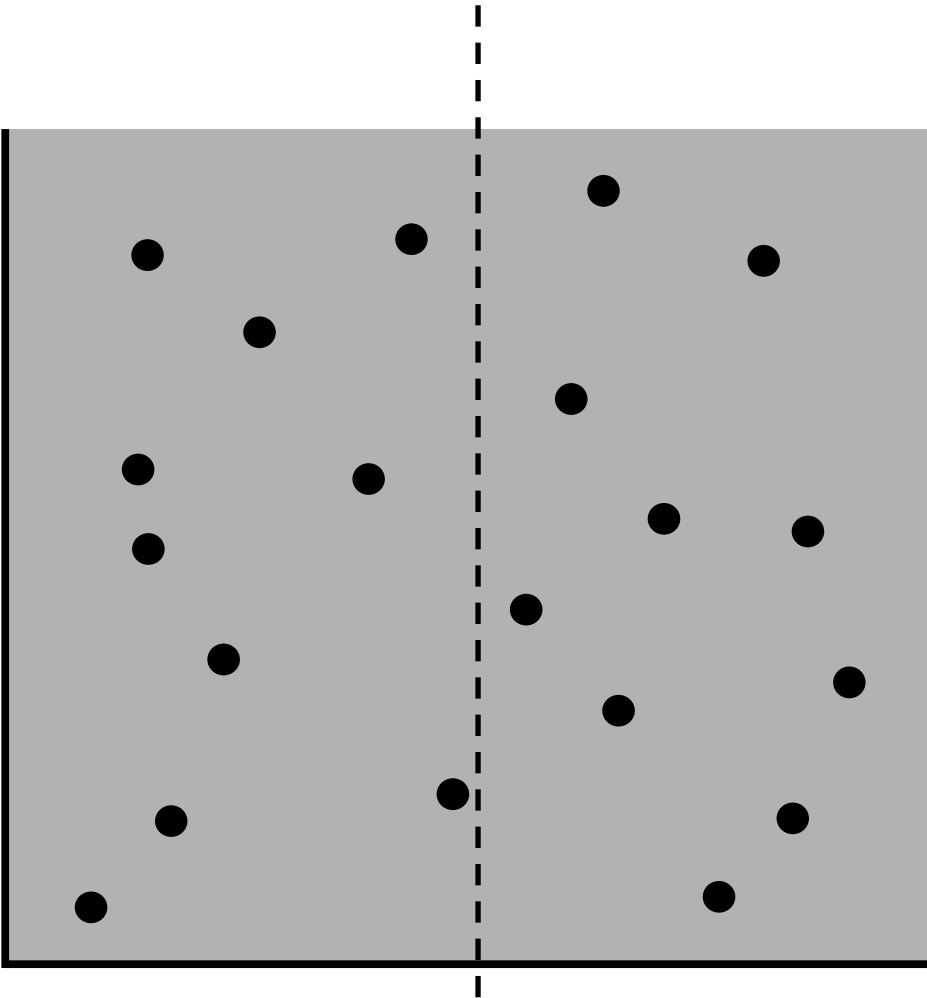
# Closest Pair Problem – Divide and Conquer



Recursive Process:

Recursively find closest pairs on each side.

# Closest Pair Problem – Divide and Conquer



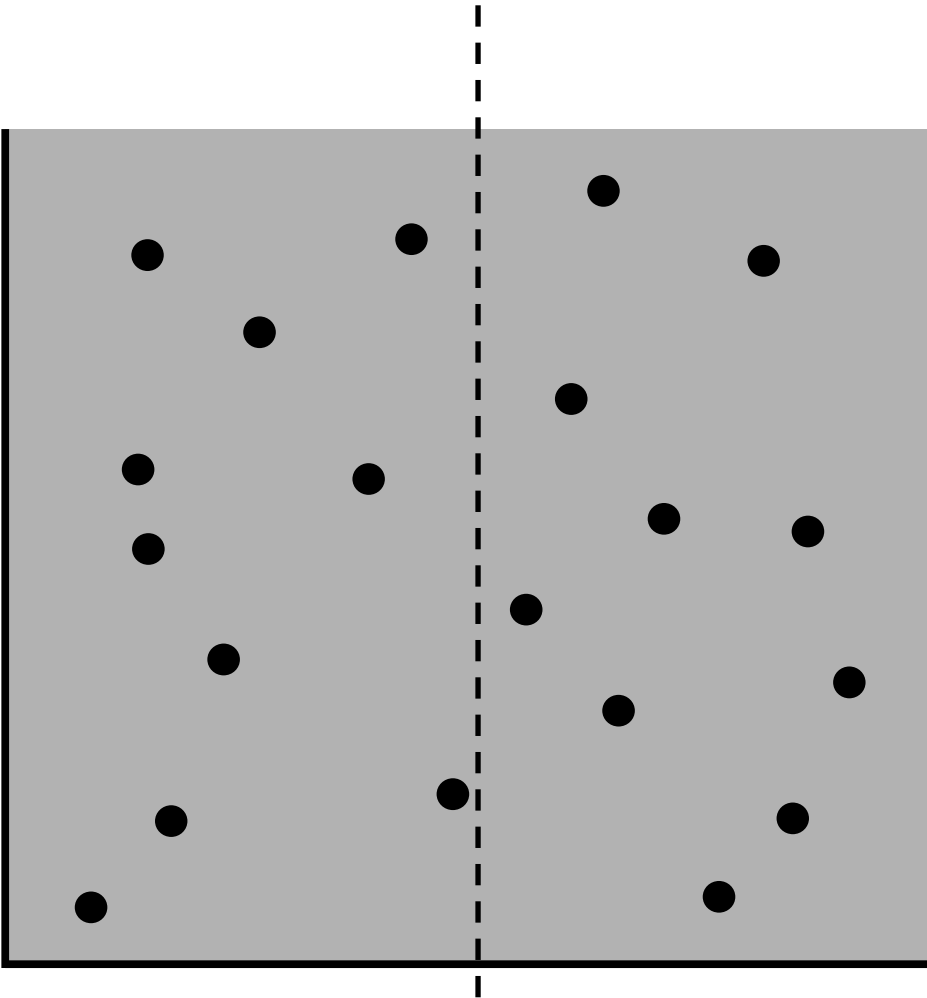
Recursive Process:

1. Divide points in half.

Recursively find closest pairs on each side.



# Closest Pair Problem – Divide and Conquer

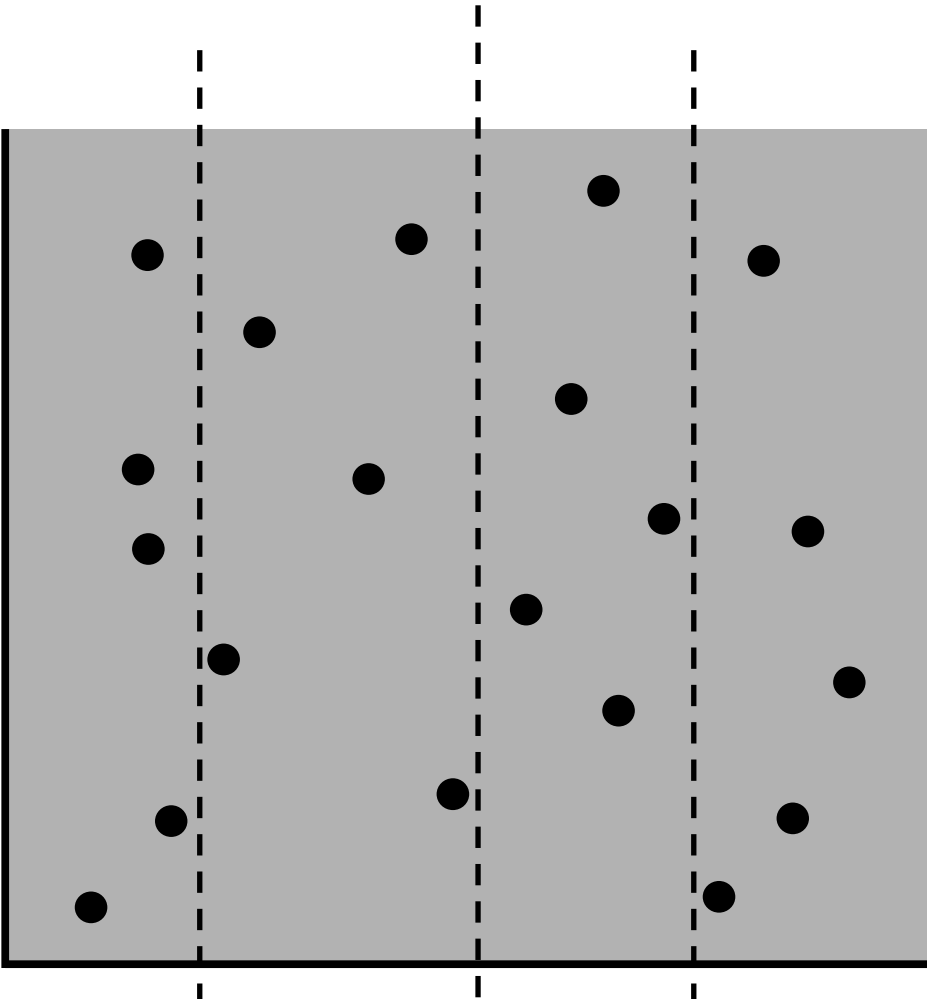


Recursive Process:

1. Divide points in half.
2. Repeat step 1 until determining  $d_{\text{left}}$  and  $d_{\text{right}}$  is trivial.

Recursively find closest pairs on each side.

# Closest Pair Problem – Divide and Conquer

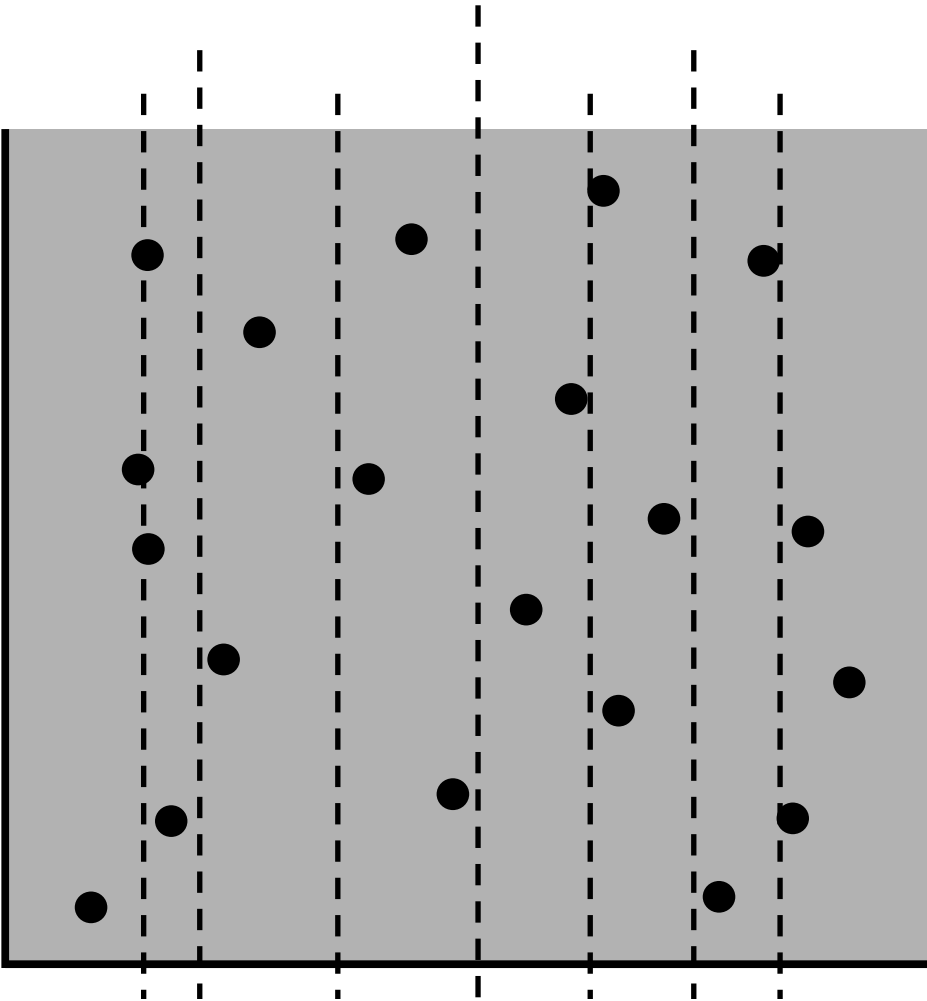


Recursive Process:

1. Divide points in half.
2. Repeat step 1 until determining  $d_{\text{left}}$  and  $d_{\text{right}}$  is trivial.

Recursively find closest pairs on each side.

# Closest Pair Problem – Divide and Conquer

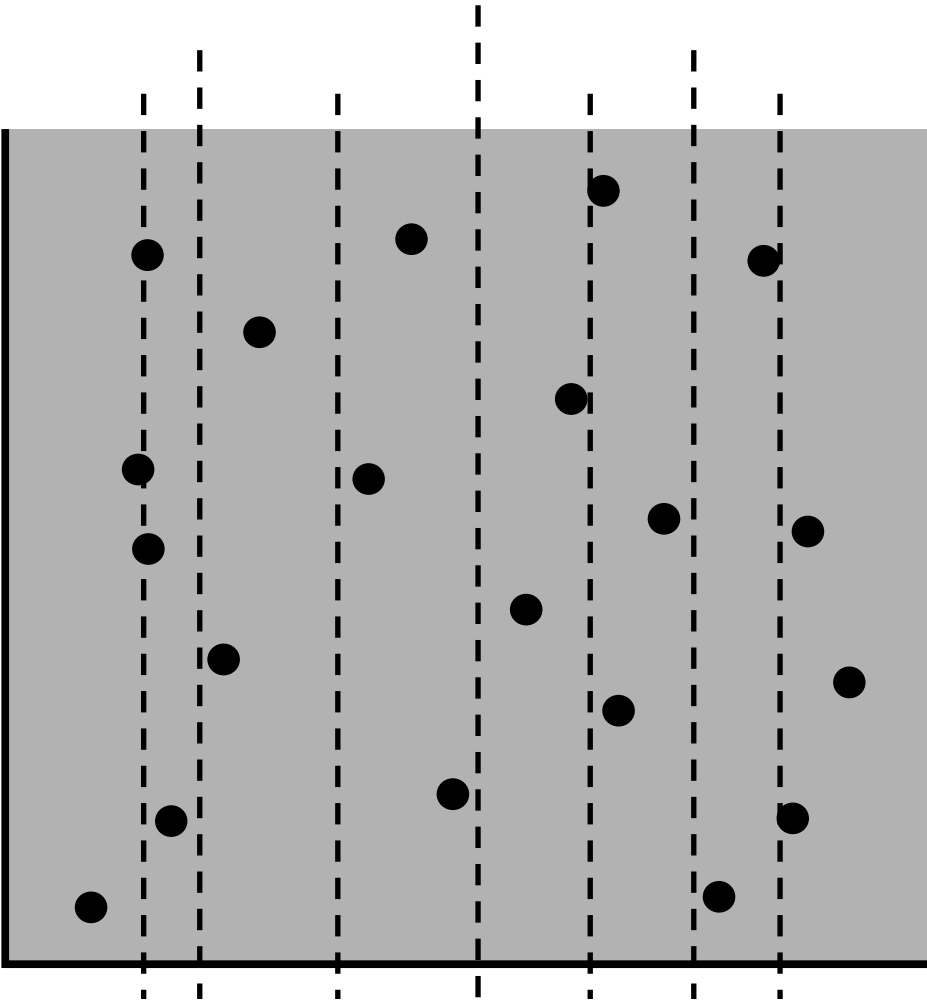


Recursive Process:

1. Divide points in half.
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Recursively find closest pairs on each side.

# Closest Pair Problem – Divide and Conquer

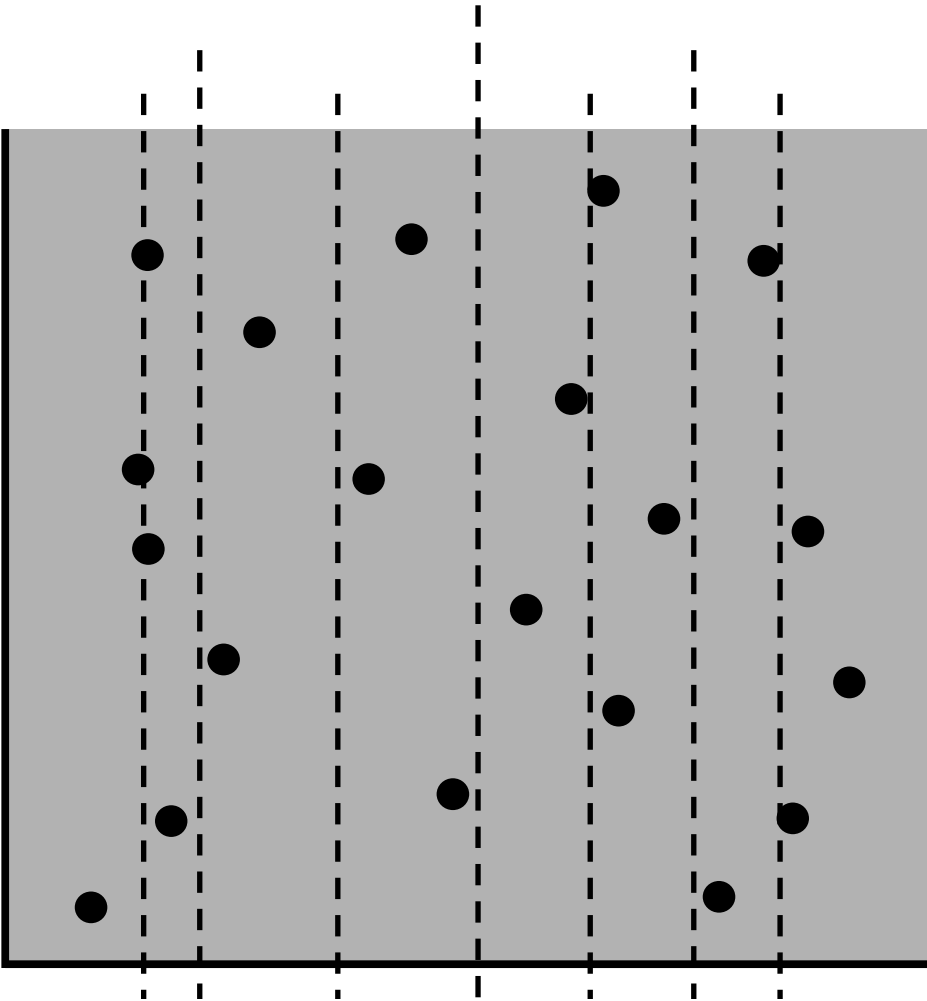


Recursive Process:

1. Divide points in half.
2. Repeat step 1 until determining  $d_{\text{left}}$  and  $d_{\text{right}}$  is trivial.

When is finding  $d_{\text{left}}$  and  $d_{\text{right}}$  trivial?

# Closest Pair Problem – Divide and Conquer



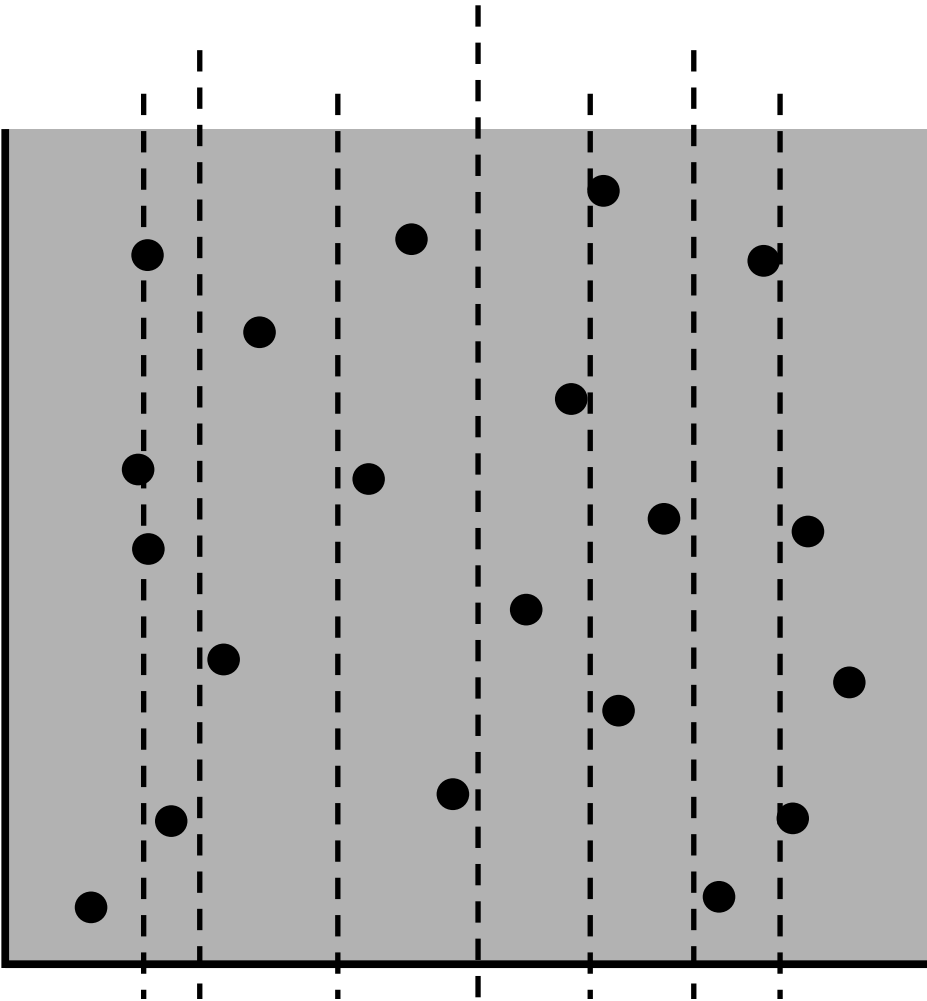
Recursive Process:

1. Divide points in half.
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When is finding  $d_{\text{left}}$  and  $d_{\text{right}}$  trivial?

When there are one or two points on the left and right sides.

# Closest Pair Problem – Divide and Conquer



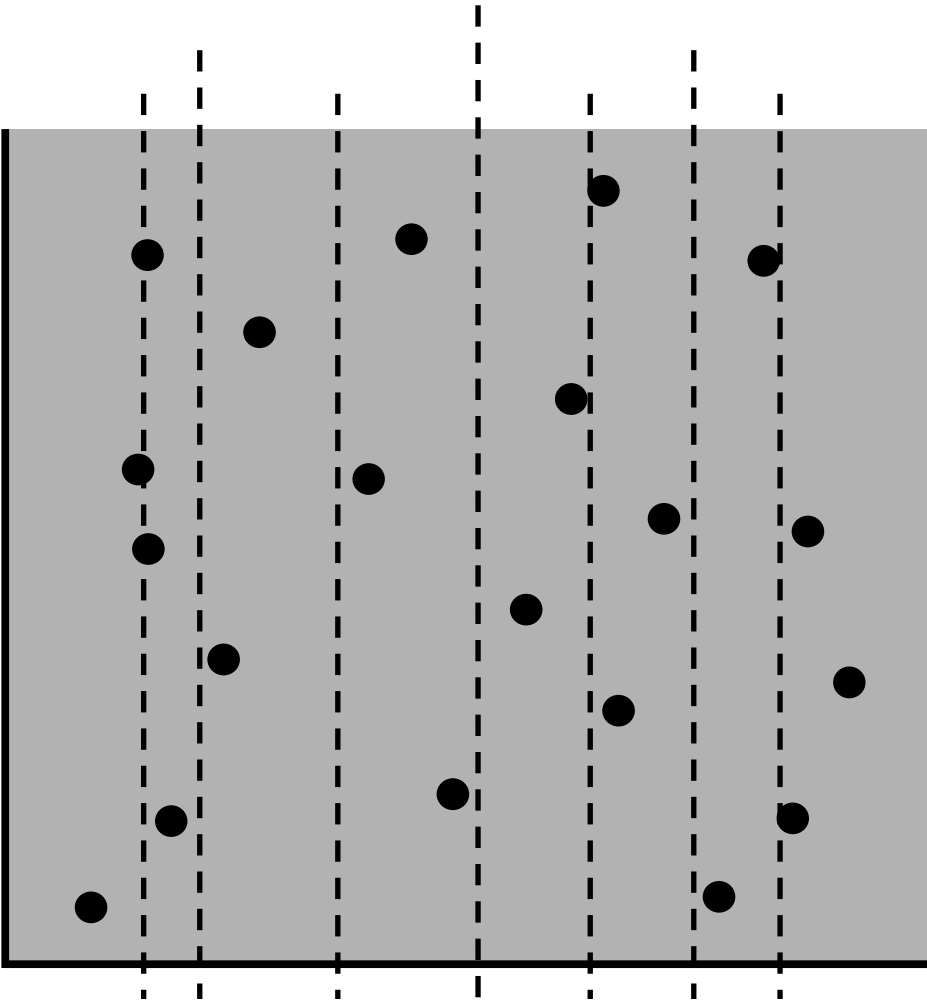
Recursive Process:

1. Divide points in half.
2. Repeat step 1 until there are only one or two points on each side.

When is finding  $d_{\text{left}}$  and  $d_{\text{right}}$  trivial?

When there are one or two points on the left and right sides.

# Closest Pair Problem – Divide and Conquer

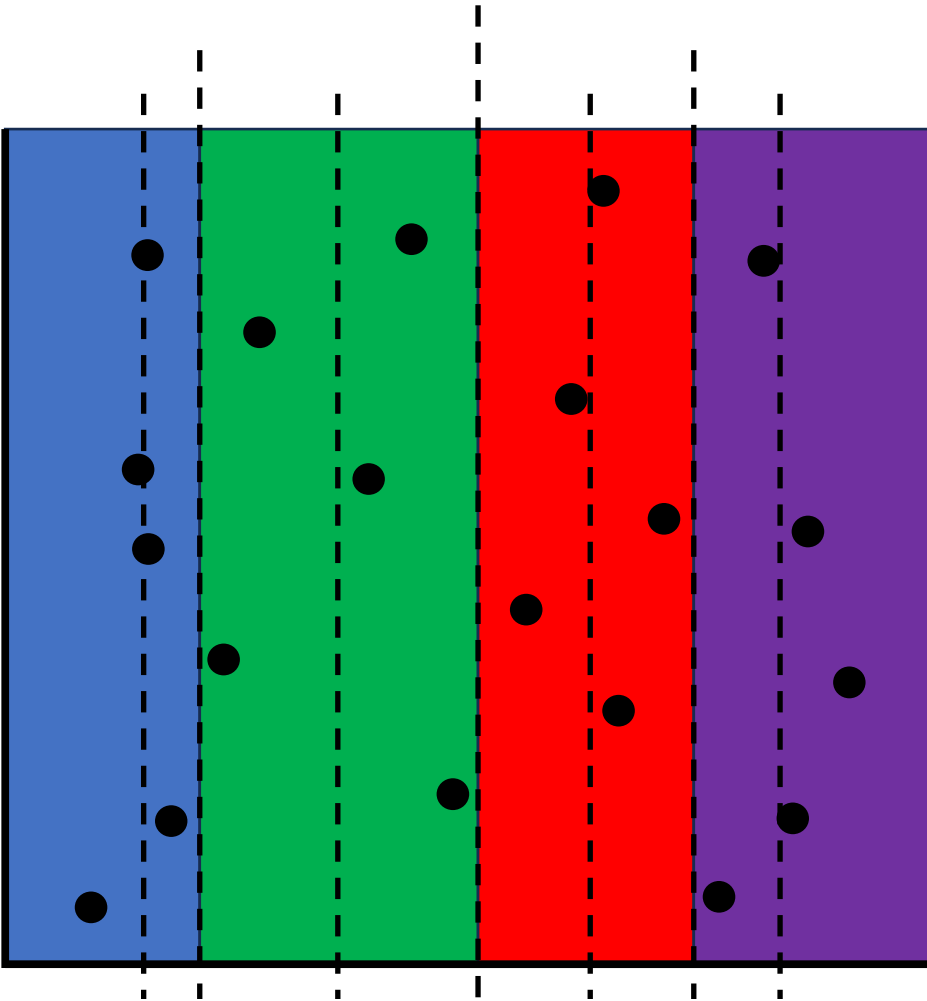


Recursive Process:

1. Divide points in half.
2. Repeat step 1 until there are only one or two points on each side.
3. Combine left and right sides to find closest of subproblems.

Recursively find closest pairs on each side.

# Closest Pair Problem – Divide and Conquer



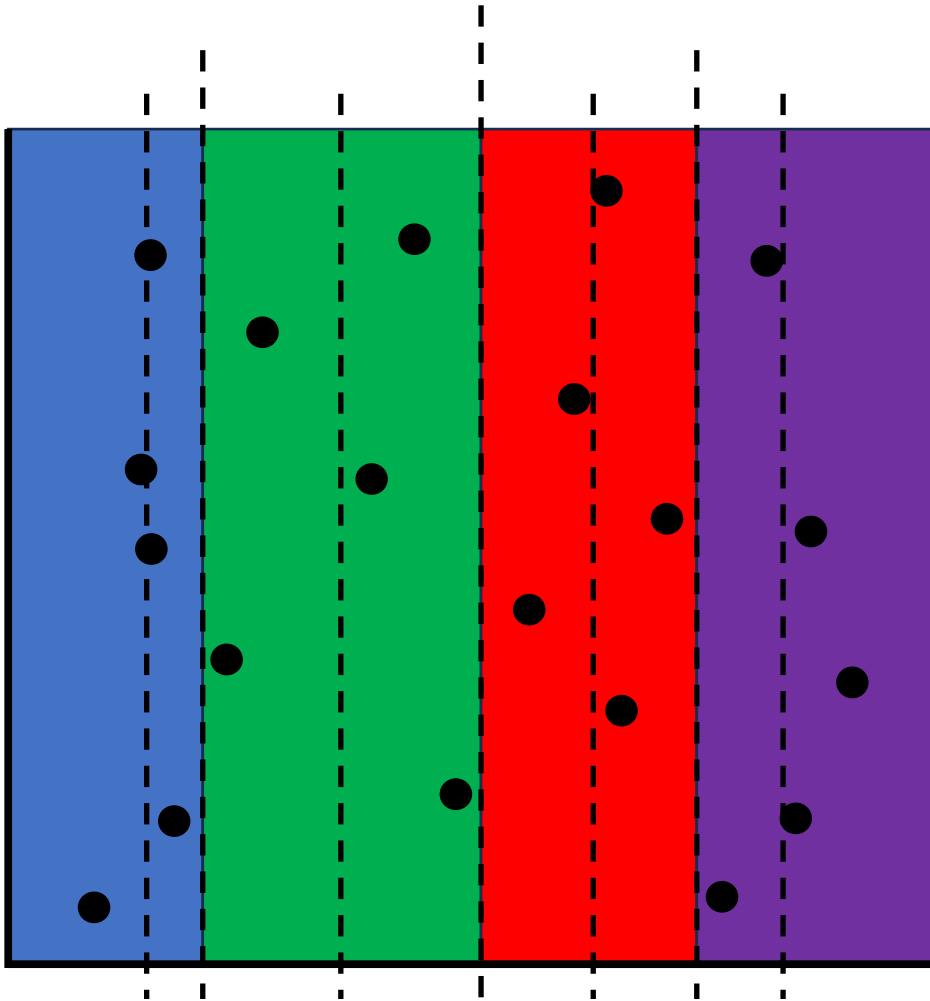
Recursive Process:

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3. Combine left and right sides to find closest of subproblems.

Recursively find closest pairs on each side.



# Closest Pair Problem – Divide and Conquer

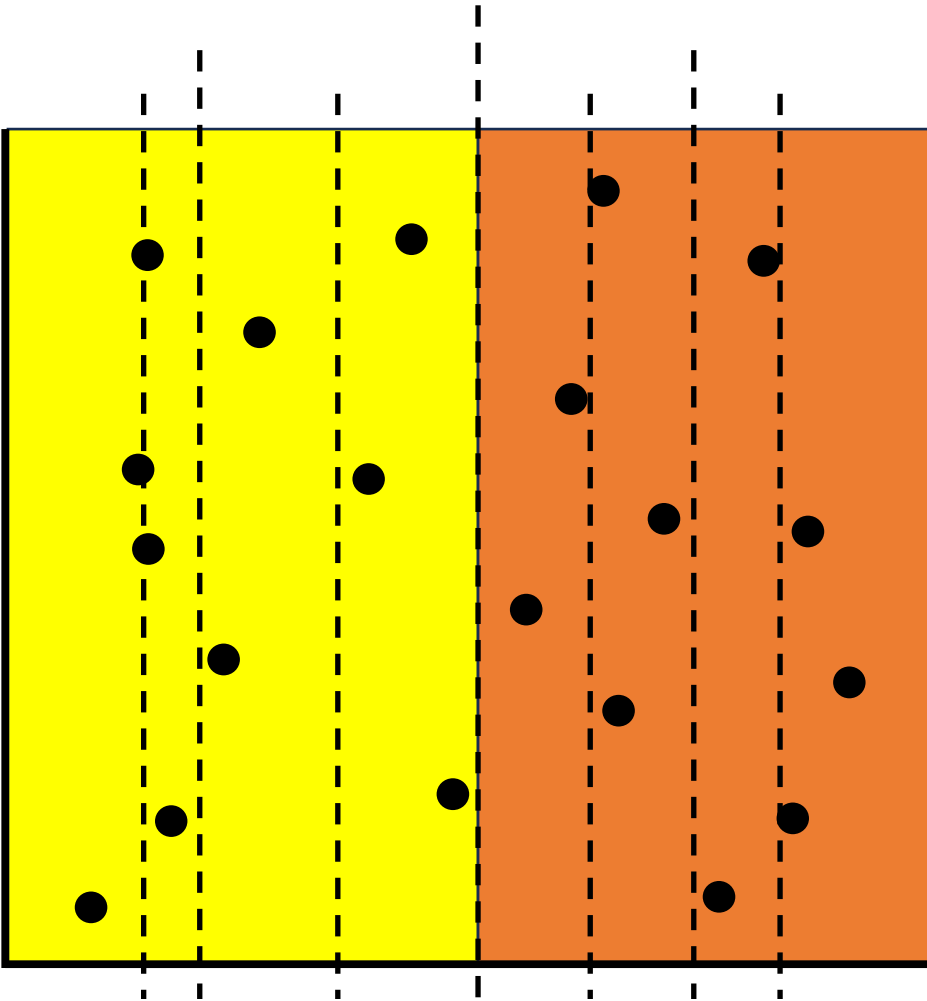


Recursive Process:

1. Divide points in half.
2. Repeat step 1 until there are only one or two points on each side.
3. Combine left and right sides to find closest of subproblems.
4. Repeat until initial division is combined.

Recursively find closest pairs on each side.

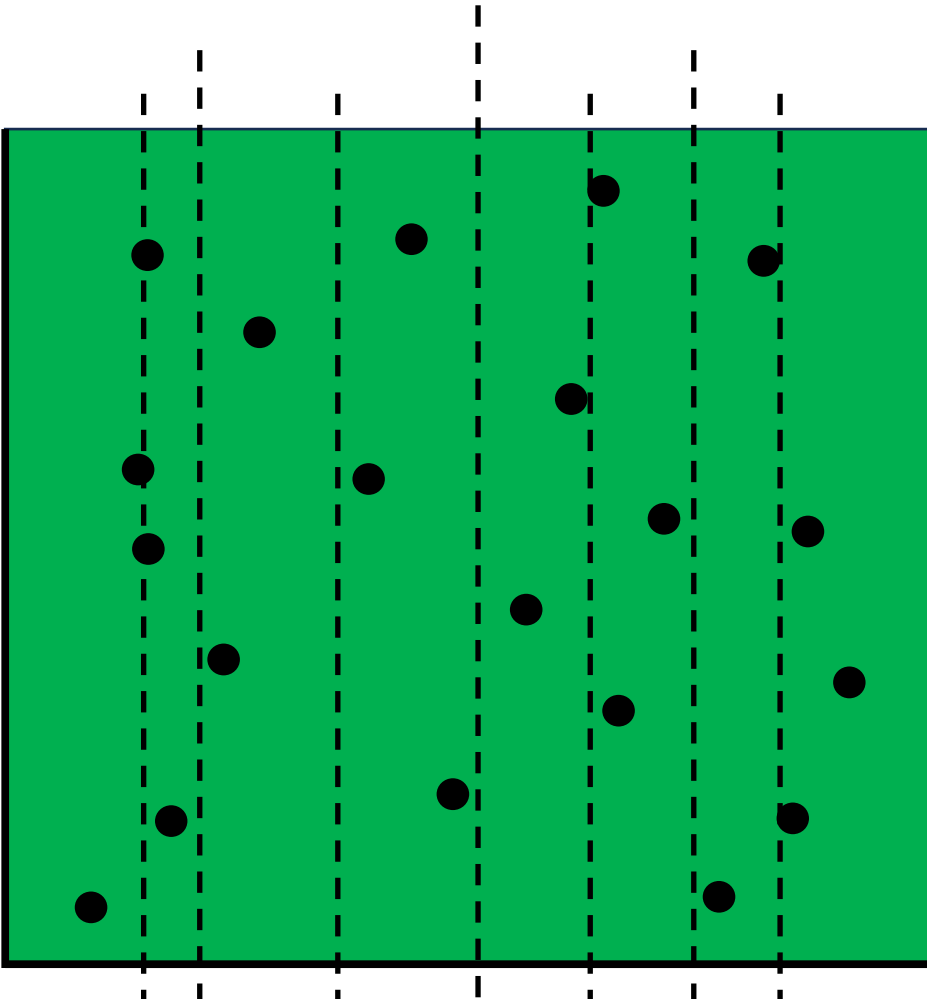
# Closest Pair Problem – Divide and Conquer



Recursive Process:

1. Divide points in half.
2. Repeat step 1 until there are only one or two points on each side.
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# Closest Pair Problem – Divide and Conquer



Recursive Process:

1. Divide points in half.
2. Repeat step 1 until there are only one or two points on each side.
3. Combine left and right sides to find closest of subproblems.
4. Repeat until initial division is combined.

# Closest Pair Problem – Algorithm

`findClosestPair( $P$ ):`

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .

2. **Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .**

$d_{\text{left}} = \text{findClosestPair}(P_{\text{left}})$   
 $d_{\text{right}} = \text{findClosestPair}(P_{\text{right}})$

3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .

4. Let  $S$  be straddle points within  $\delta$  of  $L$ .

5. Sort  $S$  by  $y$ -coord.

6. Compare points in  $S$  to next 11 points and update  $\delta$ .

7. Return  $\delta$ .

# Closest Pair Problem – Algorithm

`findClosestPair( $P$ ):`

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5. Sort  $S$  by  $y$ -coord.
6. Compare points in  $S$  to next 11 points and update  $\delta$ .
7. Return  $\delta$ .

Questions?

# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .
3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .
4. Let  $S$  be straddle points within  $\delta$  of  $L$ .
5. Sort  $S$  by  $y$ -coord.
6. Compare points in  $S$  to next 11 points and update  $\delta$ .
7. Return  $\delta$ .

Valid?

# Closest Pair Problem – Algorithm

`findClosestPair( $P$ ):`

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}$ ,  $P_{\text{right}}$ .
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .
3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .
4. Let  $S$  be straddle points within  $\delta$  of  $L$ .
5. Sort  $S$  by  $y$ -coord.
6. Compare points in  $S$  to next 11 points and update  $\delta$ .
7. Return  $\delta$ .

**Valid?**

It's returning the distance between two points in  $P$ .

# Closest Pair Problem – Algorithm

`findClosestPair( $P$ ):`

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .
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7. Return  $\delta$ .

Optimal?



# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}$ ,  $P_{\text{right}}$ .
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6. Compare points in  $S$  to next 11 points and update  $\delta$ .
7. Return  $\delta$ .

**Optimal?**

If there was a closer pair, they would have been compared on the left side, right side, or as a straddle point.

# Closest Pair Problem – Algorithm

`findClosestPair( $P$ ):`

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .
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6. Compare points in  $S$  to next 11 points and update  $\delta$ .
7. Return  $\delta$ .

Running Time?

# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}$ ,  $P_{\text{right}}$ .  **$O(n \log n)$**
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .
3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .
4. Let  $S$  be straddle points within  $\delta$  of  $L$ .
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# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .  **$O(n \log n)$**
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **TBD**
3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .
4. Let  $S$  be straddle points within  $\delta$  of  $L$ .
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# Closest Pair Problem – Algorithm

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# Closest Pair Problem – Algorithm

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# Closest Pair Problem – Algorithm

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# Closest Pair Problem – Algorithm

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# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

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# Closest Pair Problem – Algorithm

**findClosestPair( $P$ ):**

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .  $O(n \log n)$
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **TBD**
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5. Sort  $S$  by  $y$ -coord.  $O(n \log n)$
6. Compare points in  $S$  to next 11 points and update  $\delta$ .  $O(n)$
7. Return  $\delta$ .  $O(1)$

# Closest Pair Problem – Algorithm

`findClosestPair( $P$ ):`

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}$ ,  $P_{\text{right}}$ .  $O(n \log n)$
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **TBD**



How much work is  
done at the first level?

# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .  **$O(n \log n)$**
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# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}$ ,  $P_{\text{right}}$ .  $O(n \log n)$
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **TBD**

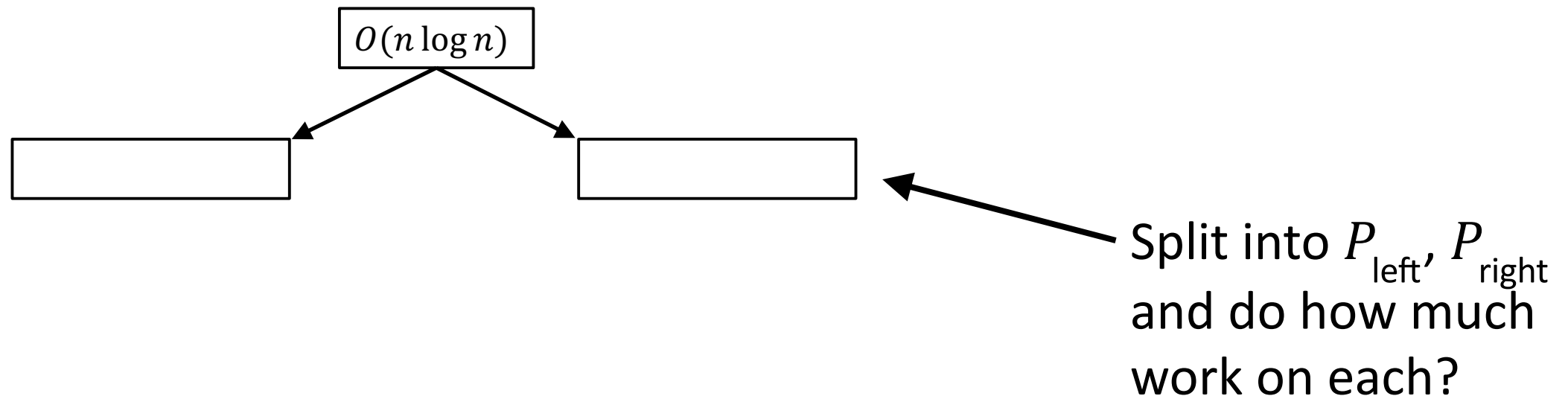
$O(n \log n)$

How much work is  
done at the first level?

# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

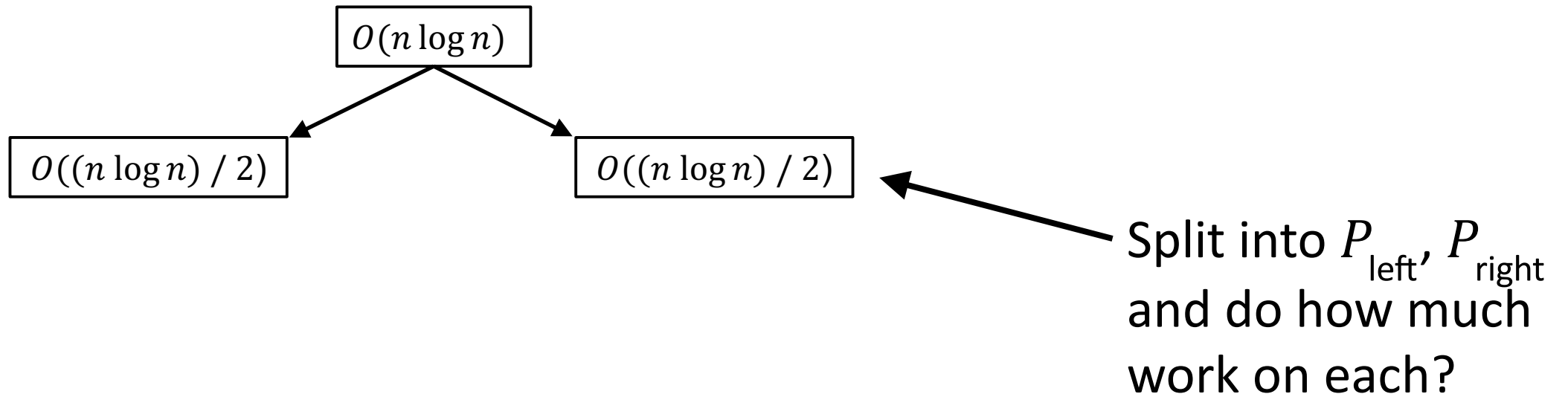
1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .  $O(n \log n)$
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **TBD**



# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

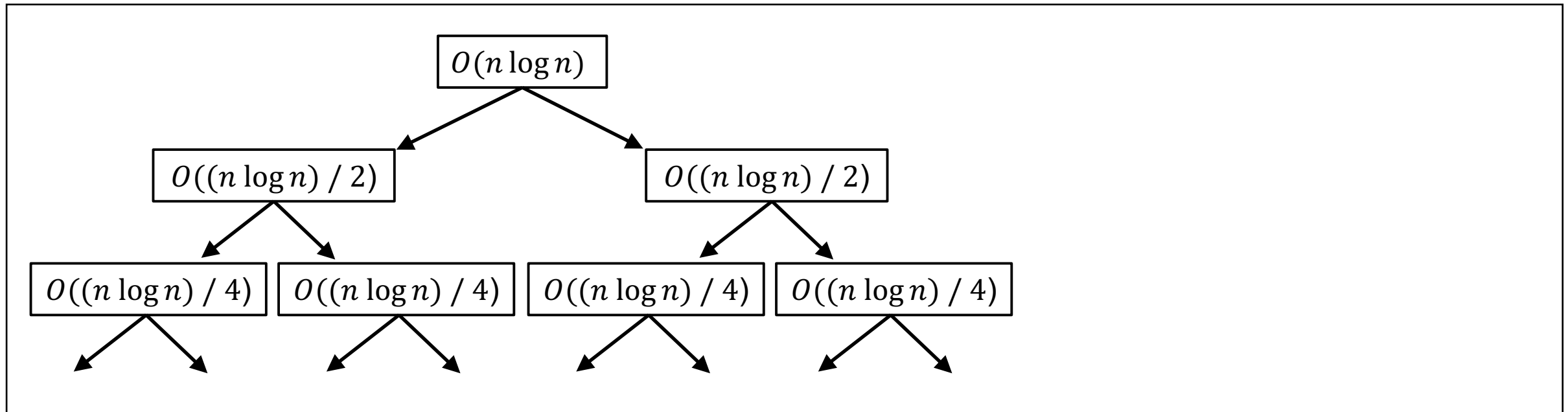
1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .  $O(n \log n)$
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **TBD**



# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}$ ,  $P_{\text{right}}$ .  $O(n \log n)$
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **TBD**

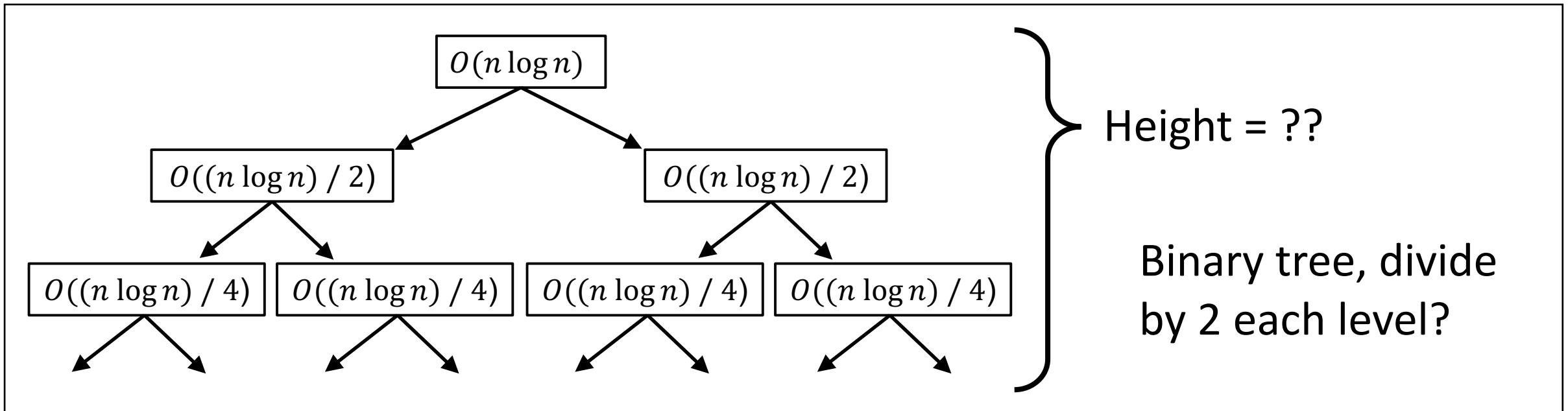




# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

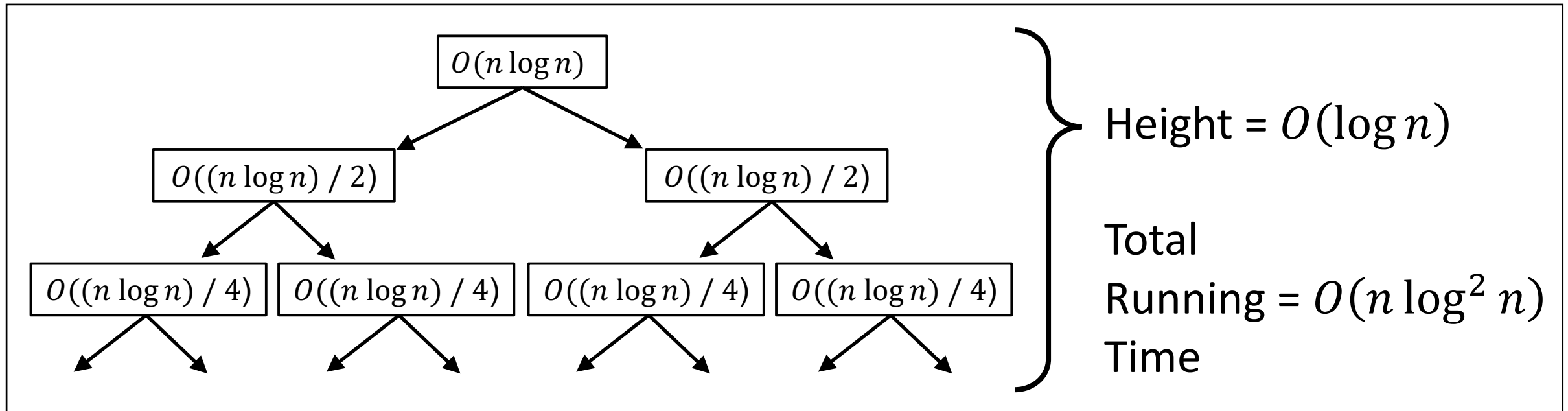
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2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **TBD**



# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

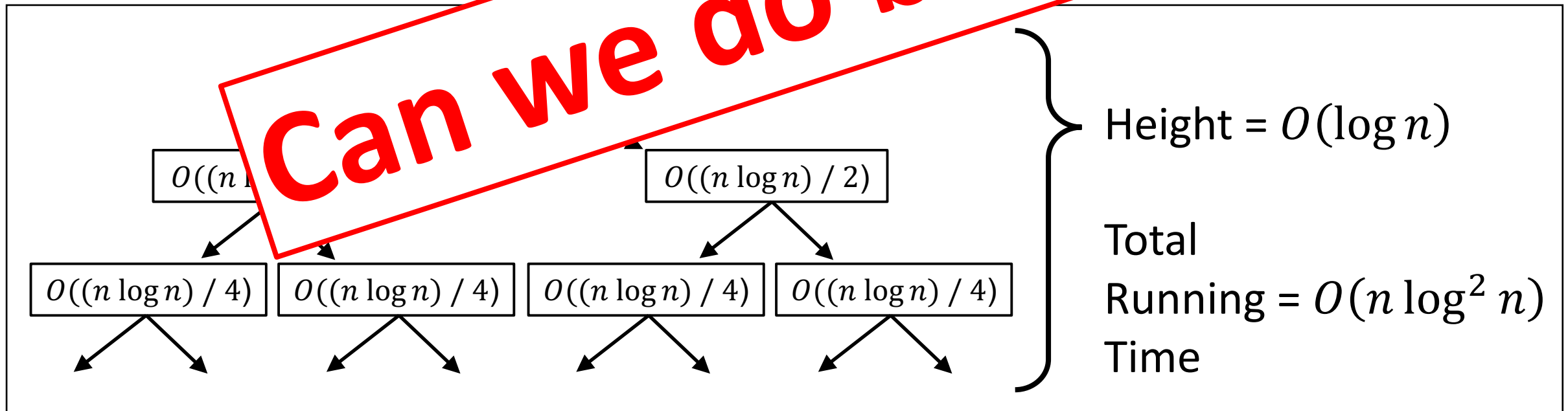
1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .  $O(n \log n)$
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **TBD**



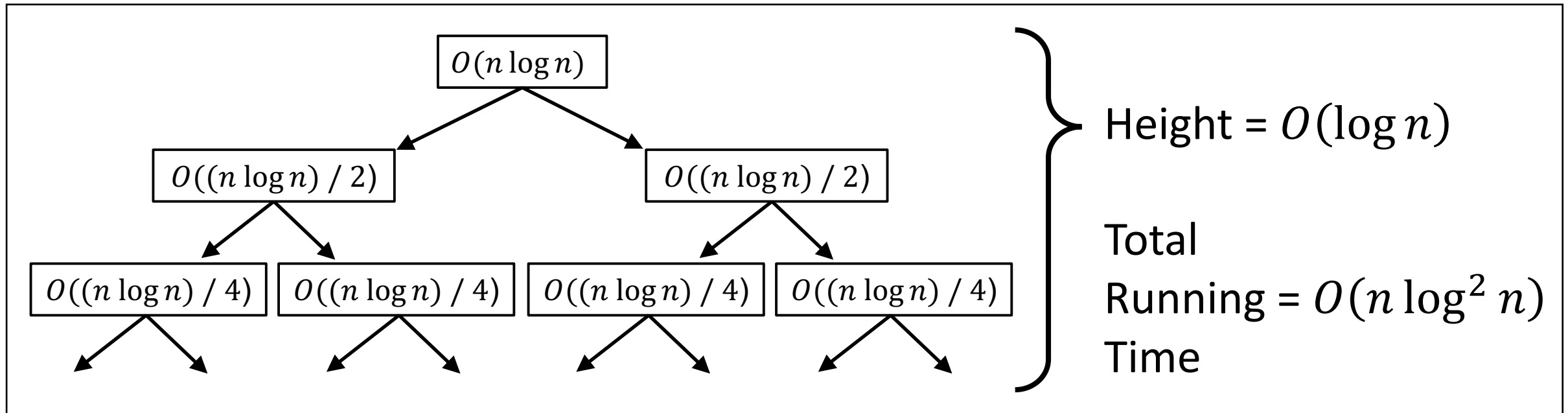
# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P$  ( $O(n \log n)$ )
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$



# Closest Pair Problem – Algorithm



Option 1: (Significantly) Reduce the height of the recursion tree.

Option 2: (Significantly) Reduce the amount of work done at each level.

# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

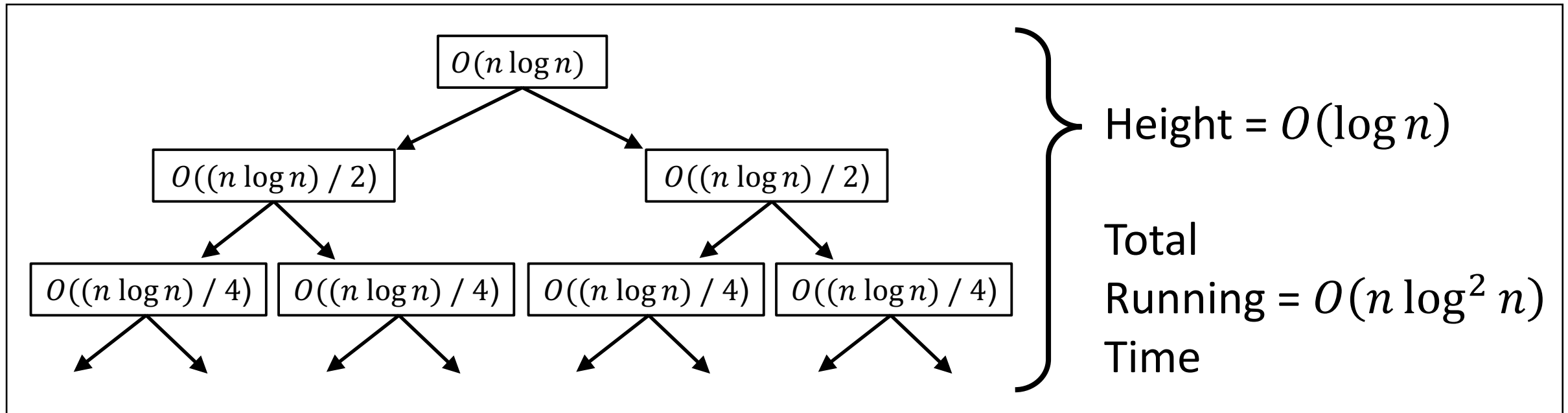
1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .  **$O(n \log n)$**
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .
3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .  **$O(1)$**
4. Let  $S$  be straddle points within  $\delta$  of  $L$ .  **$O(n)$**
5. Sort  $S$  by  $y$ -coord.  **$O(n \log n)$**
6. Compare points in  $S$  to next 11 points and update  $\delta$ .  **$O(n)$**
7. Return  $\delta$ .  **$O(1)$**

# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .  **$O(n \log n)$**
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ . **Maybe we don't need to sort so often??**
3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .  **$O(1)$**
4. Let  $S$  be straddle points within  $\delta$  of  $L$ .  **$O(n)$**
5. Sort  $S$  by  $y$ -coord.  **$O(n \log n)$**
6. Compare points in  $S$  to next 11 points and update  $\delta$ .  **$O(n)$**
7. Return  $\delta$ .  **$O(1)$**

# Closest Pair Problem – Algorithm



Plan:

- Presort by  $x$ -coordinate ( $X$ )
- Presort by  $y$ -coordinate ( $Y$ )
- Split  $X$  and  $Y$  by comparing to  $L$ .

# Closest Pair Problem – Algorithm

findClosestPair( $P$ ):

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}, P_{\text{right}}$ .  **$O(n \log n)$**
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .
3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .  **$O(1)$**
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7. Return  $\delta$ .  **$O(1)$**



# Closest Pair Problem – Algorithm

0. Sort points by  $x$ -coordinate ( $X$ ) and  $y$ -coordinate ( $Y$ ).

`findClosestPair( $P$ ):`

1. Sort points by  $x$ -coord, find  $L$ , make  $P_{\text{left}}$ ,  $P_{\text{right}}$ .  **$O(n \log n)$**
2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .
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2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .

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4. Let  $S$  be straddle points within  $\delta$  of  $L$ .  **$O(n)$**

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findClosestPair( $P$ ):

1. ~~Sort points by  $x$  coord~~, find  $L$ , split  $X, Y$ .  **$O(n)$**

2. Determine  $d_{\text{left}}$  and  $d_{\text{right}}$ .

3. Let  $\delta = \min(d_{\text{left}}, d_{\text{right}})$ .  **$O(1)$**

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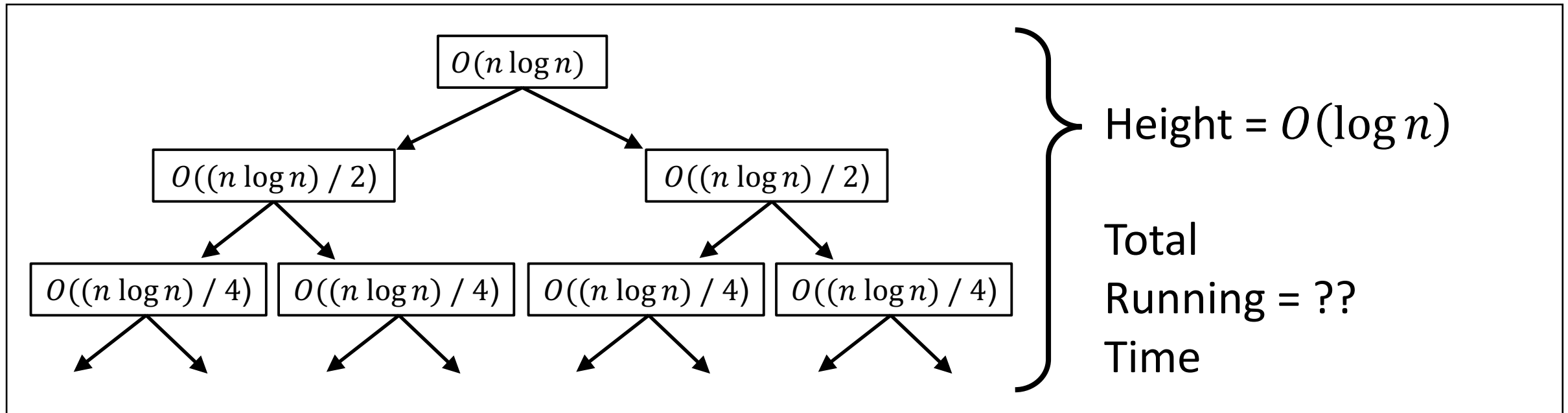
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# Closest Pair Problem – Algorithm

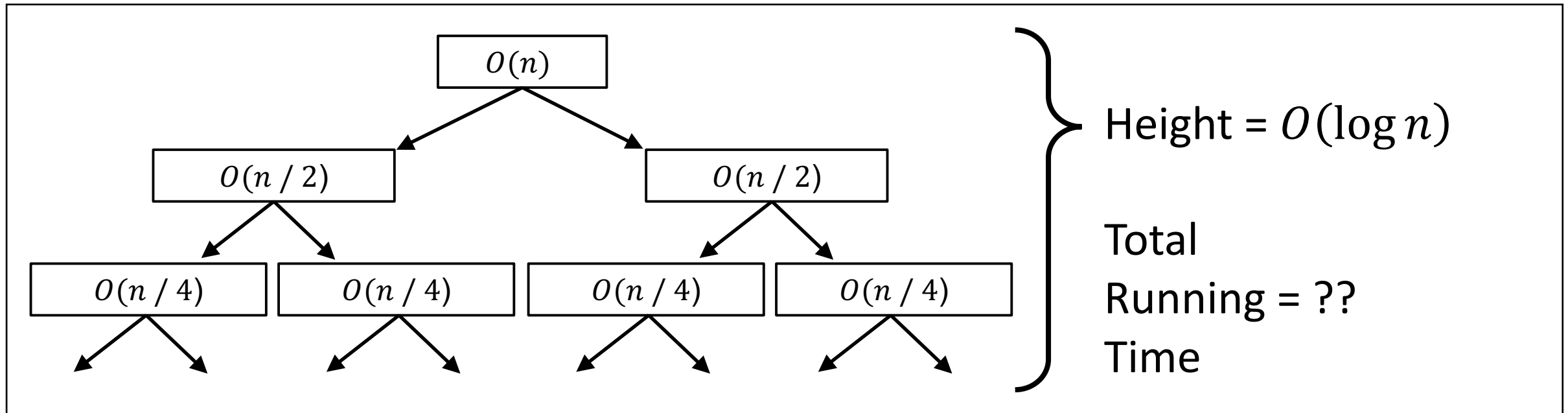


Plan:

- Presort by  $x$ -coordinate ( $X$ )
- Presort by  $y$ -coordinate ( $Y$ )
- Split  $X$  and  $Y$  by comparing to  $L$ .



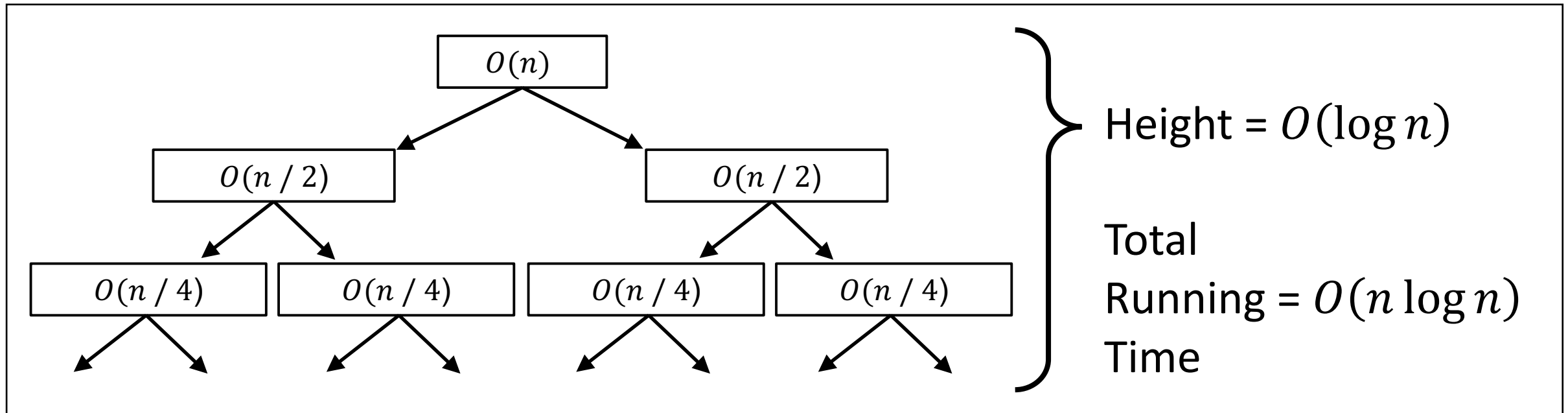
# Closest Pair Problem – Algorithm



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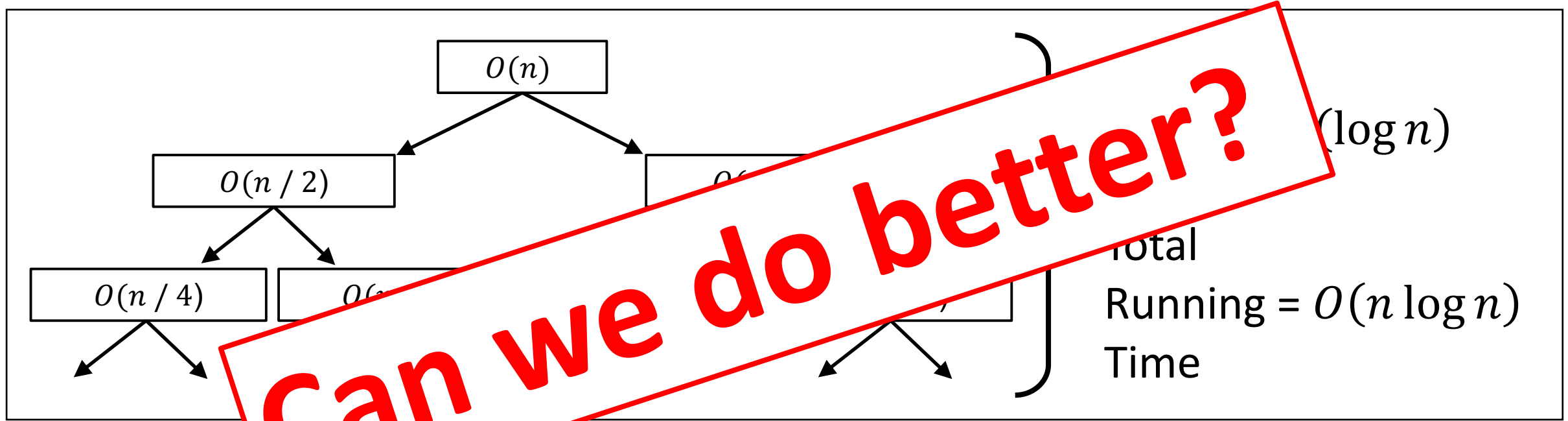
# Closest Pair Problem – Algorithm



Plan:

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# Closest Pair Problem – Algorithm



Plan:

- Presort by  $x$ -coordinate ( $X$ )
- Presort by  $y$ -coordinate ( $Y$ )
- Split  $X$  and  $Y$  by comparing to  $L$ .

# Dynamic Programming

Trick-or-treat planning.



# Dynamic Programming

Trick-or-treating at the red house, blue house, and green house are the fewest stops you need to fill your 25-pound capacity sack.



# Dynamic Programming

Trick-or-treating at the red house, blue house, and green house are the fewest stops you need to fill your 25-pound capacity sack. The blue house gives you 5 pounds of candy. What can you conclude?



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The red house and the green house are the fewest stops you need to get 20+ pounds of candy.



# Dynamic Programming

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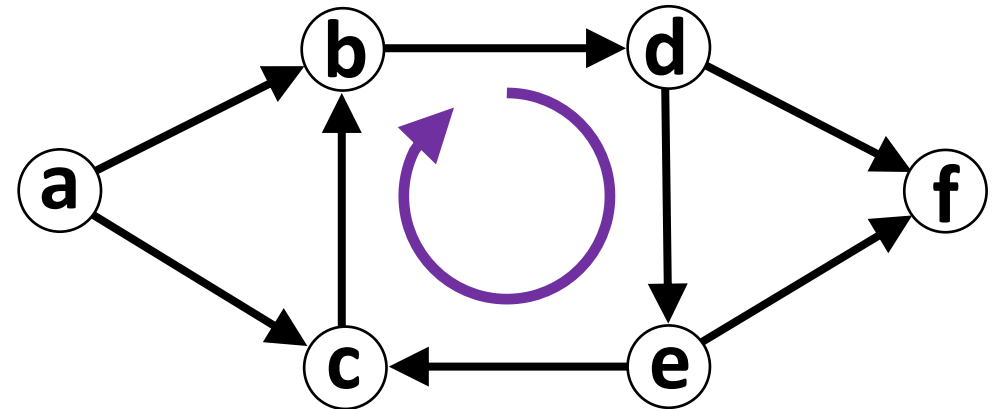
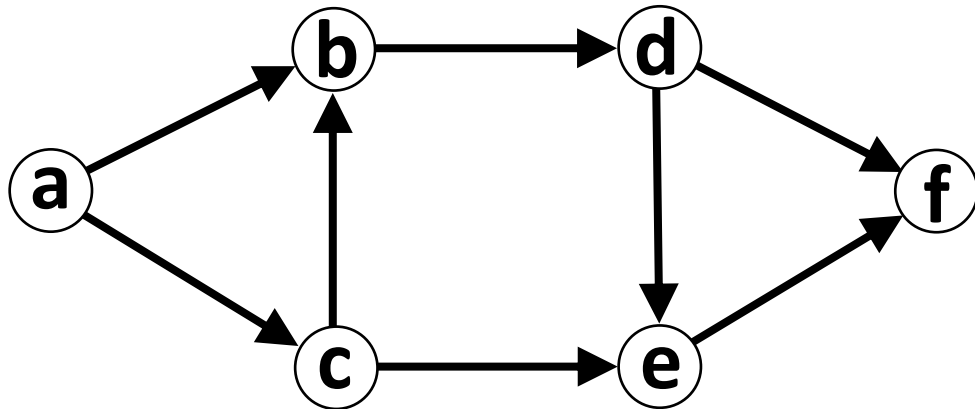
**A problem exhibits optimal substructure if removing part of an optimal solution results in an optimal solution to a smaller problem.**

Central tenant of Dynamic Programming: Leverage optimal sub-structure.



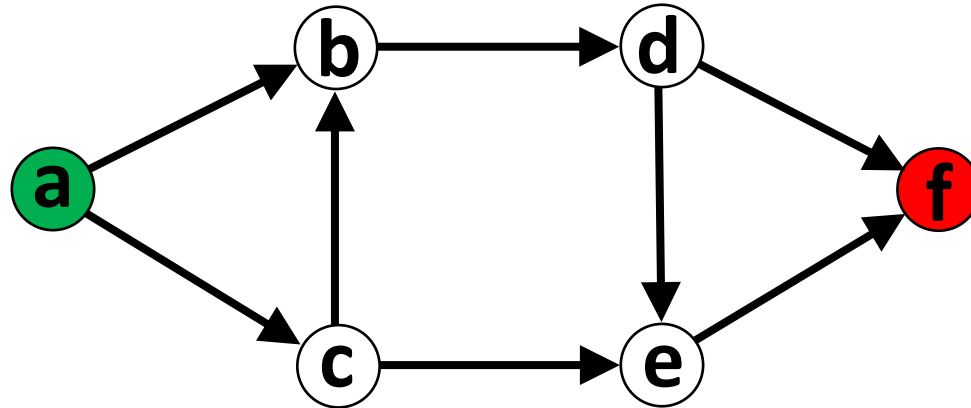
# Directed Acyclic Graph (DAG)

Directed Acyclic Graph (DAG) = Directed graph with no cycles.



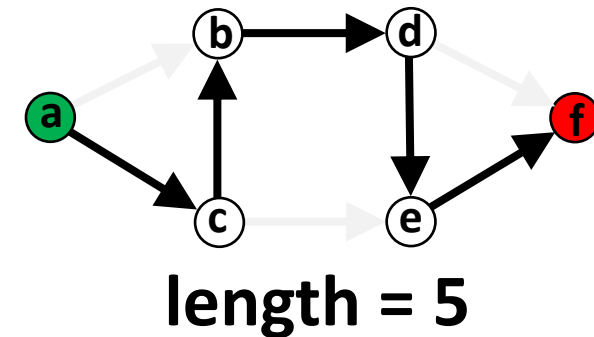
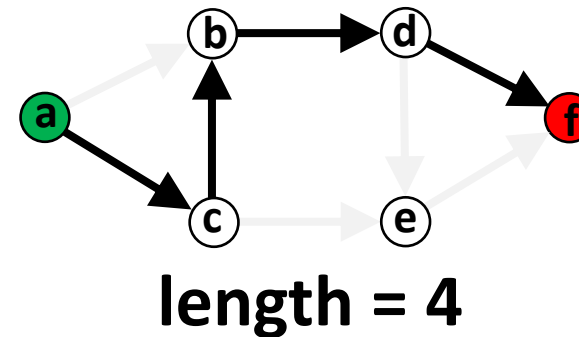
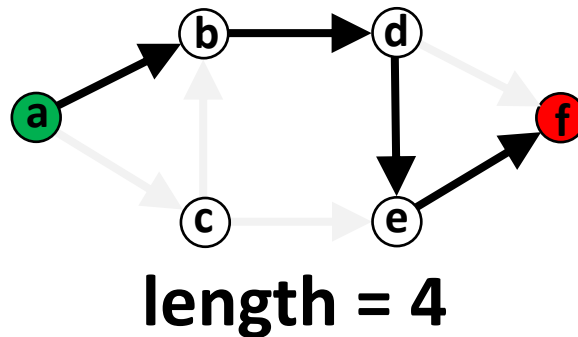
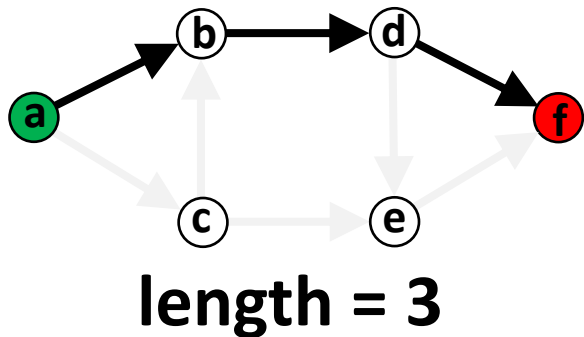
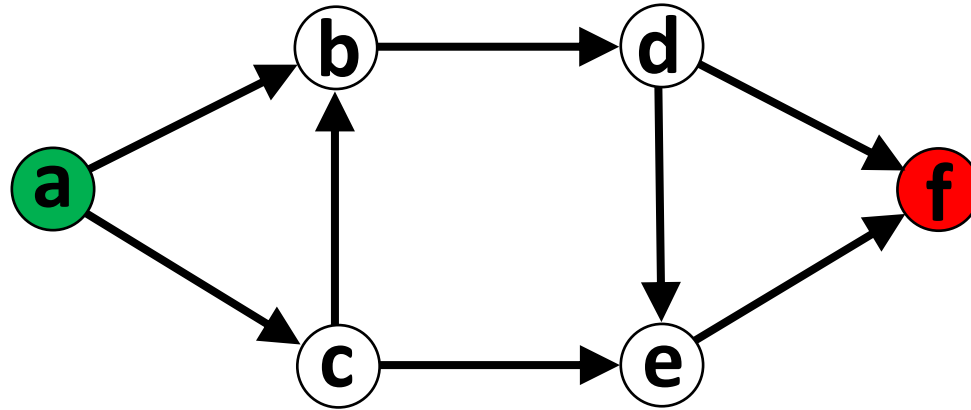
# Longest Path in a DAG

Given a DAG, find the longest path between any two vertices in the graph.



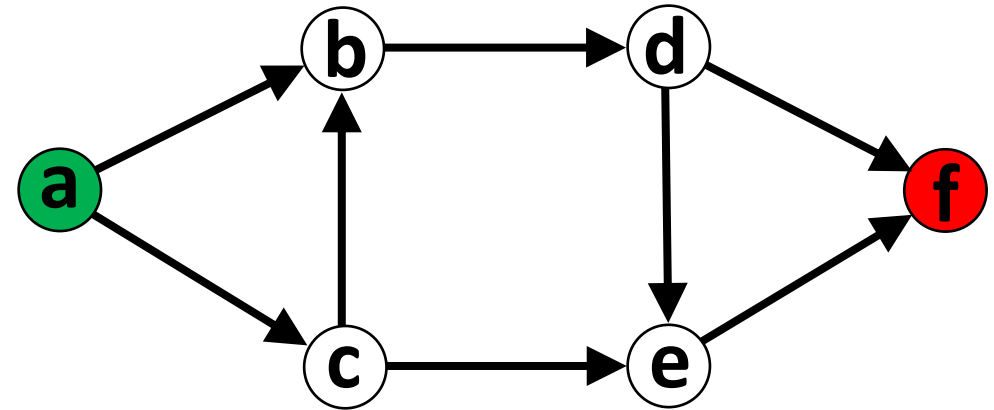
# Longest Path in a DAG

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# Find the Longest Path in a DAG

Task	Description	Duration
a	Select location	2 days
b	Get permits	4 days
c	Select date/time	1 day
d	Hire vendors	2 days
e	Make flyers	1 day
f	Market event	1 day

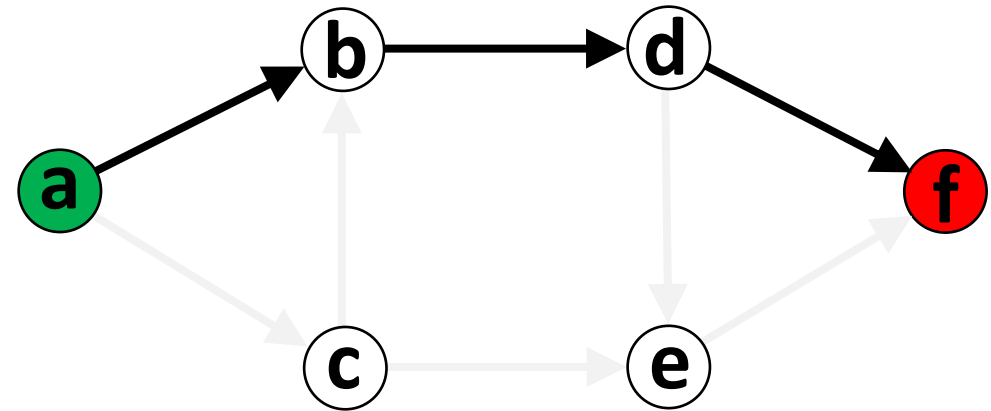


Critical Path: Sequence of dependent tasks that determines the minimum time to complete project.

# Find the Longest Path in a DAG

Task	Description	Duration
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Length = 2 + 4 + 2 + 1 = 9 days

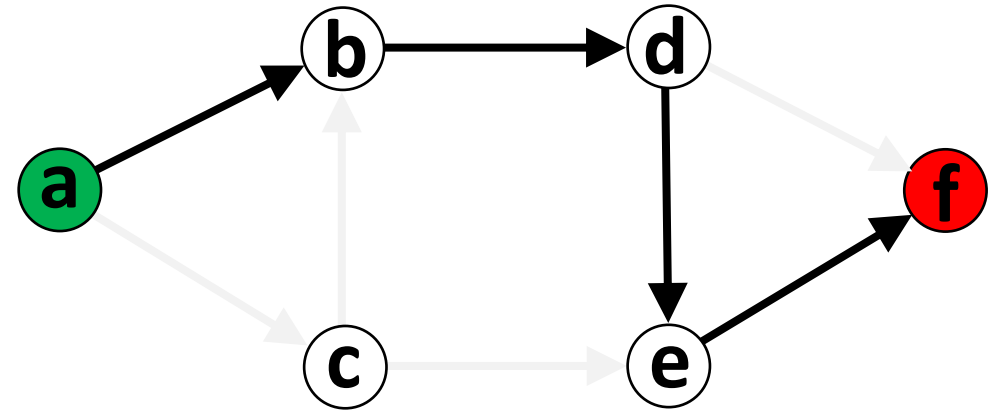


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Task	Description	Duration
a	Select location	2 days
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d	Hire vendors	2 days
e	Make flyers	1 day
f	Market event	1 day

**Length = 2 + 4 + 2 + 1 + 1 = 10 days**

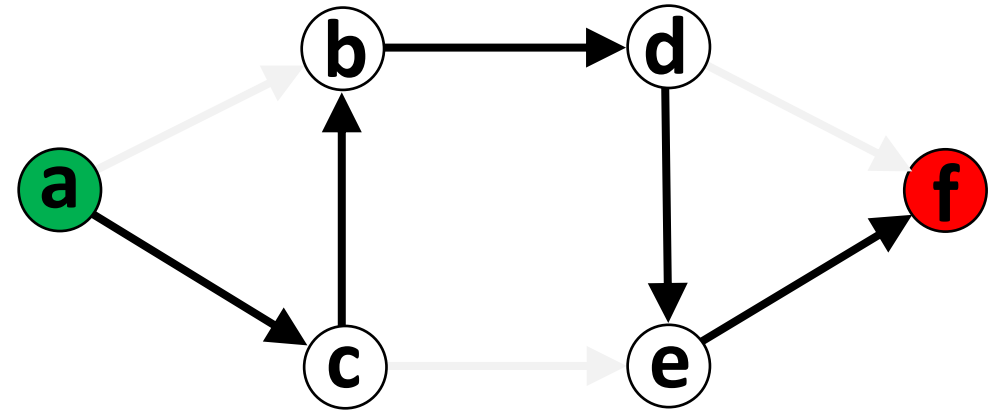


**Critical Path:** Sequence of dependent tasks that determines the minimum time to complete project.

# Find the Longest Path in a DAG

Task	Description	Duration
a	Select location	2 days
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**Length = 2 + 1 + 4 + 2 + 1 + 1 = 11 days**

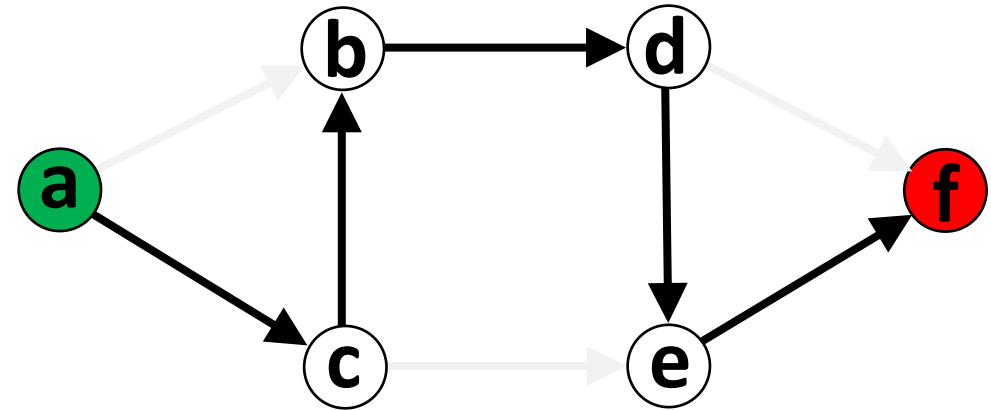


**Critical Path:** Sequence of dependent tasks that determines the minimum time to complete project.

# Find the Longest Path in a DAG

Task	Description	Duration
a	Select location	2 days
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d	Hire vendors	2 days
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f	Market event	1 day

**Length = 2 + 1 + 4 + 2 + 1 + 1 = 11 days**



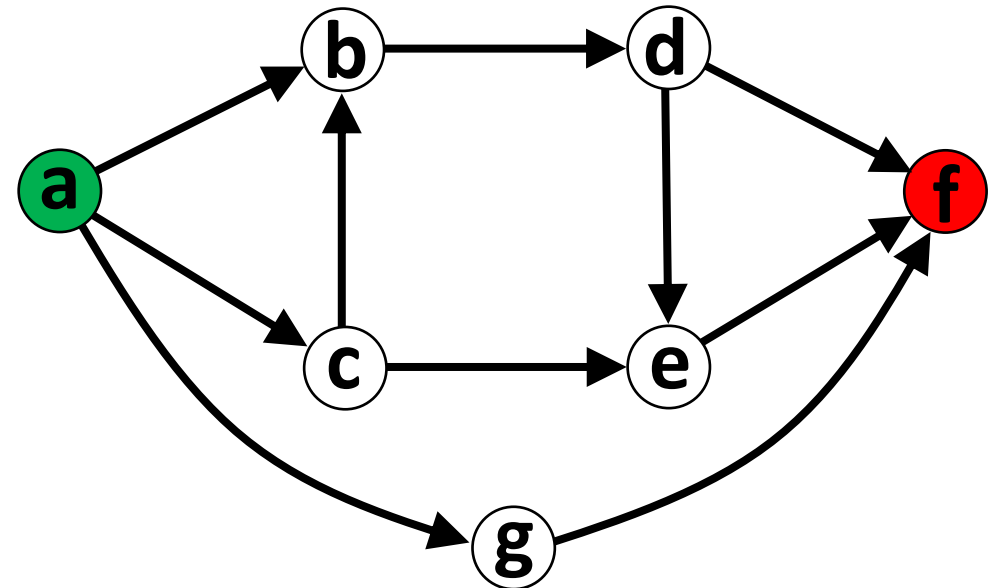
Critical Path: Sequence of dependent tasks that determines the minimum time to complete project.

**If any task on critical path is delayed, project is delayed.**



# Find the Longest Path in a DAG

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a	Select location	2 days
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c	Select date/time	1 day
d	Hire vendors	2 days
e	Make flyers	1 day
f	Market event	1 day
g	Photograph venue	1 day



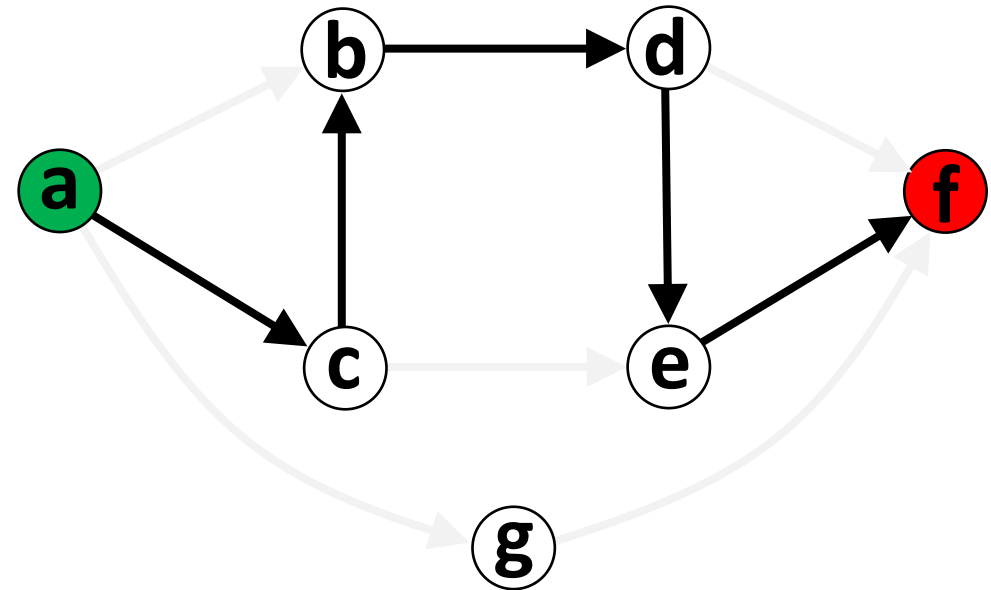
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f	Market event	1 day
g	Photograph venue	1 day

**Length = 2 + 1 + 4 + 2 + 1 + 1 = 11 days**



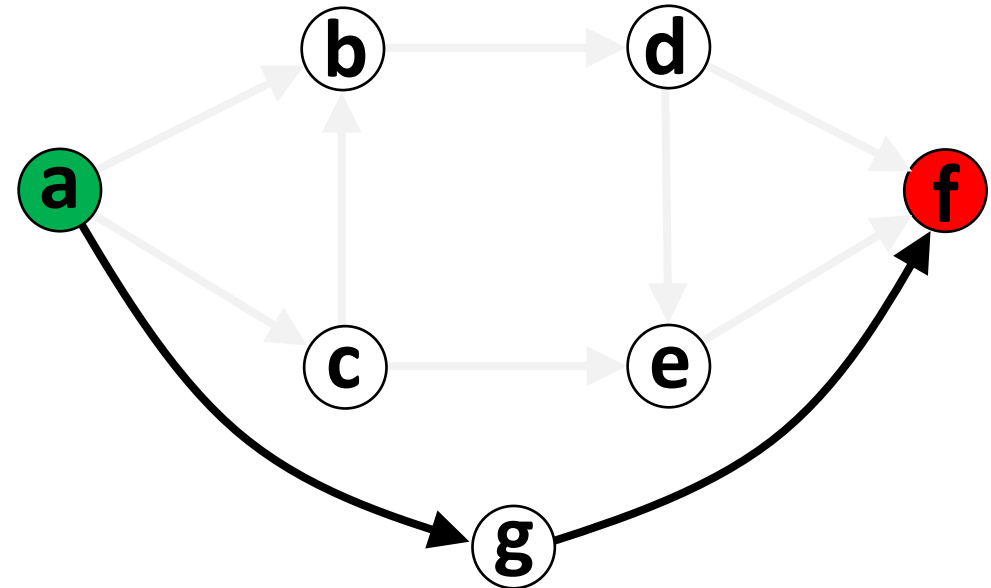
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# Find the Longest Path in a DAG

Task	Description	Duration
a	Select location	2 days
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c	Select date/time	1 day
d	Hire vendors	2 days
e	Make flyers	1 day
f	Market event	1 day
g	Photograph venue	<b>10 days</b>

**Length = 2 + 10 + 1 = 13 days**



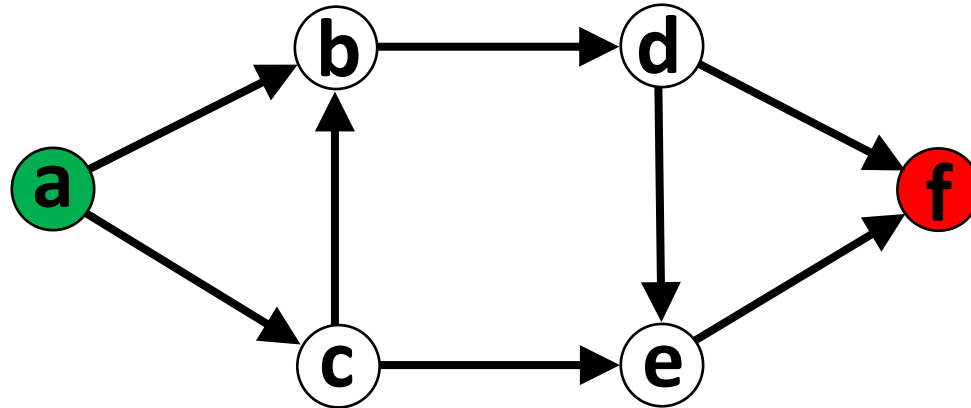
Critical Path: Sequence of dependent tasks that determines the minimum time to complete project.

**If any task on critical path is delayed, project is delayed.**

# Find the Longest Path in a DAG

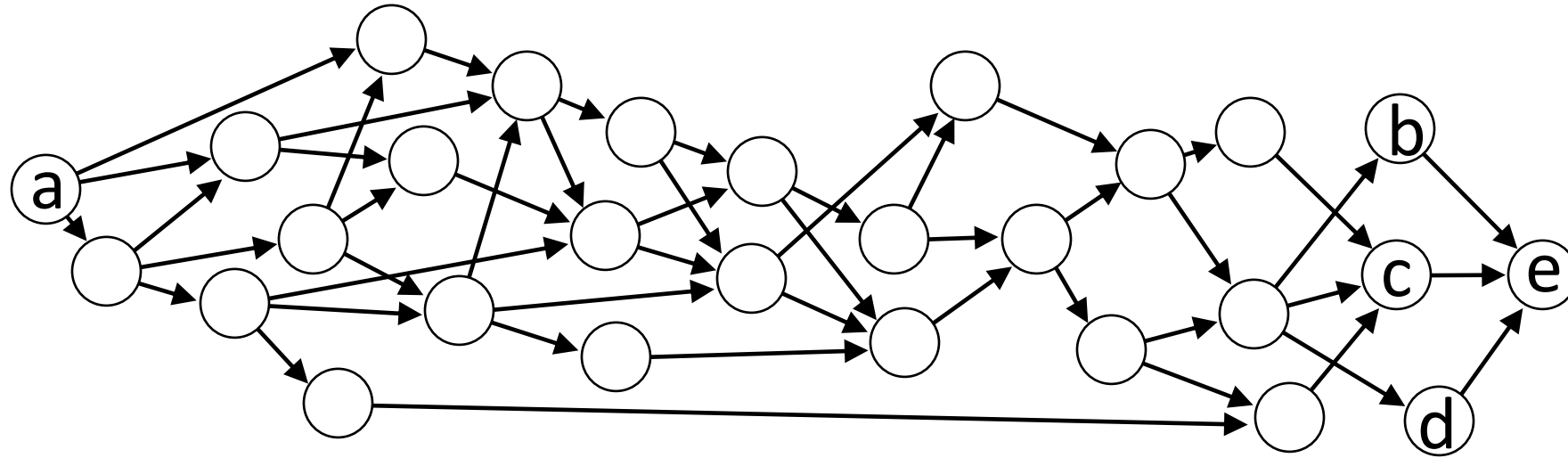
**Number of edges.**  
**No vertex weights.**

Given a DAG, find the longest path between any two vertices in the graph.



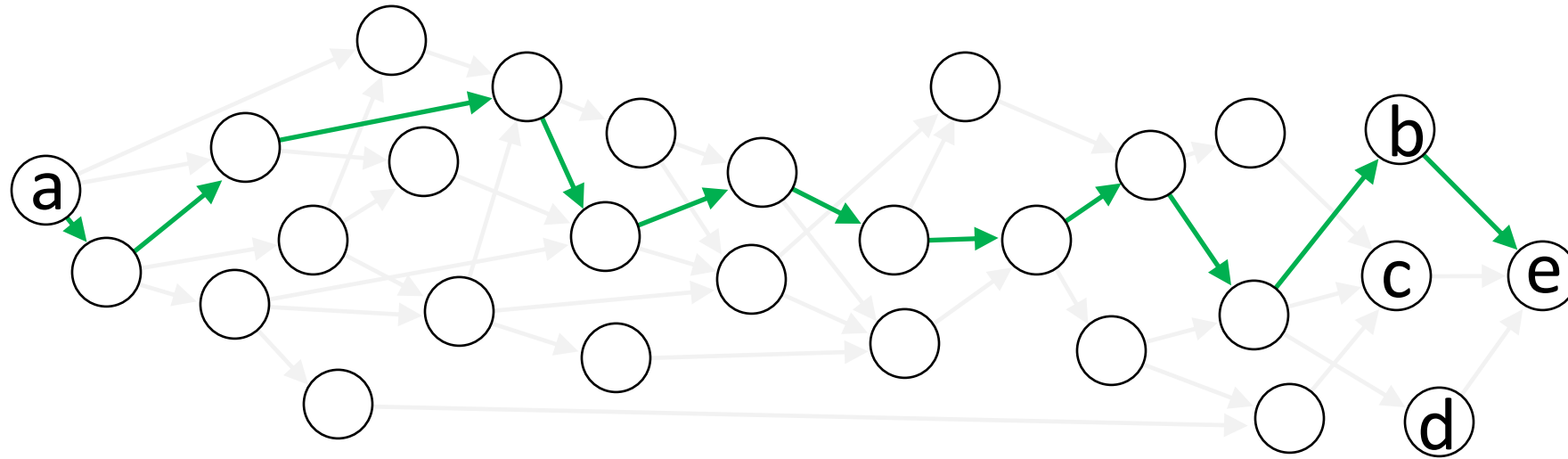
How do we do this?

# Find the Longest Path in a DAG



Interesting observations?

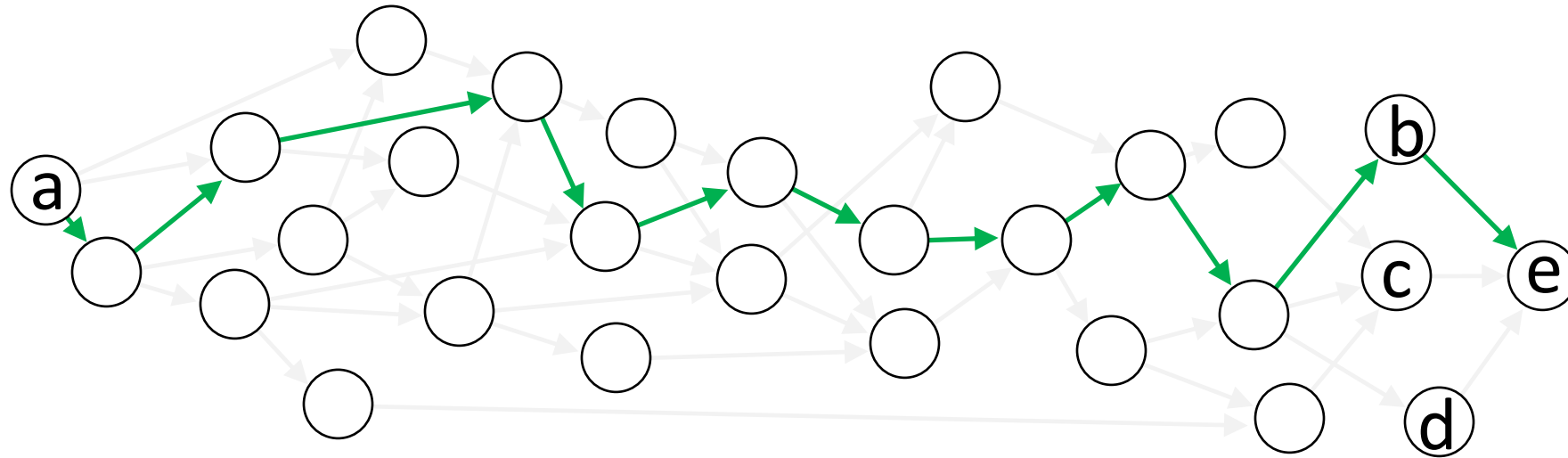
# Find the Longest Path in a DAG



Interesting observations?

If the longest path goes from **a** to **e** and passes through **b**, what could we say about the part of that path to **b**?

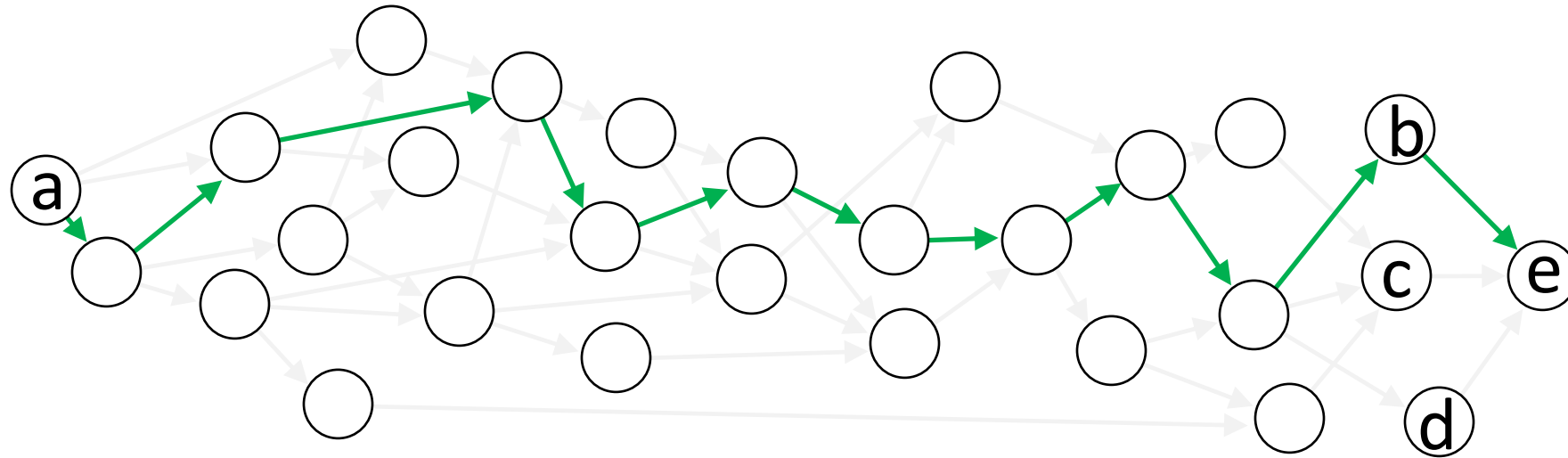
# Find the Longest Path in a DAG



Interesting observations?

If the longest path goes from **a** to **e** and passes through **b**, that must be the longest path that ends at **b**.

# Find the Longest Path in a DAG

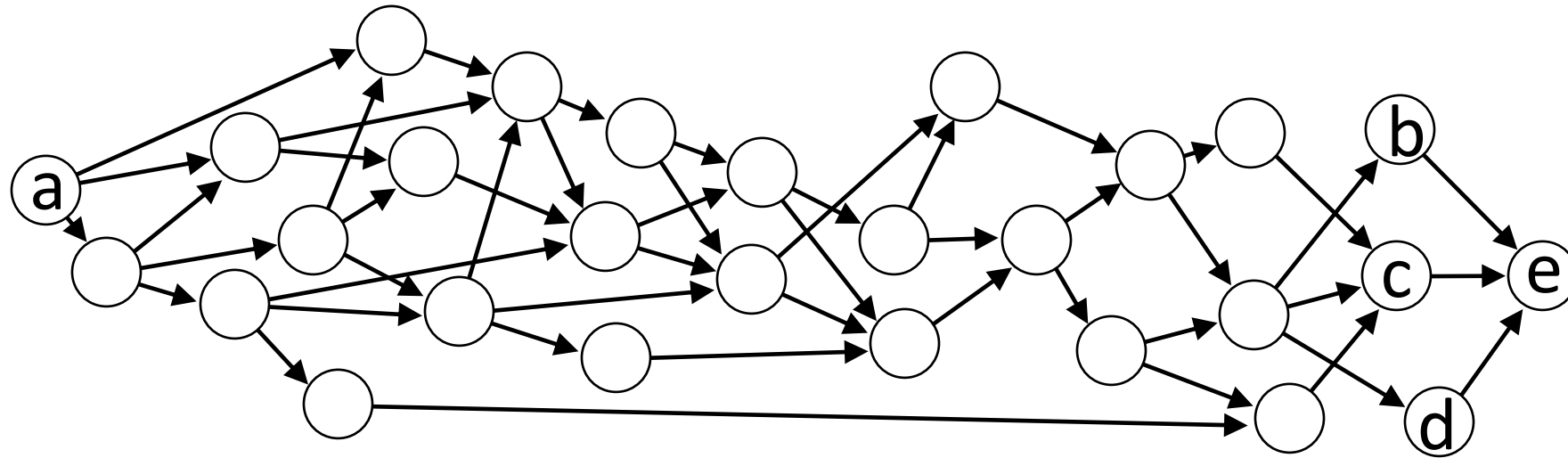


Interesting observations?

If the longest path goes from **a** to **e** and passes through **b**, that must be the longest path that ends at **b**. If not, then we could make a longer path.



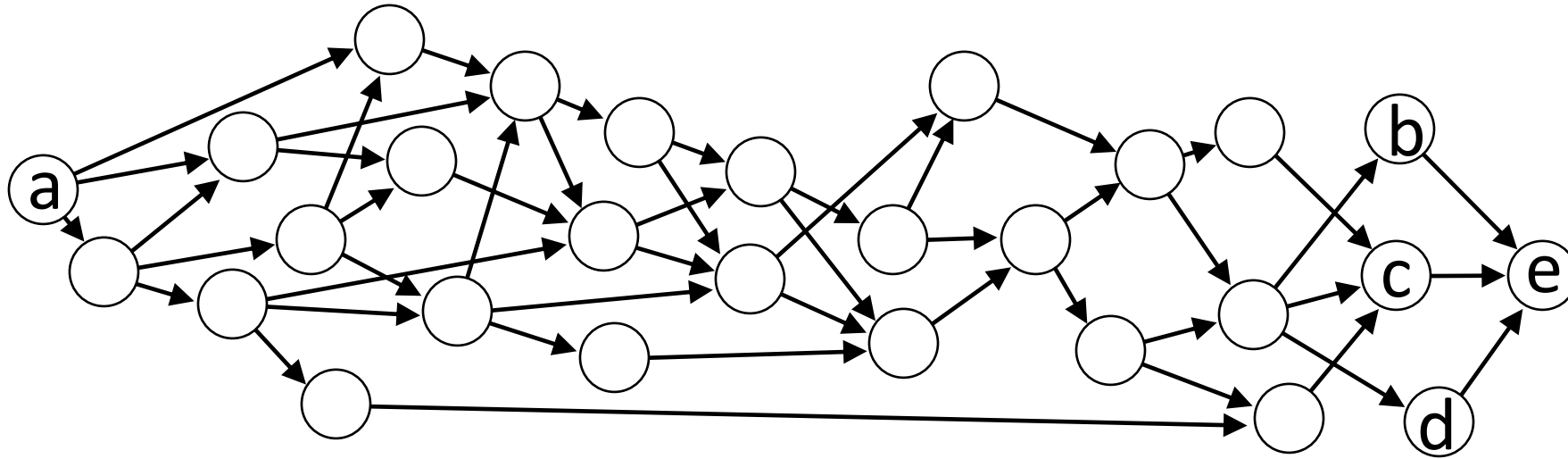
# Find the Longest Path in a DAG



Interesting observations?

The longest path to e = ??

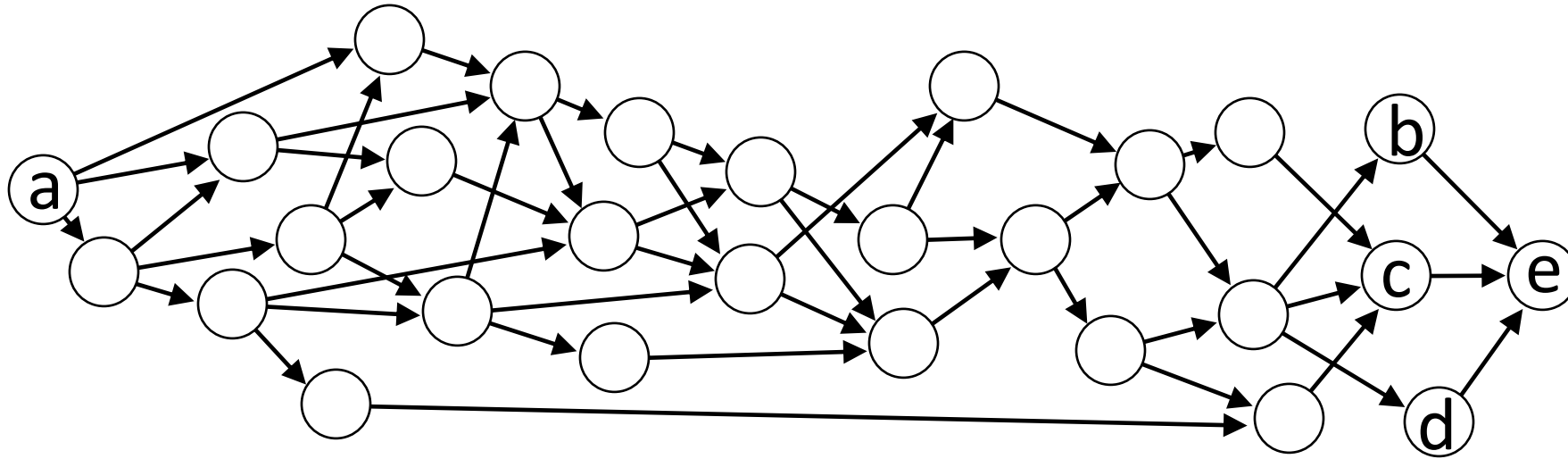
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Interesting observations?

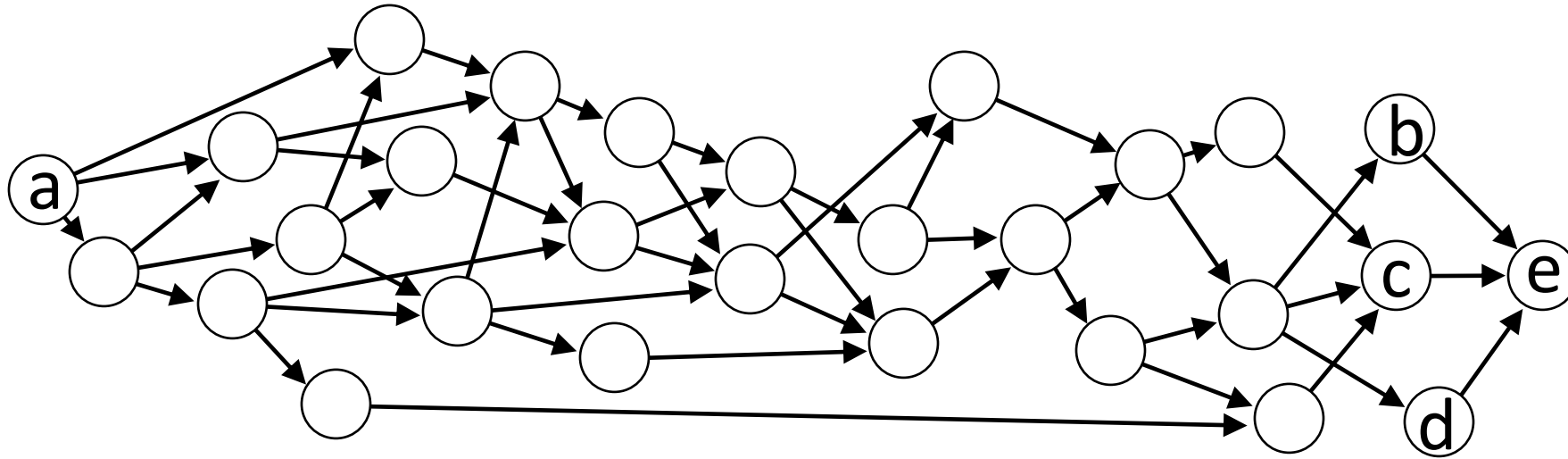
$$\text{The longest path to } e = \max \begin{pmatrix} \text{longest path to } b \\ \text{longest path to } c \\ \text{longest path to } d \end{pmatrix} + 1$$

# Find the Longest Path in a DAG



$$\text{longest path to e} = \max \begin{pmatrix} \text{longest path to b} \\ \text{longest path to c} \\ \text{longest path to d} \end{pmatrix} + 1$$

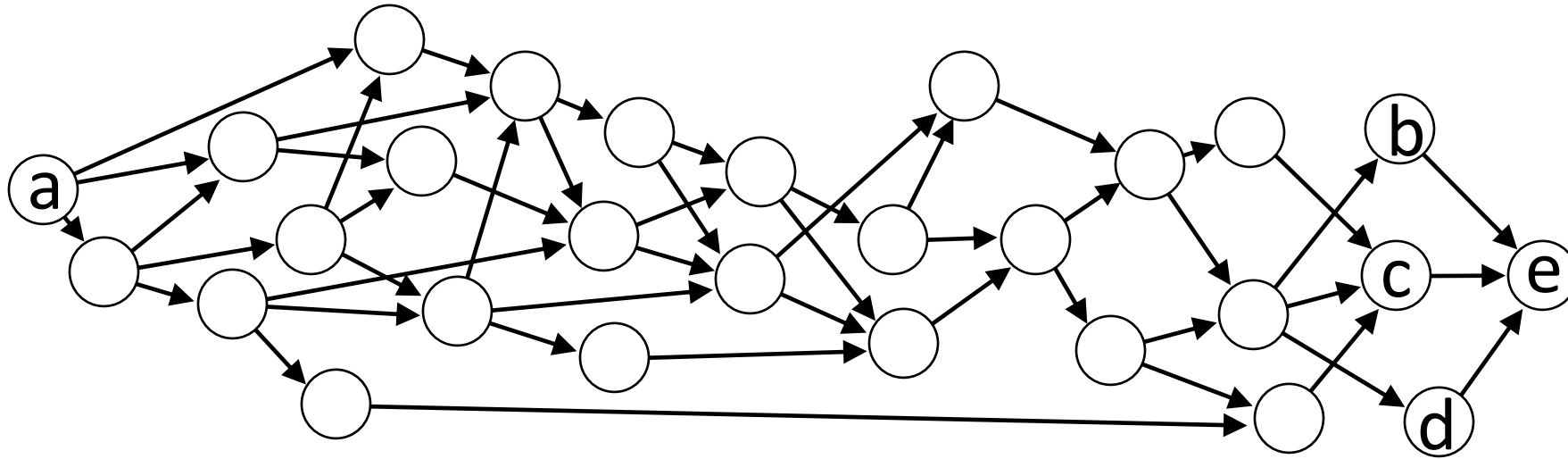
# Find the Longest Path in a DAG



When are we ready to calculate  
the longest path to e?

$$\text{longest path to e} = \max \begin{pmatrix} \text{longest path to b} \\ \text{longest path to c} \\ \text{longest path to d} \end{pmatrix} + 1$$

# Find the Longest Path in a DAG



When are we ready to calculate the longest path to e?

When we have the longest paths to b, c, and d.

$$\text{longest path to e} = \max \begin{pmatrix} \text{longest path to b} \\ \text{longest path to c} \\ \text{longest path to d} \end{pmatrix} + 1$$