

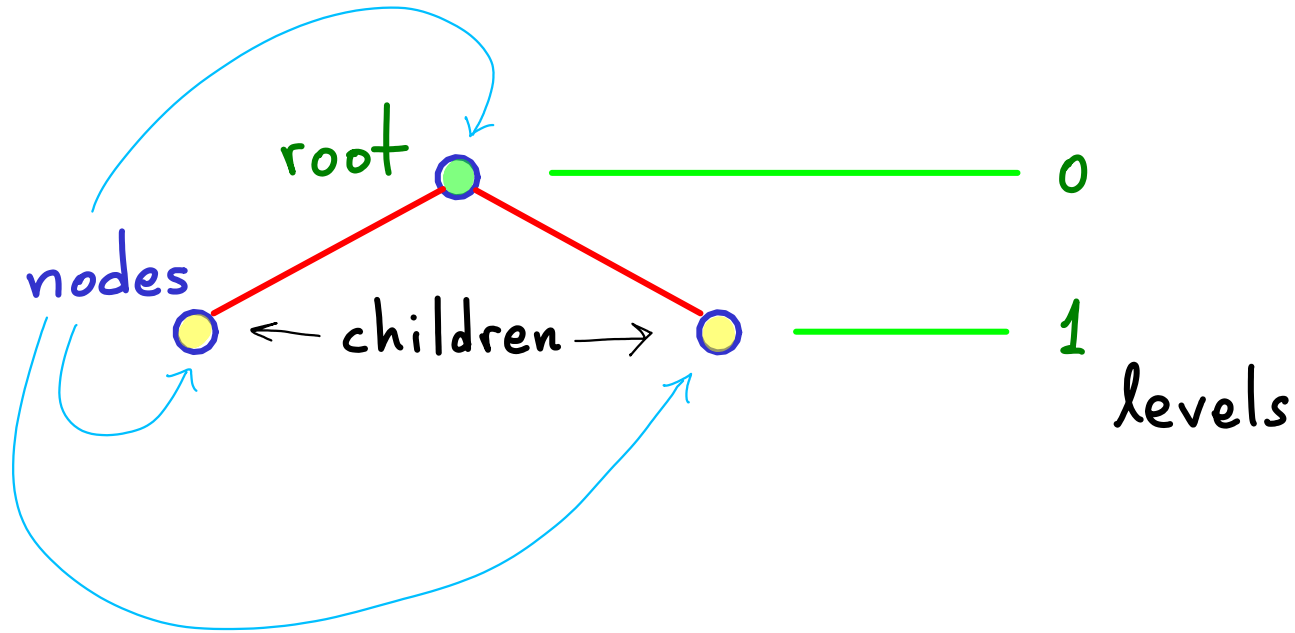
BINARY TREES

BINARY TREES

- if non-empty, $\exists$ root at level 0.

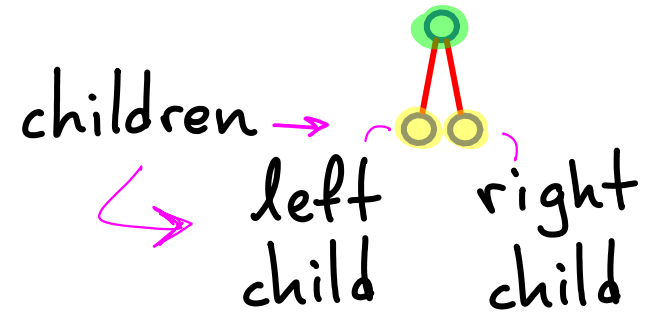
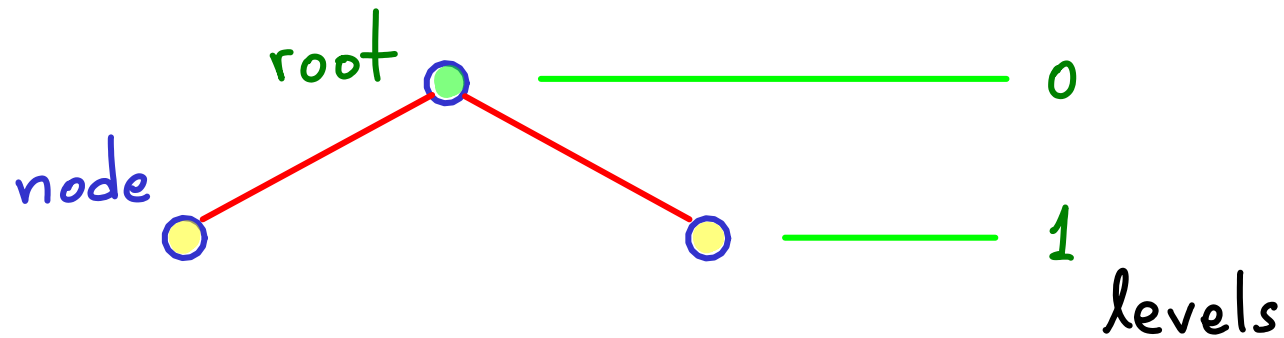


- BINARY TREES
- if non-empty, $\exists$ root at level 0.
 - every node at level i connects to ≤ 2 children at level $i+1$.
(nodes)



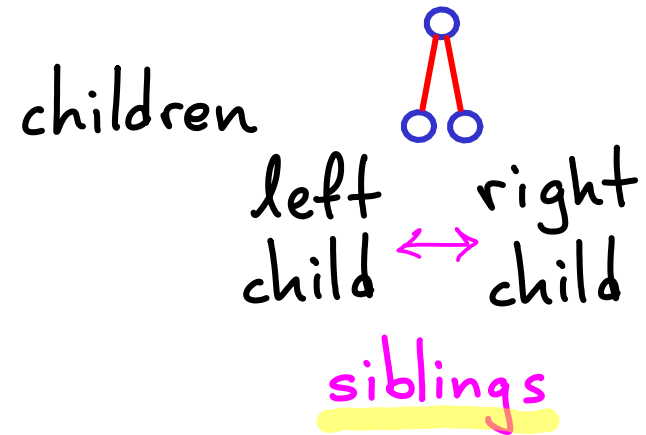
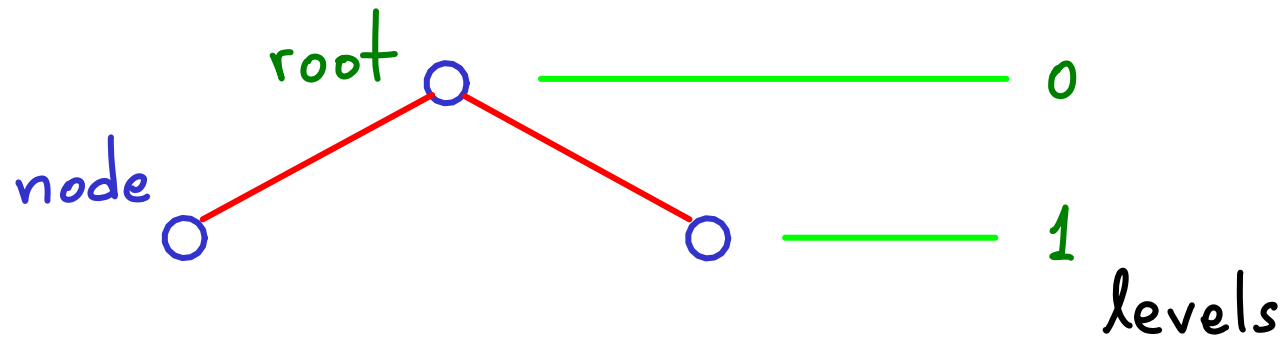
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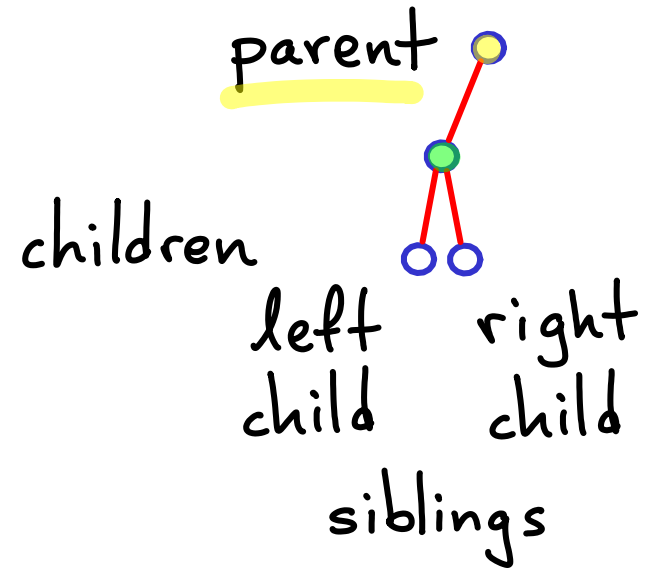
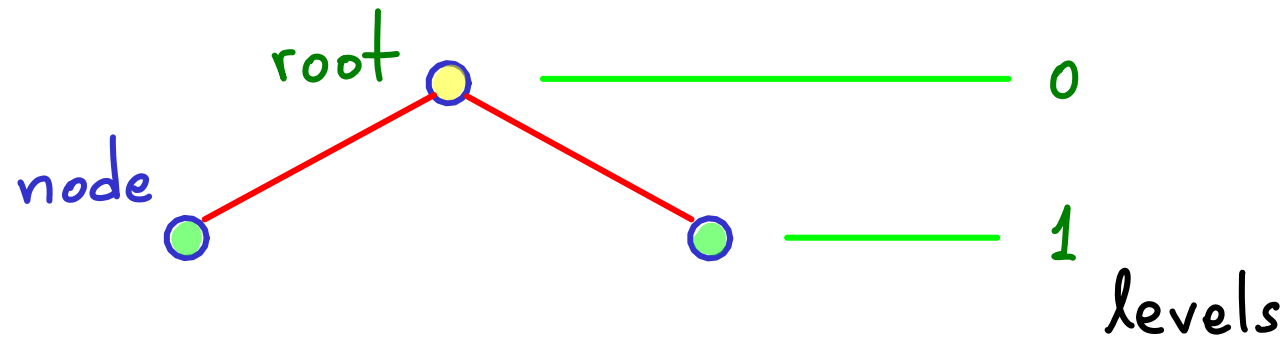
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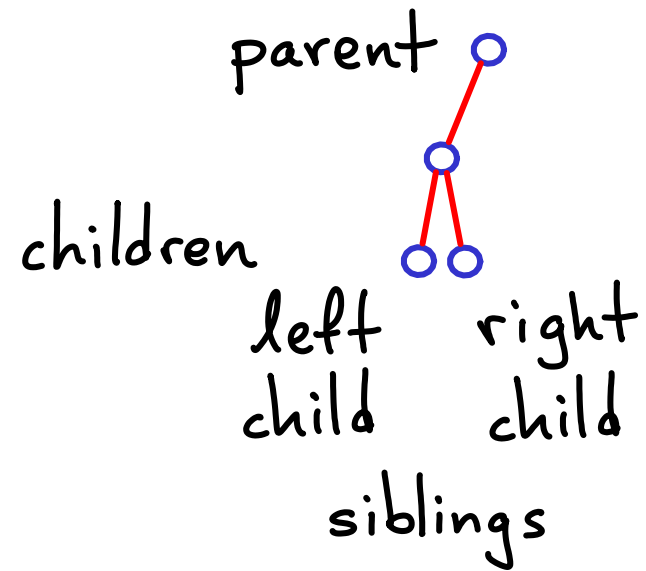
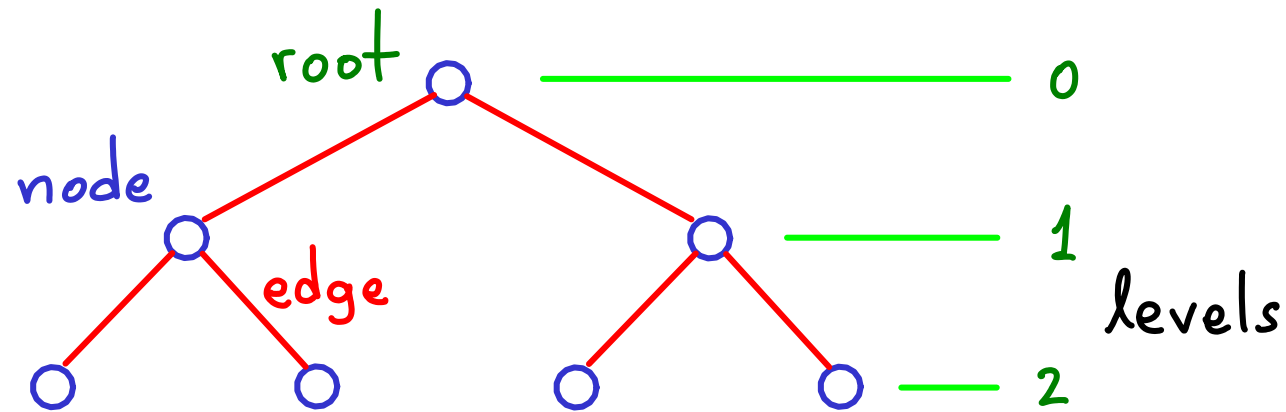
BINARY TREES

- if non-empty, $\exists$ root at level 0.
- every node at level i connects to ≤ 2 children at level $i+1$.
- every non-root node has 1 parent



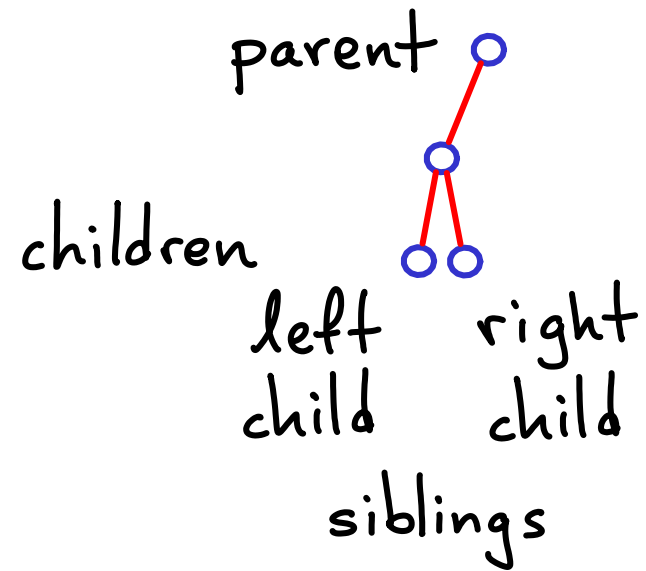
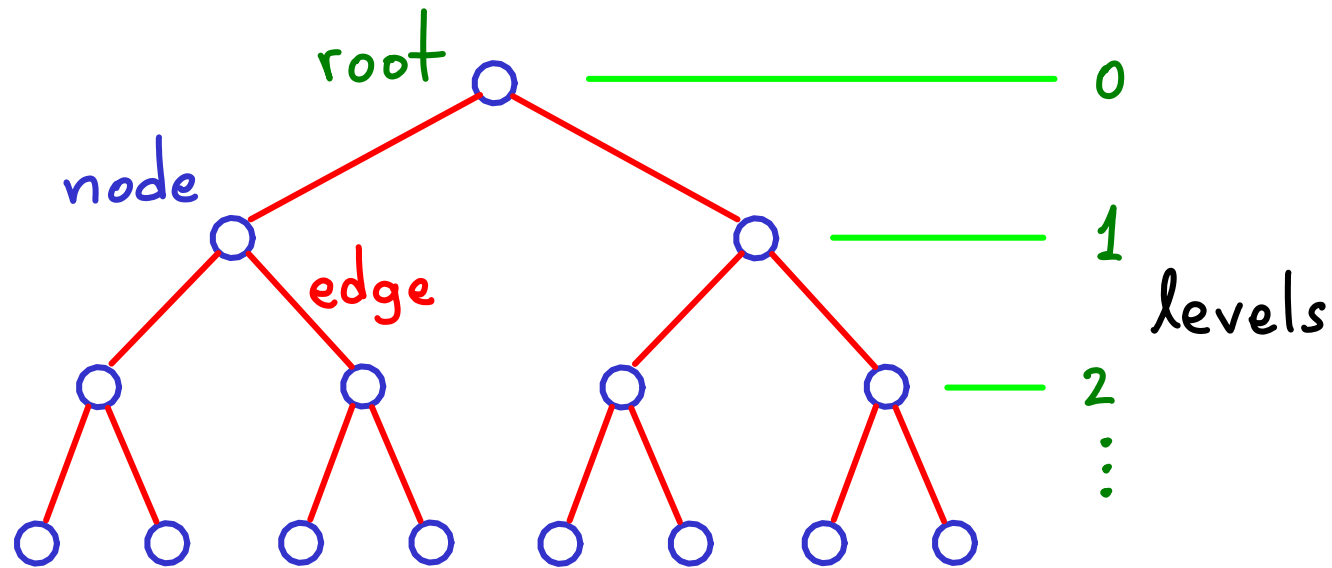
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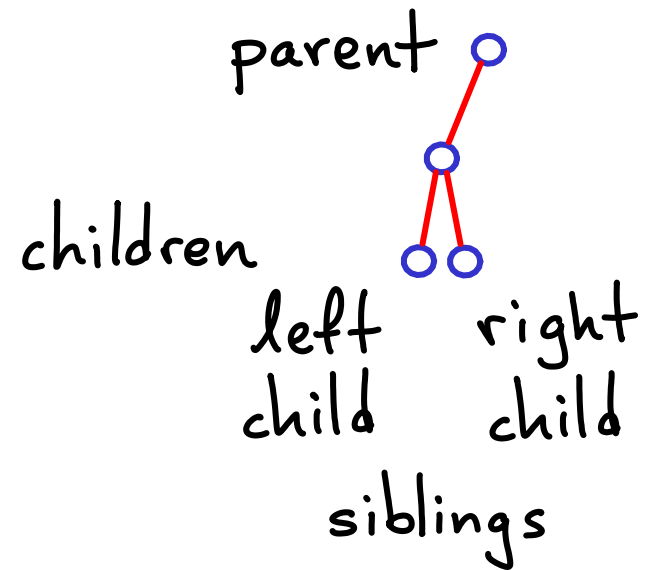
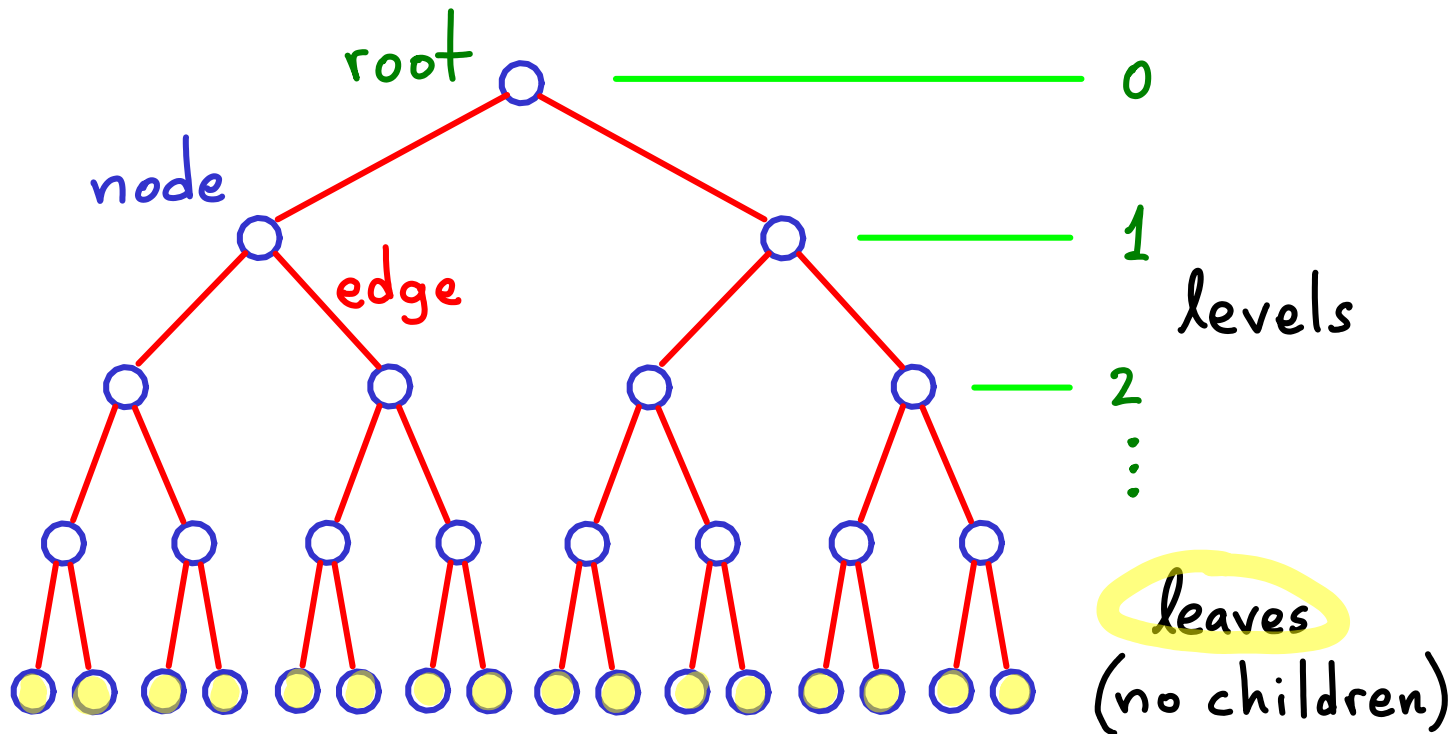
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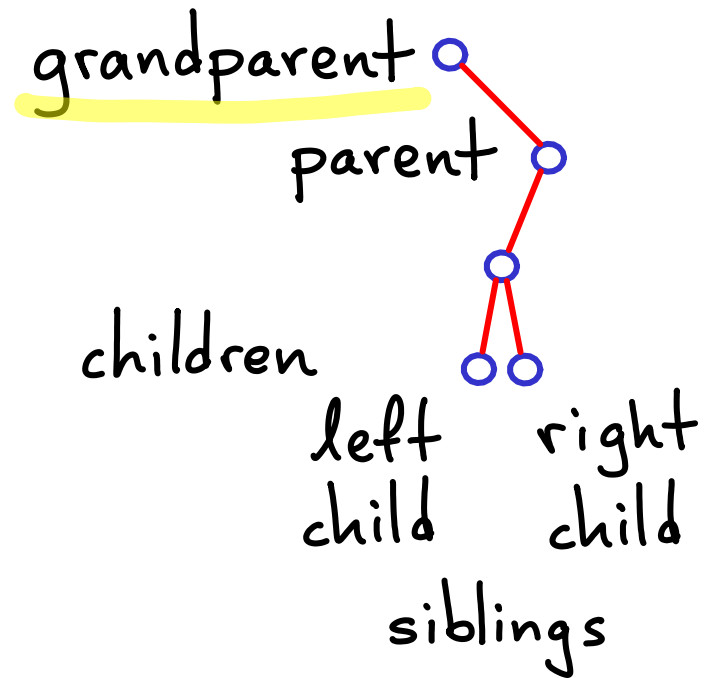
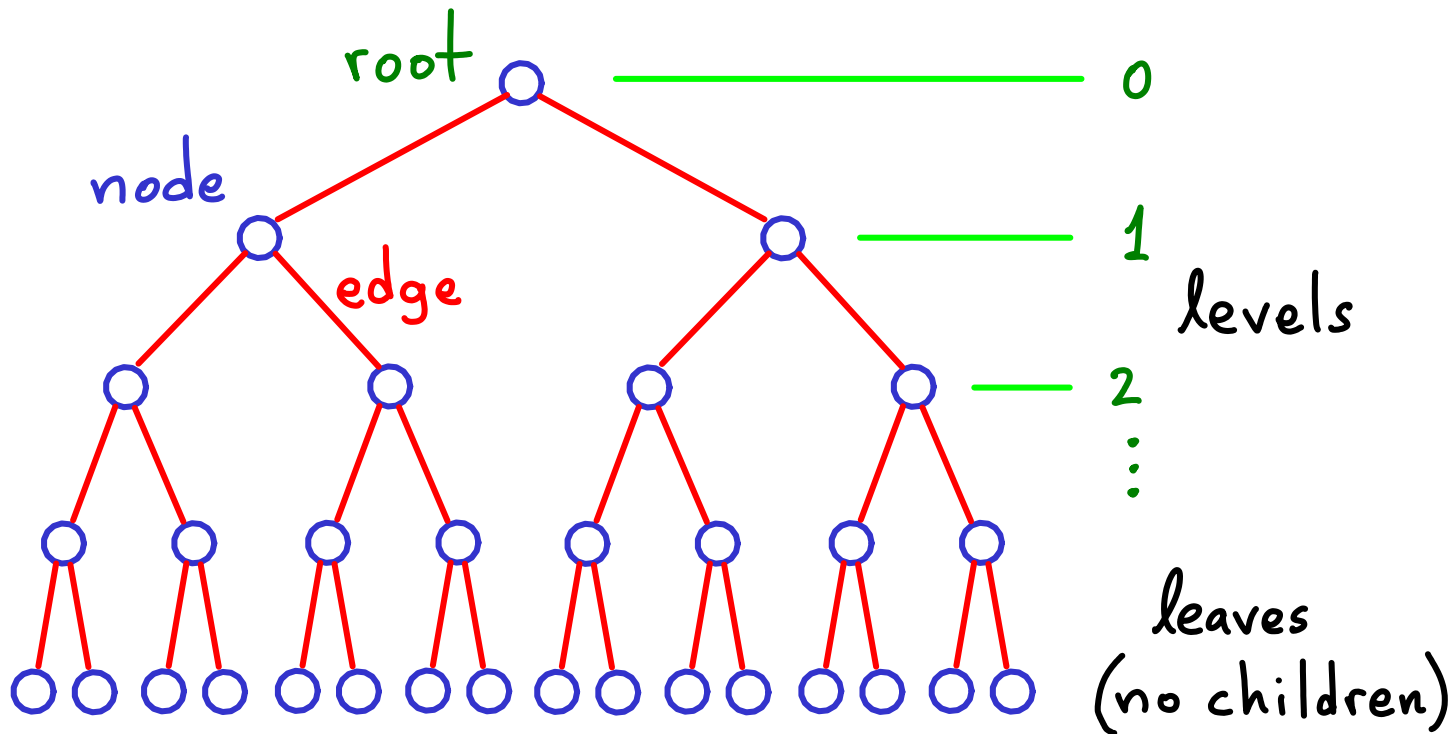
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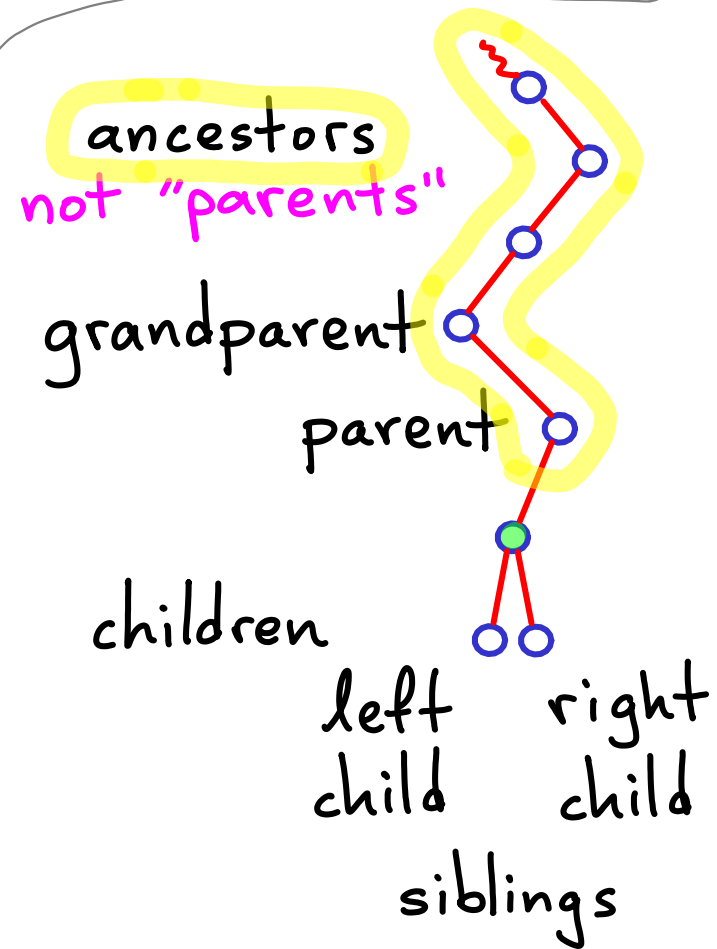
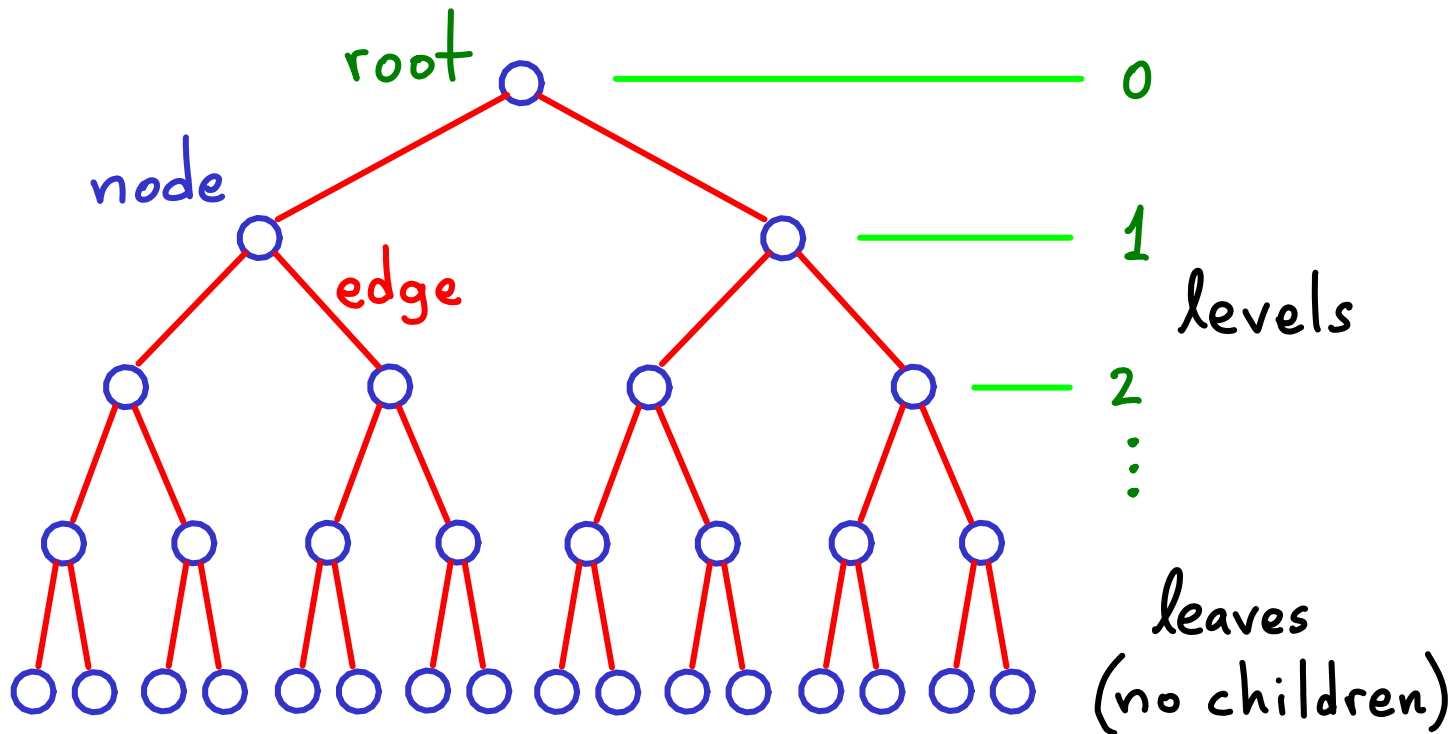


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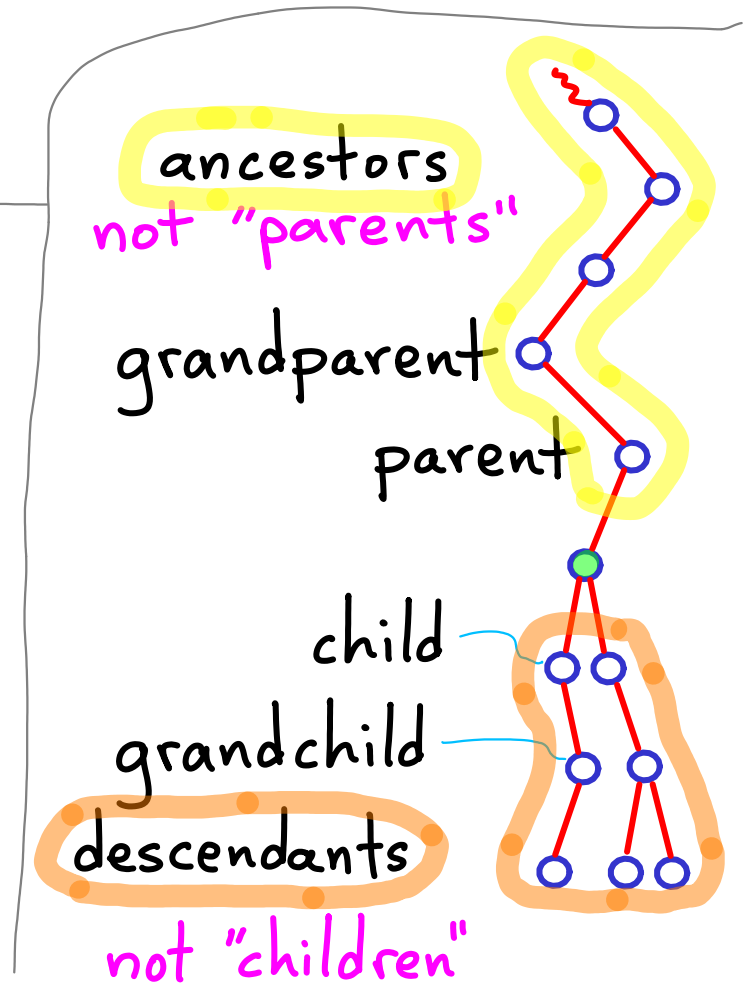
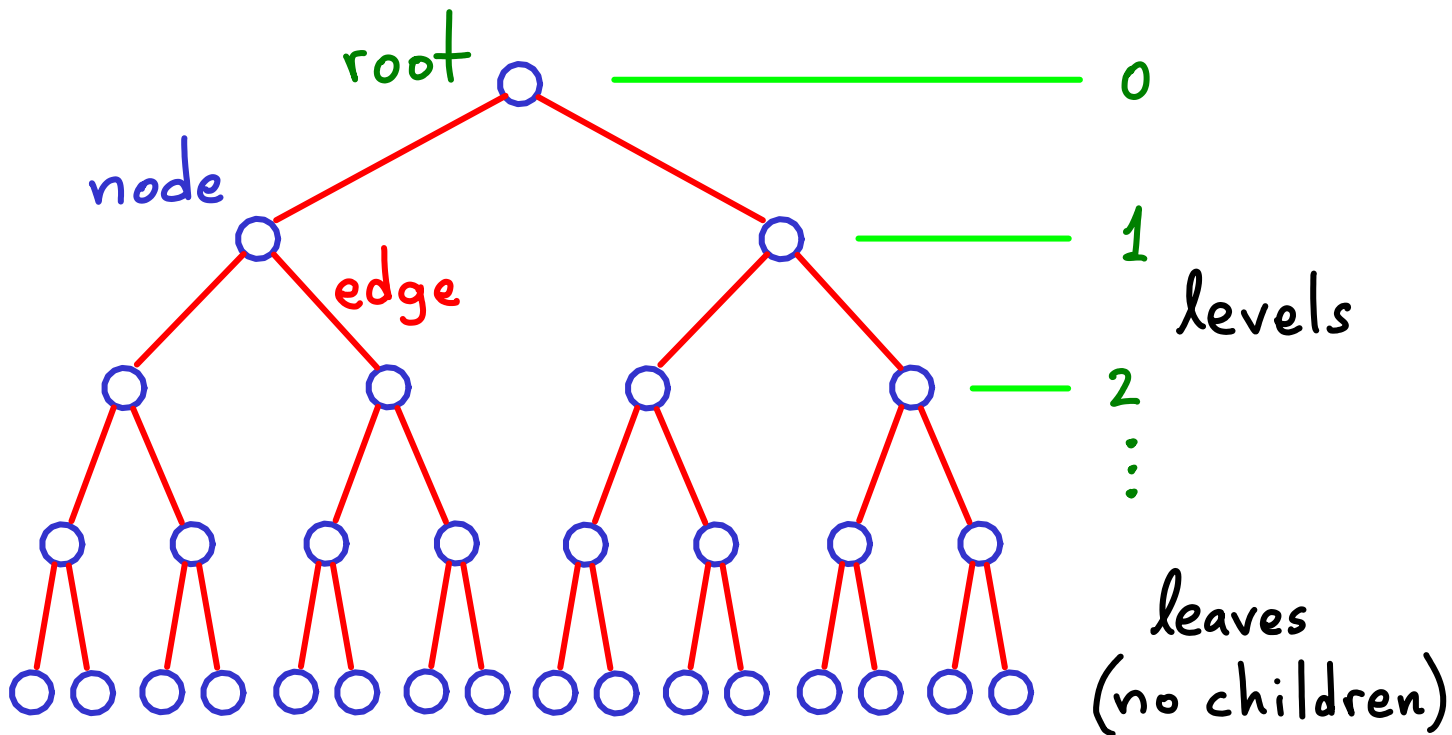
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- # BINARY TREES
- if non-empty, $\exists$ root at level 0.
 - every node at level i connects to ≤ 2 children at level $i+1$.
 - every non-root node has 1 parent

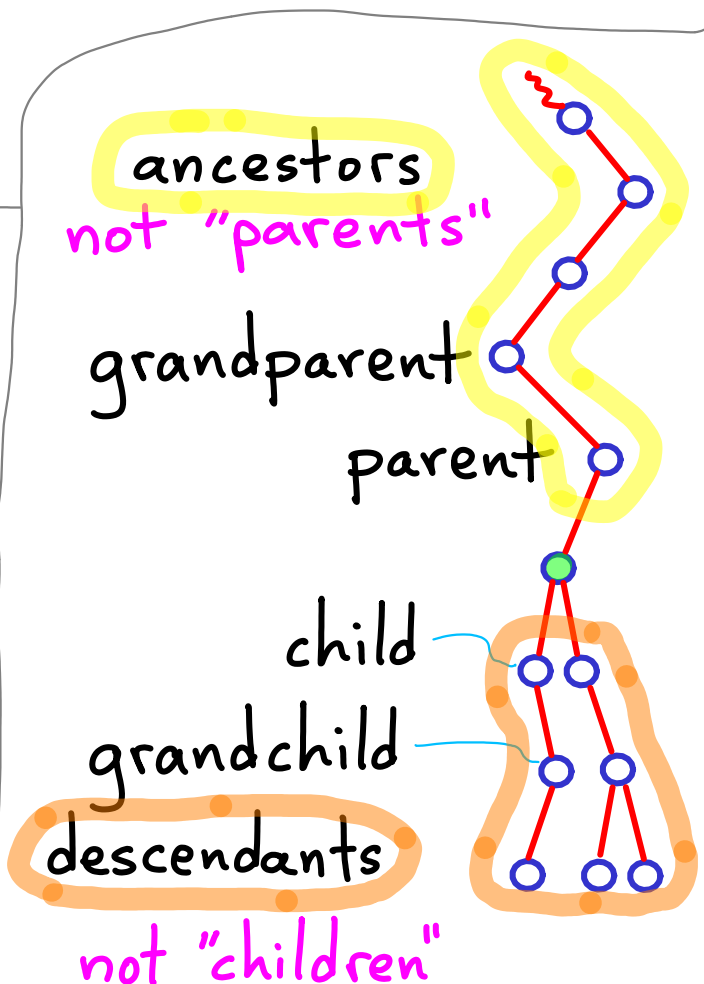
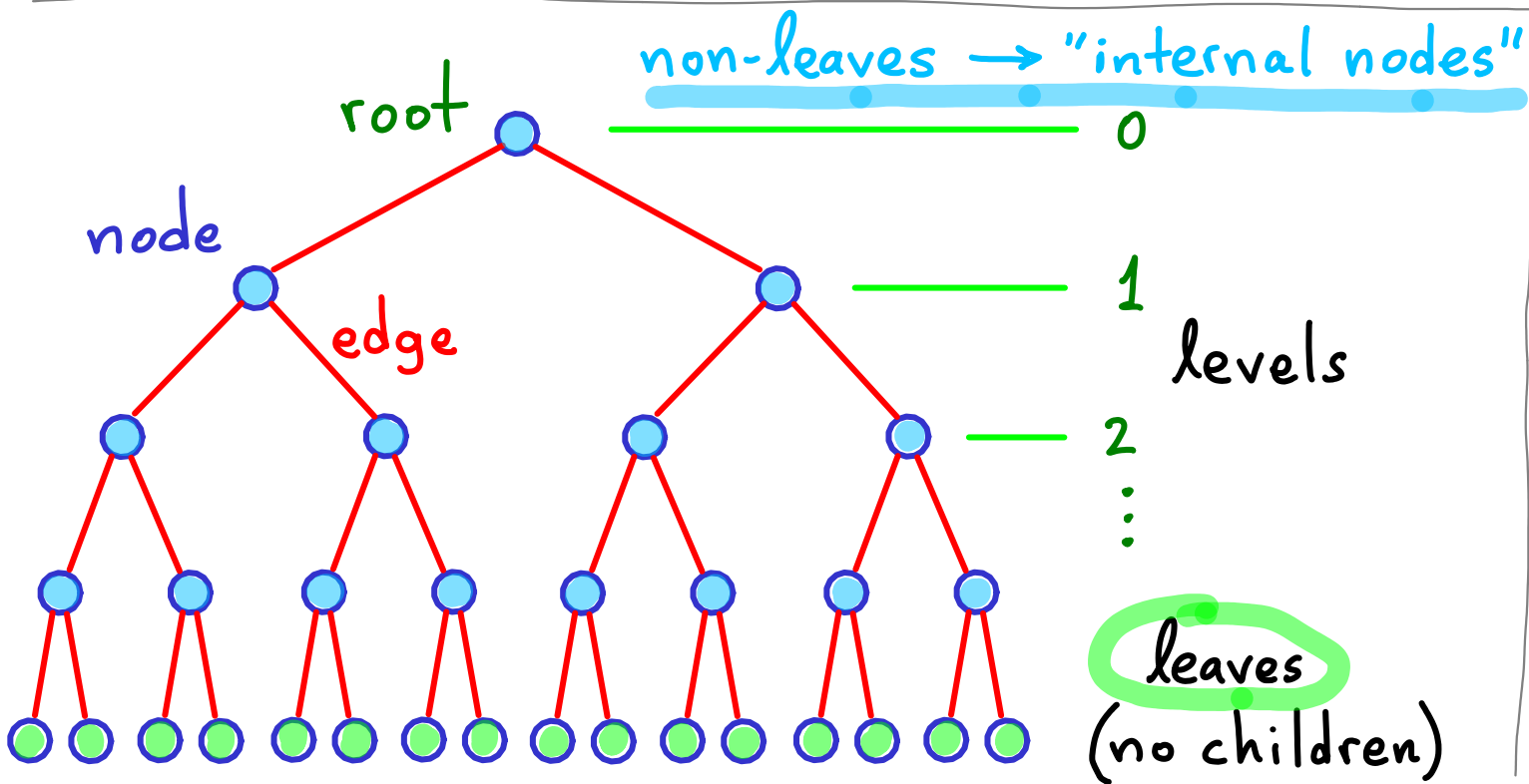


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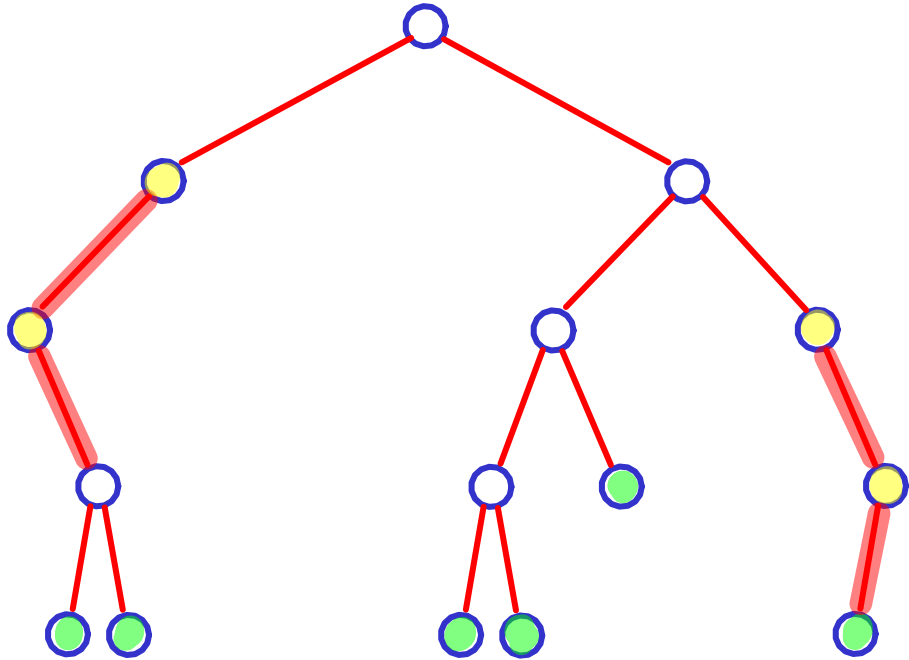
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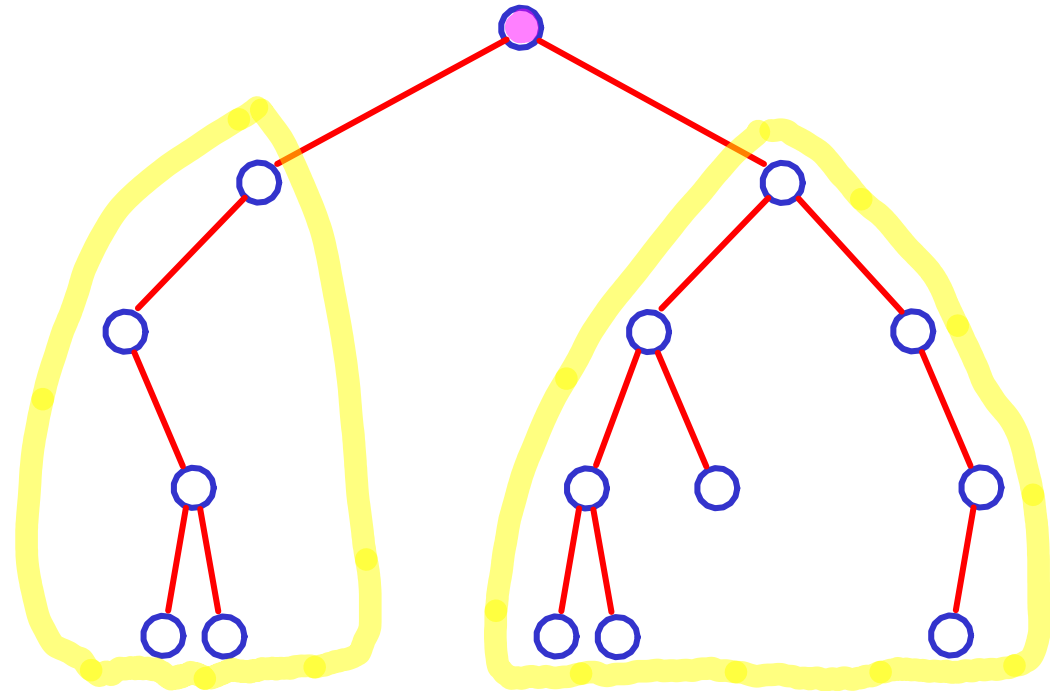


BINARY TREES

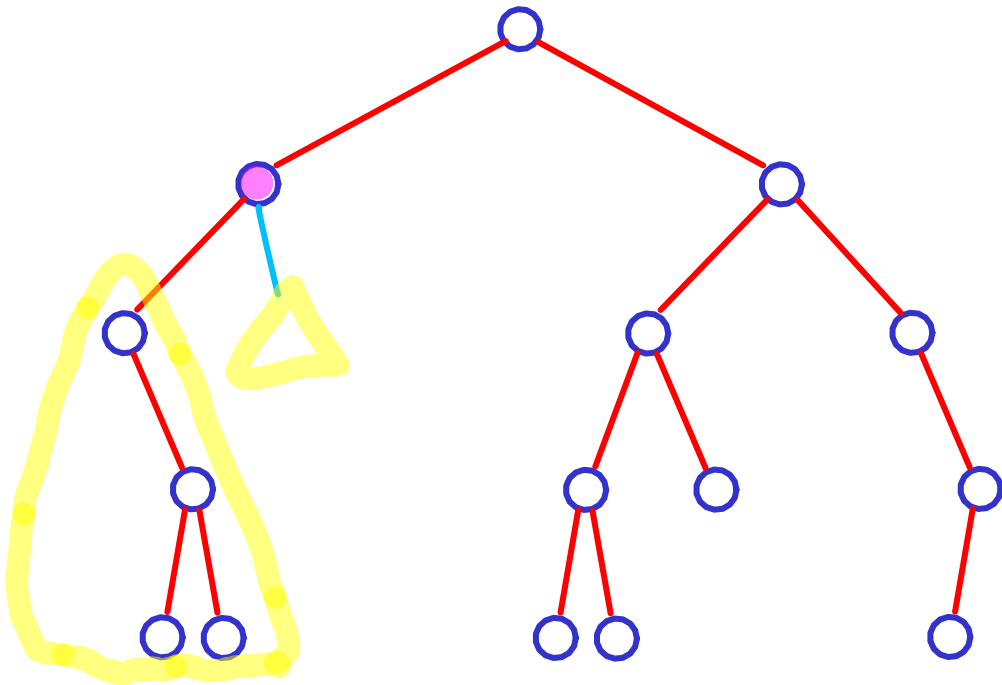
- if non-empty, $\exists$ root at level 0.
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- every non-root node has 1 parent



- BINARY TREES
- if non-empty, $\exists$ root at level 0.
 - every node at level i connects to 2 subtrees at level $i+1$.

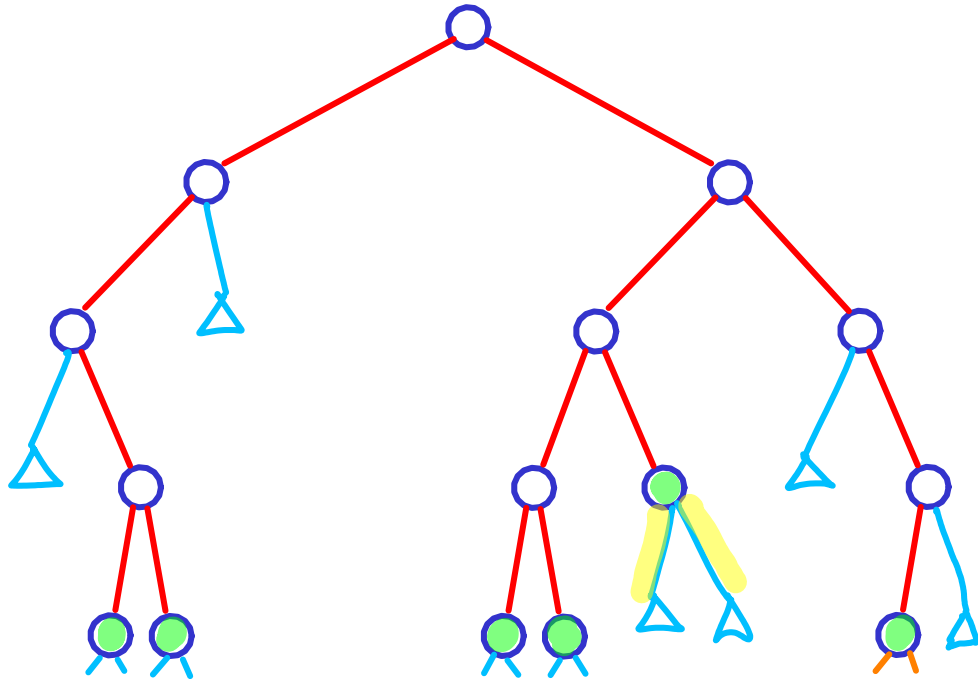


- BINARY TREES
- if non-empty, $\exists$ root at level 0.
 - every node at level i connects to 2 subtrees at level $i+1$.



[subtrees can be empty]

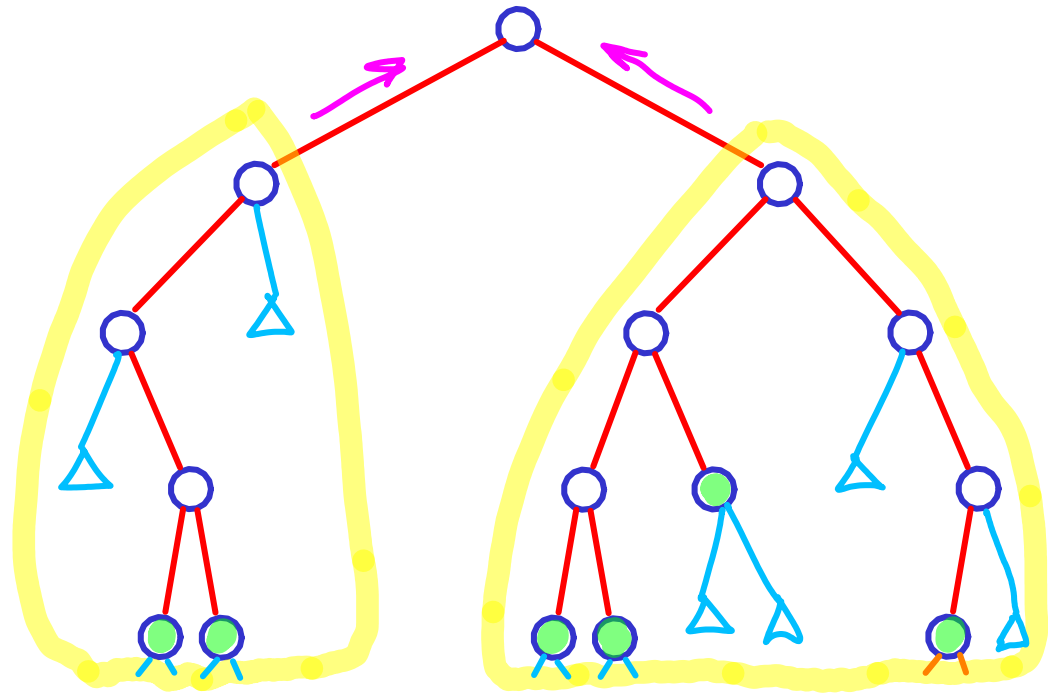
- BINARY TREES
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 - every node at level i connects to 2 subtrees at level $i+1$.



[subtrees can be empty]

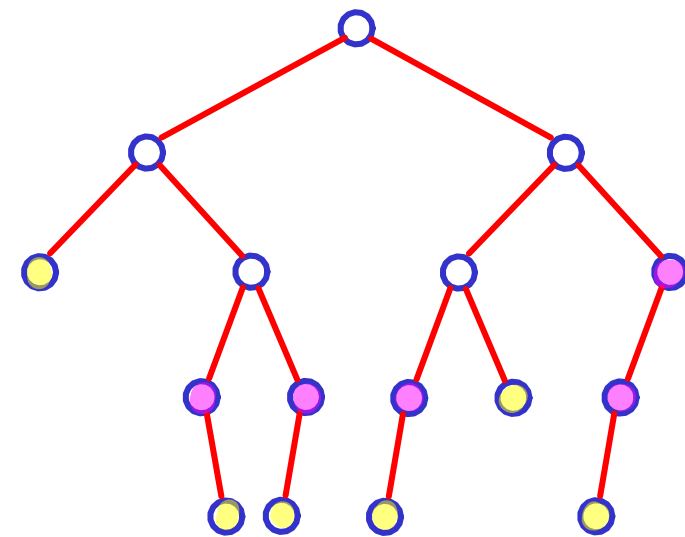
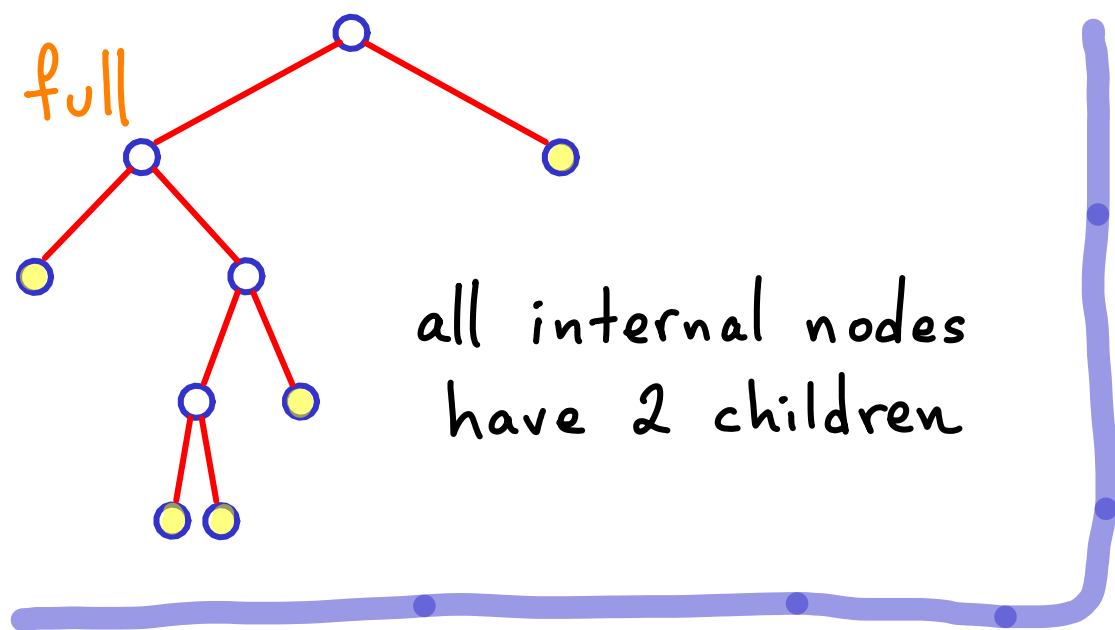
leaves : 2 empty subtrees

- BINARY TREES
- if non-empty, $\exists$ root at level 0.
 - every node at level i connects to 2 subtrees at level $i+1$.
 - every subtree root has 1 parent (except global root)



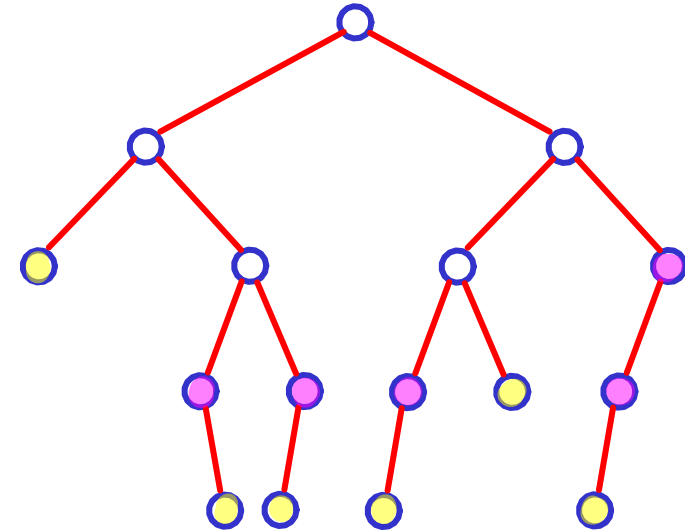
[subtrees can be empty]

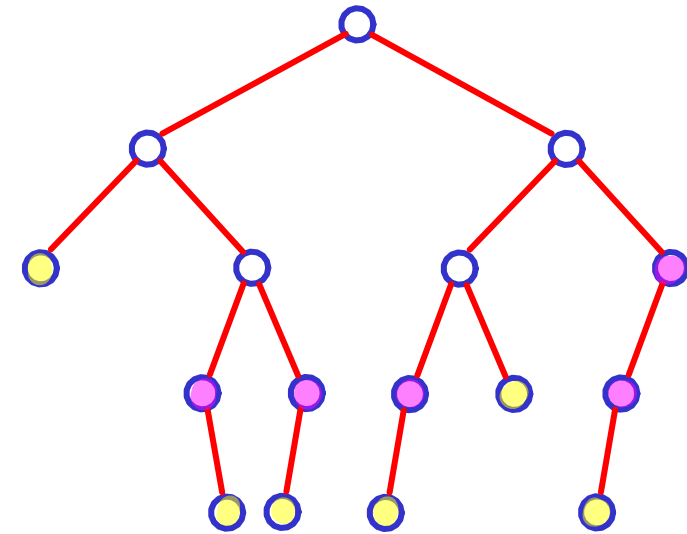
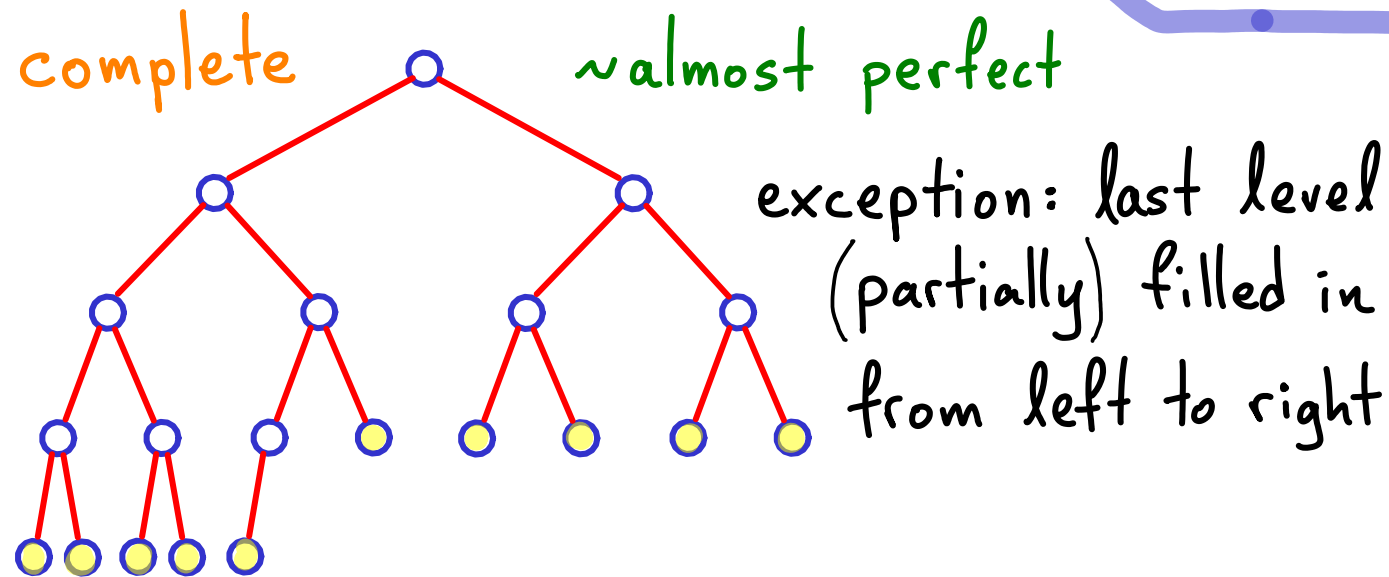
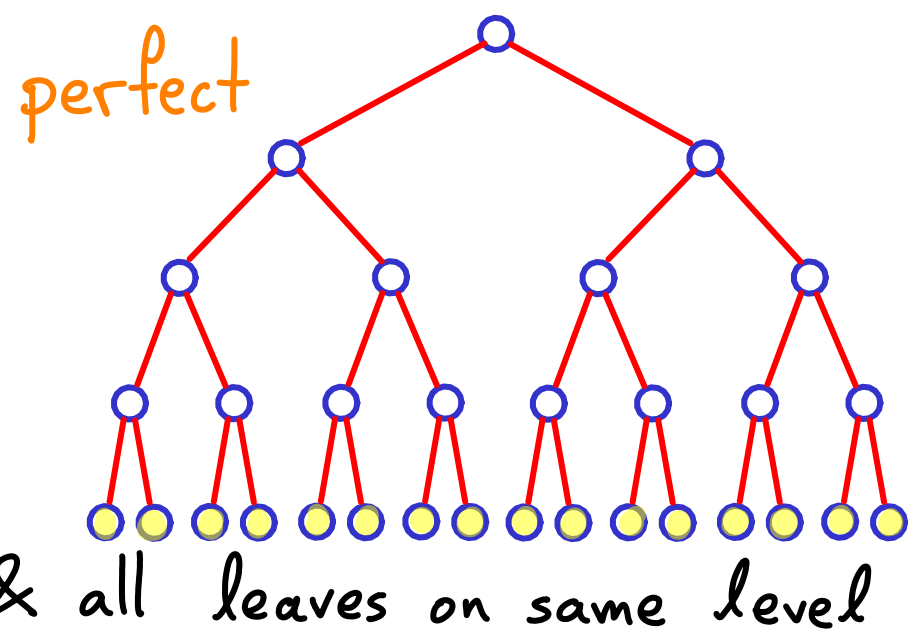
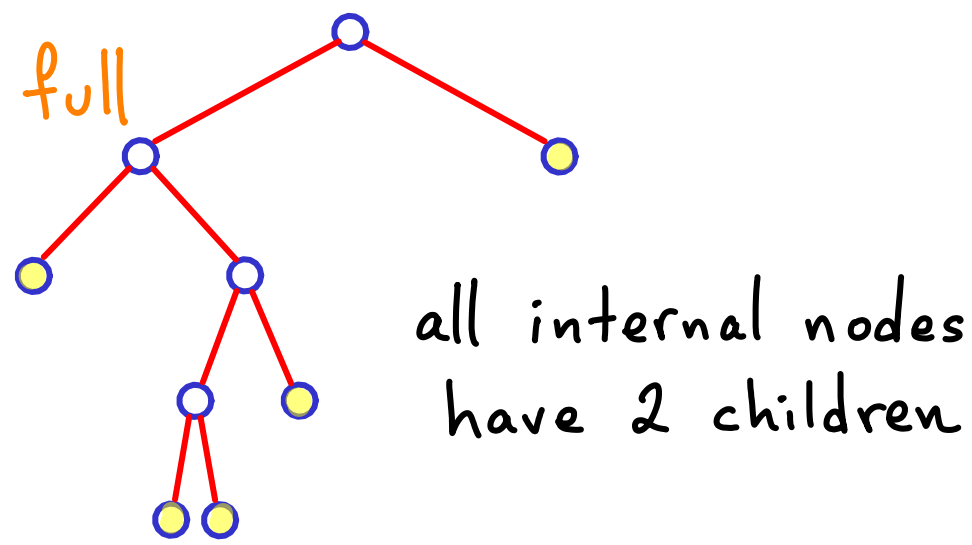
leaves : 2 empty subtrees

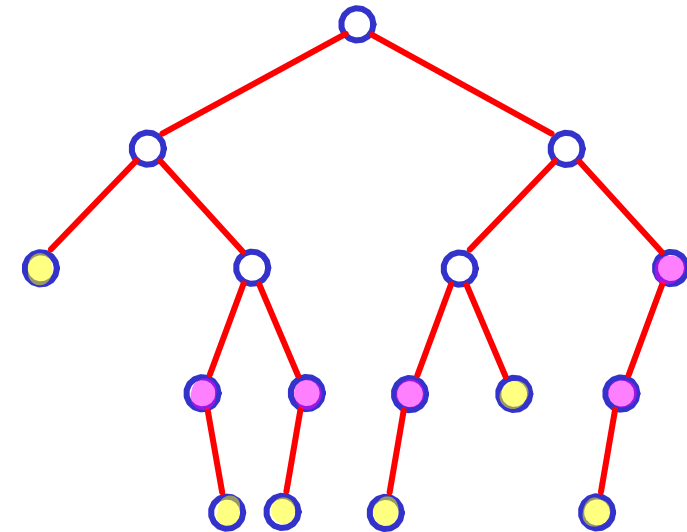
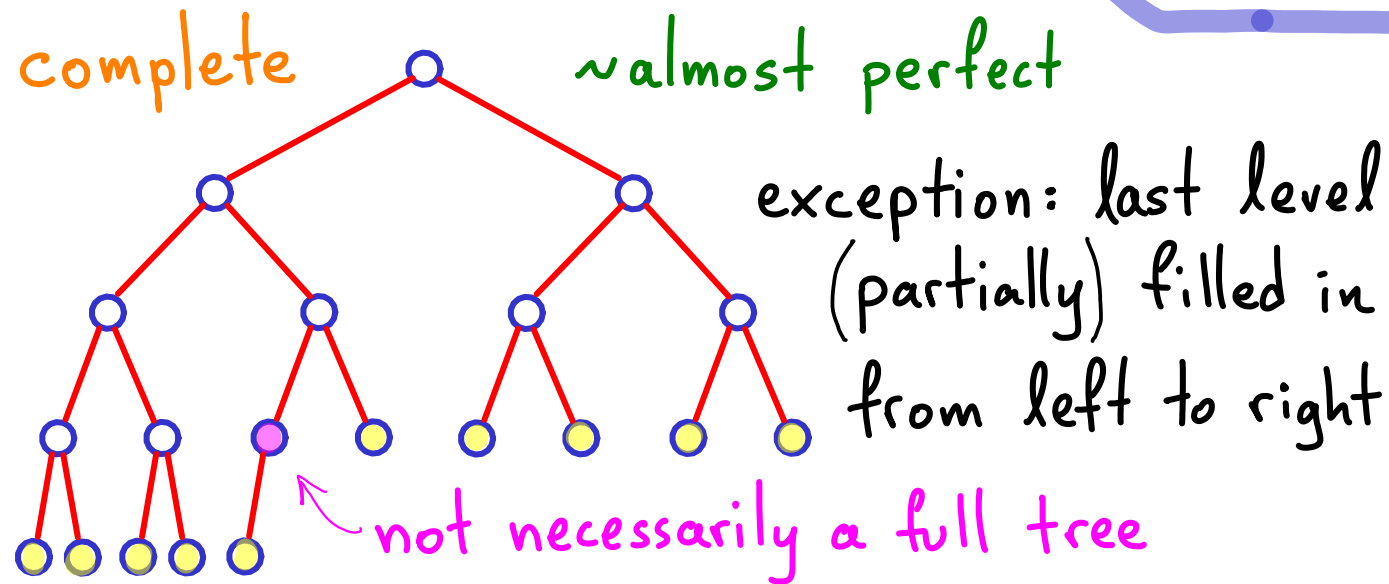
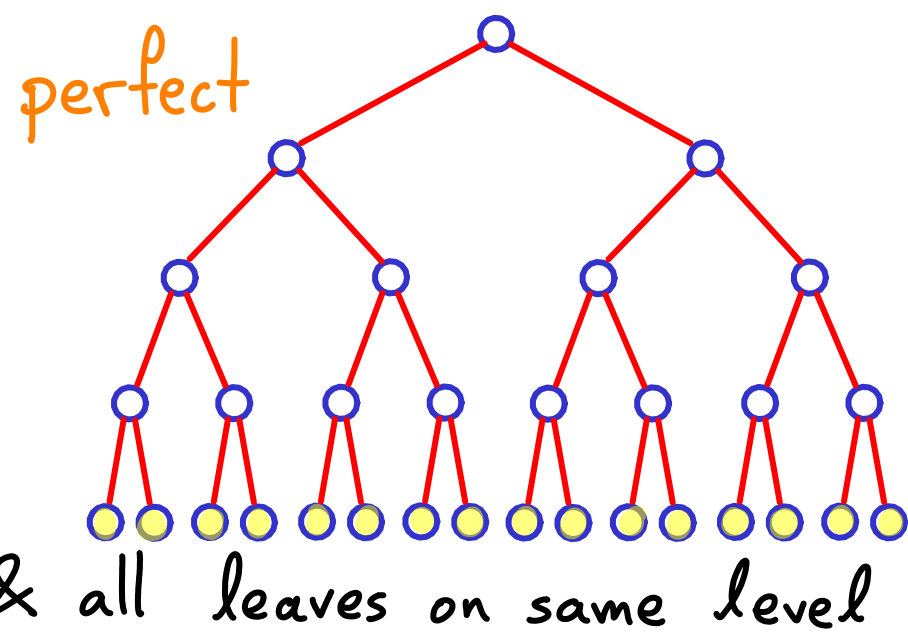
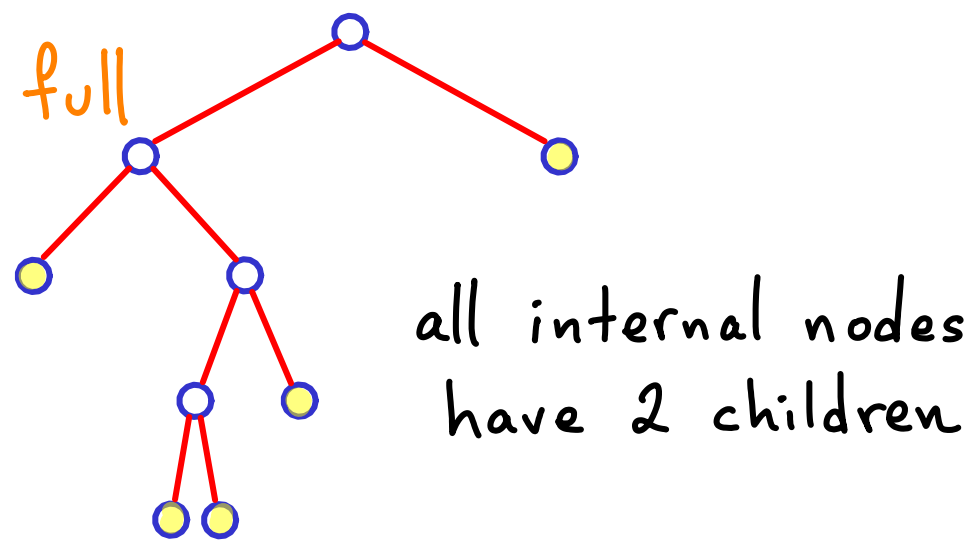


all internal nodes
have 2 children

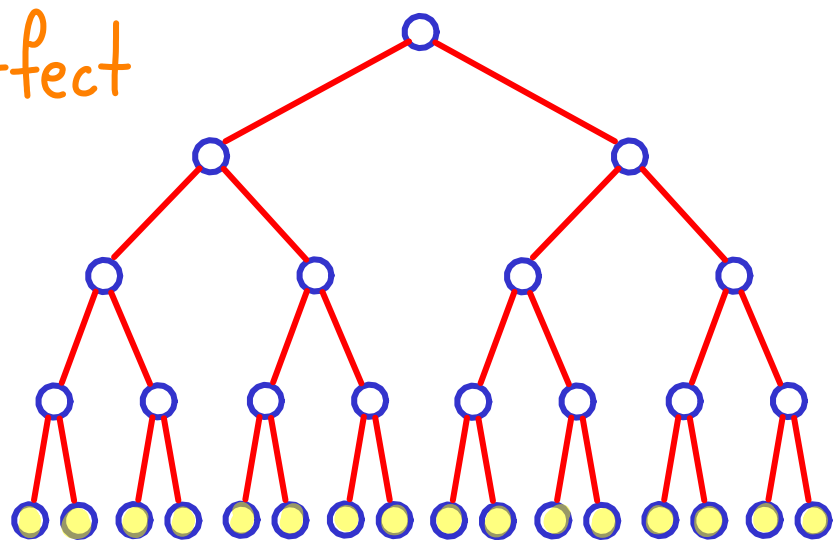
full & all leaves on same level





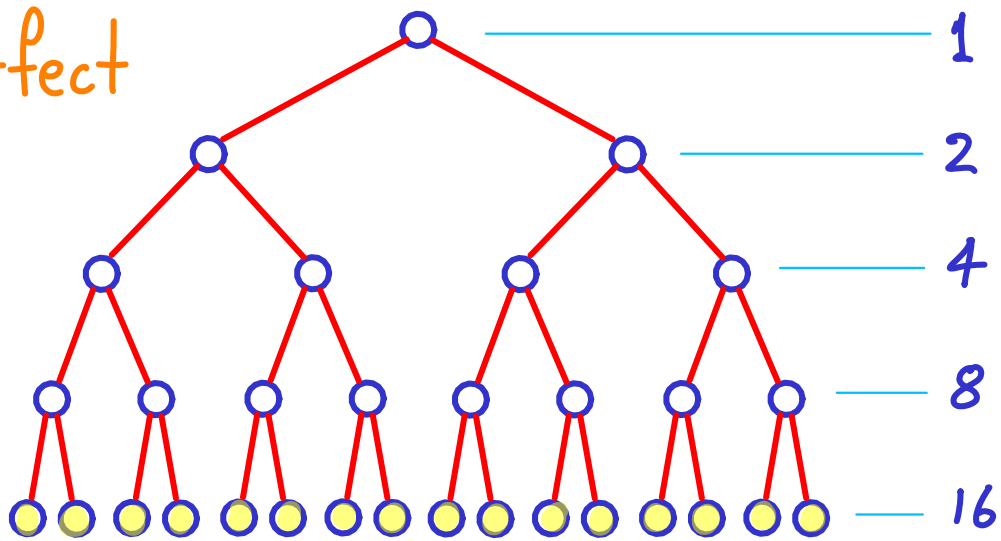


perfect



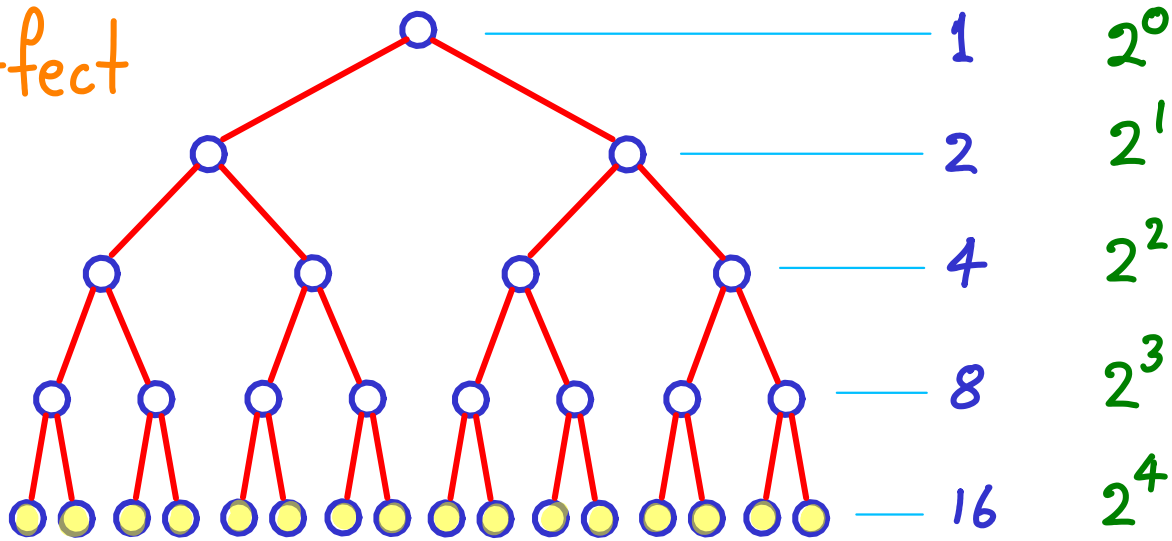
#nodes per level ?

perfect



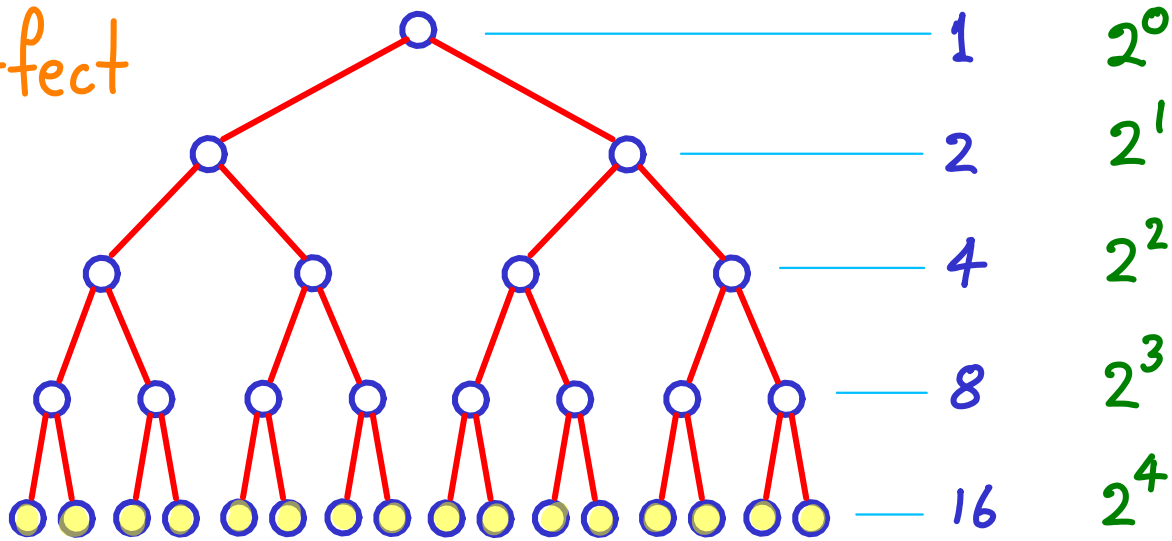
#nodes per level ?

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#nodes per level ?

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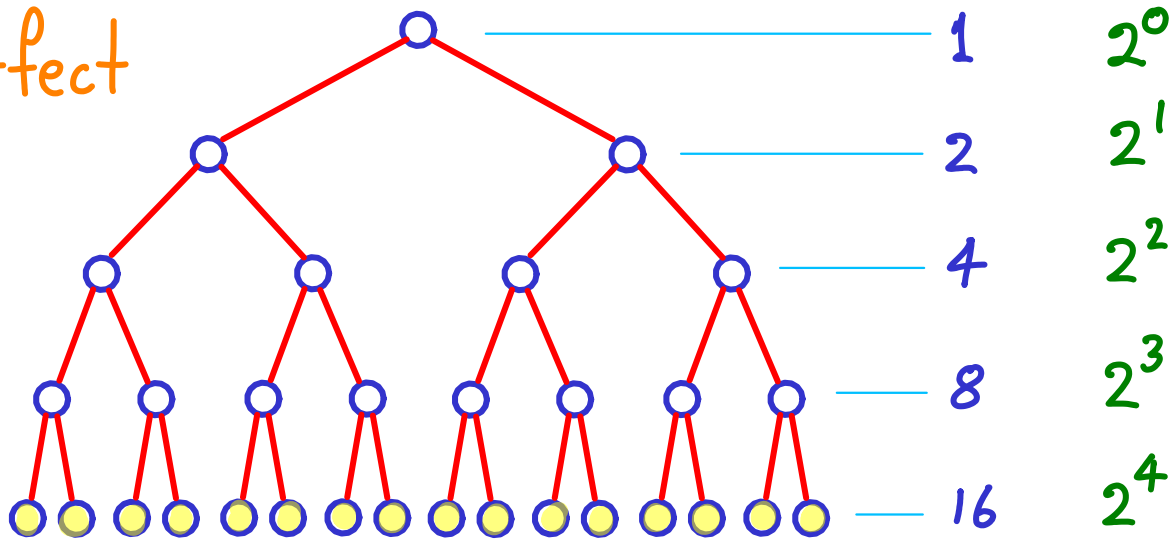


#nodes per level ?

level i

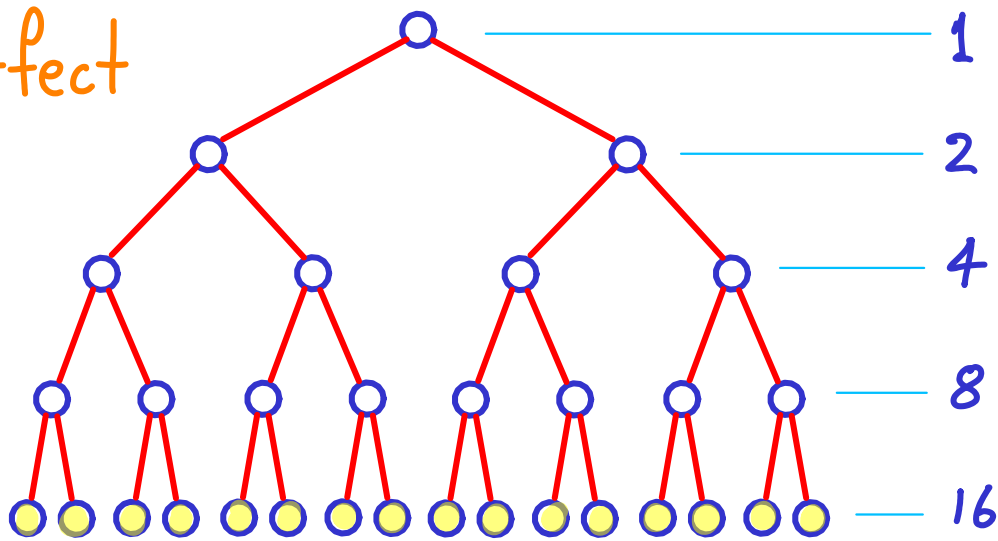
$i = 0, 1, 2, \dots$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

perfect



$$2^0$$

$$2^1$$

$$2^2$$

$$2^3$$

$$2^4$$

#nodes per level ?

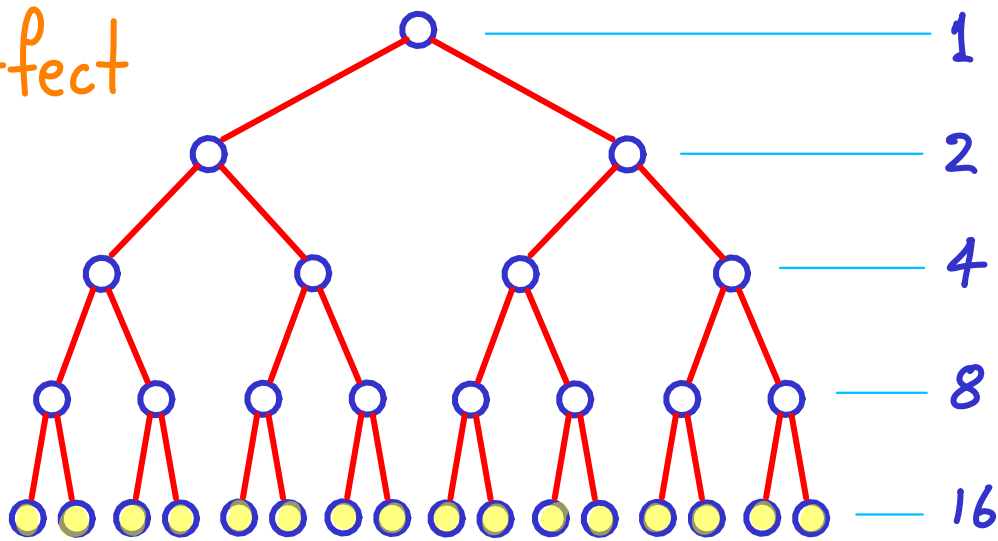
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$$= 2^{L-1} = \#leaves = l$$

perfect



$$2^0$$

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$$2^4$$

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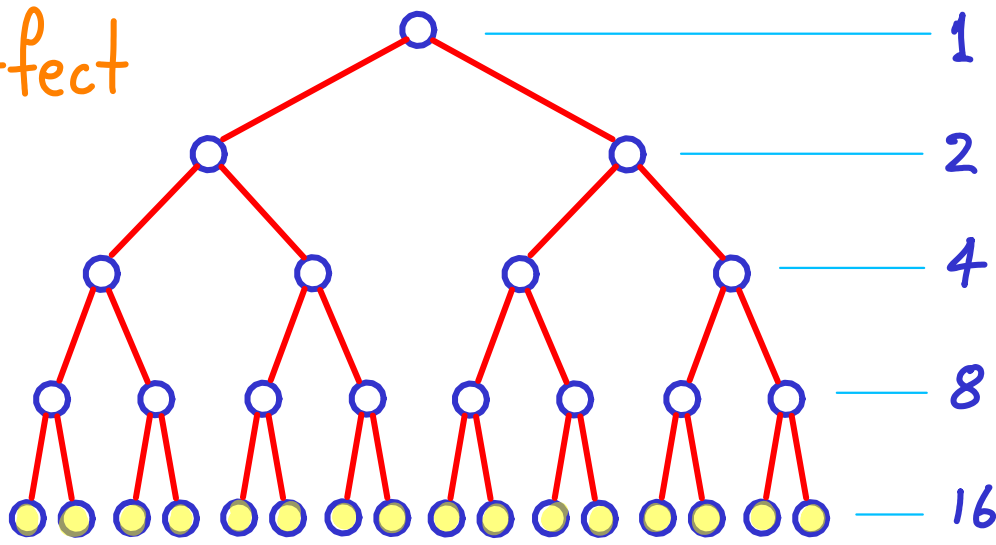
#levels = L

$$= 2^{L-1} = \text{\#leaves} = l$$

Let $n = \text{total \#nodes}$. notice: n is odd

why?

perfect



2^0 : odd

2^1

2^2

all
even

2^3

2^4

$= 2^{L-1} = \# \text{leaves} = l$

#nodes per level ?

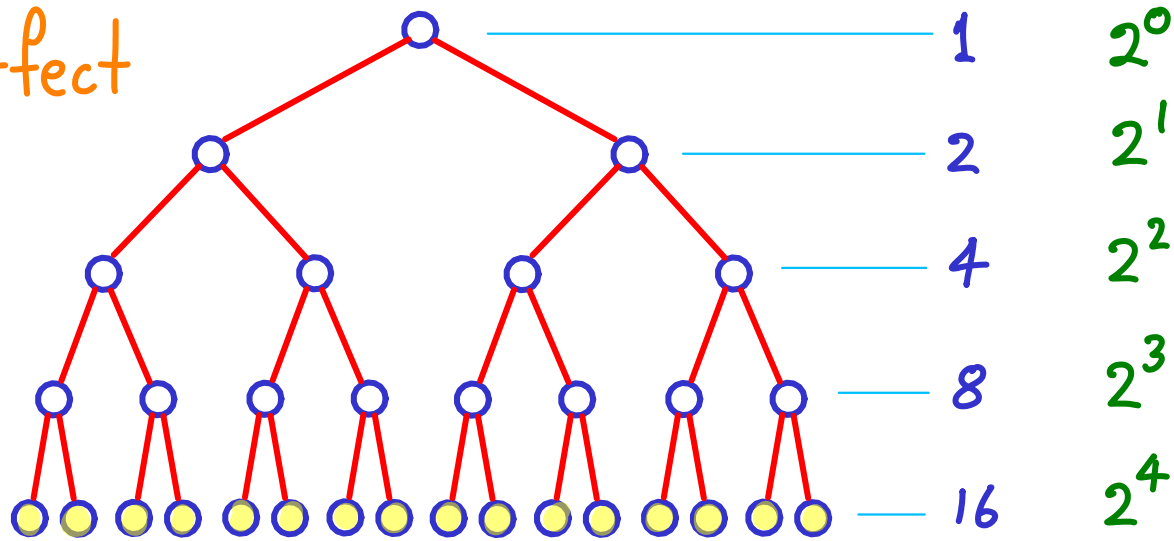
$\hookrightarrow 2^i$ for level i

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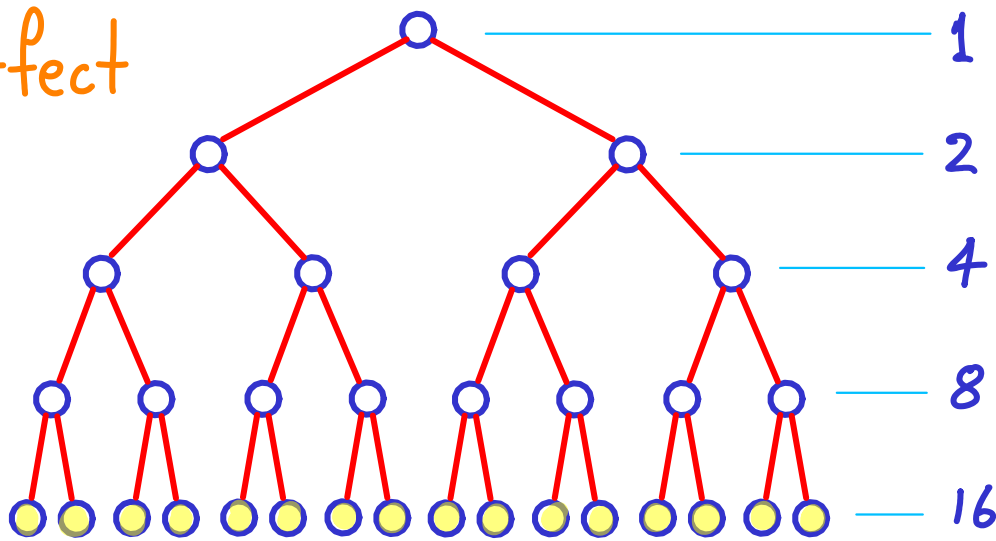
$$2^4 = 2^{L-1} = \#leaves = l$$

Let $n =$ total #nodes. notice: n is odd

- how many levels?

in terms of n

perfect



$$2^0$$



$$2^1$$

$$2^2$$

$$2^3$$

$$2^4$$

$$= 2^{L-1} = \# \text{leaves} = l$$

#nodes per level?

↳ 2^i for level i

$$i = \{0, 1, 2, \dots, L-1\}$$

$$\# \text{levels} = L$$

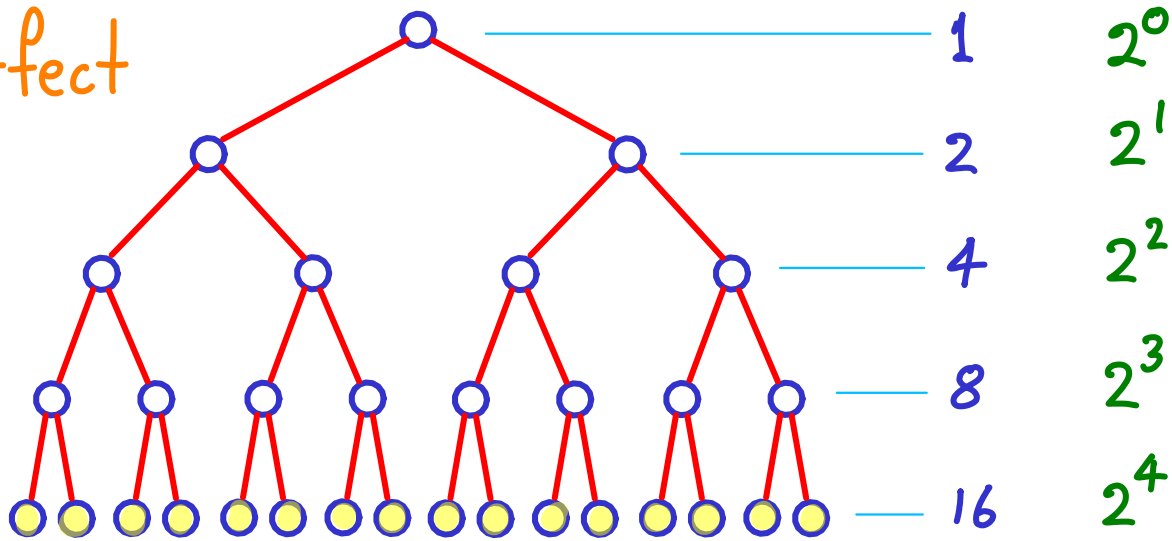
Let n = total #nodes.

notice: n is odd

• how many levels?

$$n = \sum_{i=0}^{L-1} 2^i$$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let n = total #nodes.

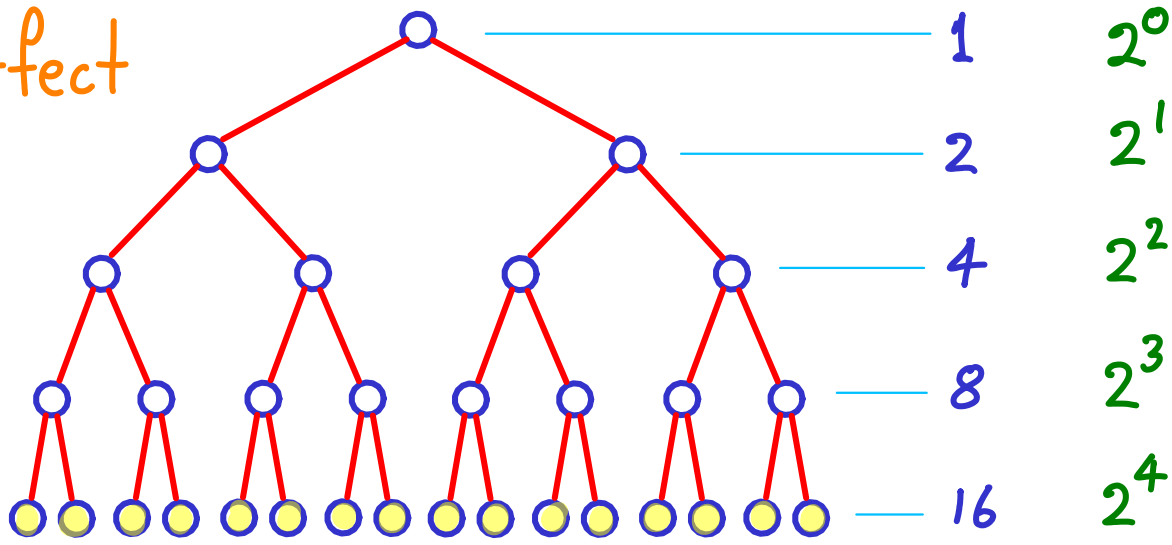
notice: n is odd

- how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1$$

classic geometric sum

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

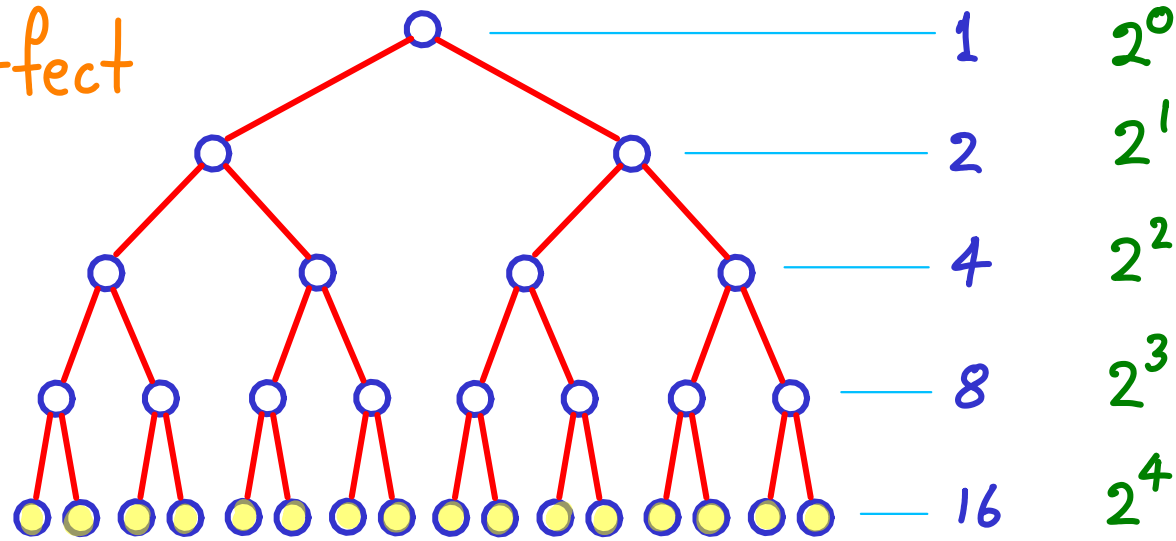
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- how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1$$

Base case trivial
for $L=1$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let $n = \text{total \#nodes}$. notice: n is odd

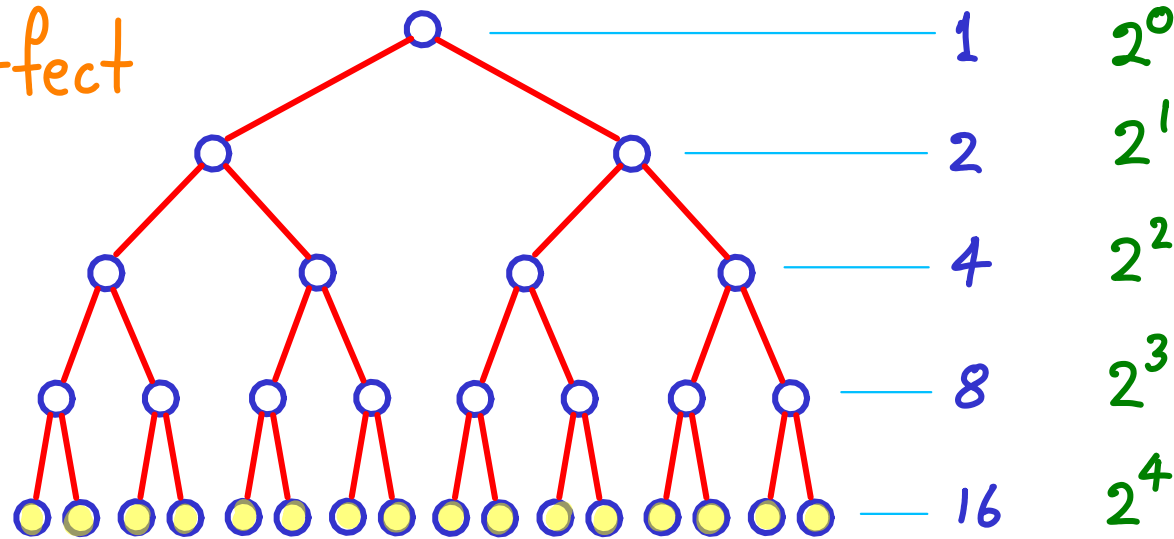
• how many levels ?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1$$

For $L \geq 2$: Hypothesis: $\sum_{i=0}^{L-2} 2^i = 2^{L-1} - 1$

Base case trivial
for $L=1$

perfect



#nodes per level?

↳ 2^i for level i

$i = \{0, 1, 2, \dots, L-1\}$

#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let $n =$ total #nodes. notice: n is odd

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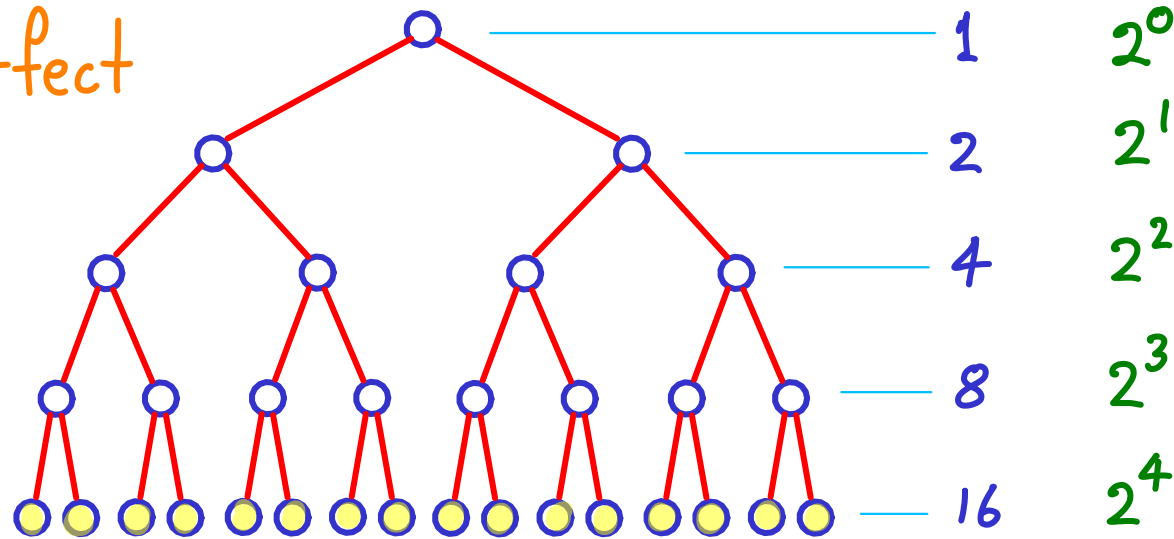
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Base case trivial
for $L=1$

$$\sum_{i=0}^{L-1} 2^i = 2^{L-1} + \sum_{i=0}^{L-2} 2^i$$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

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Let $n =$ total #nodes. notice: n is odd

• how many levels ?

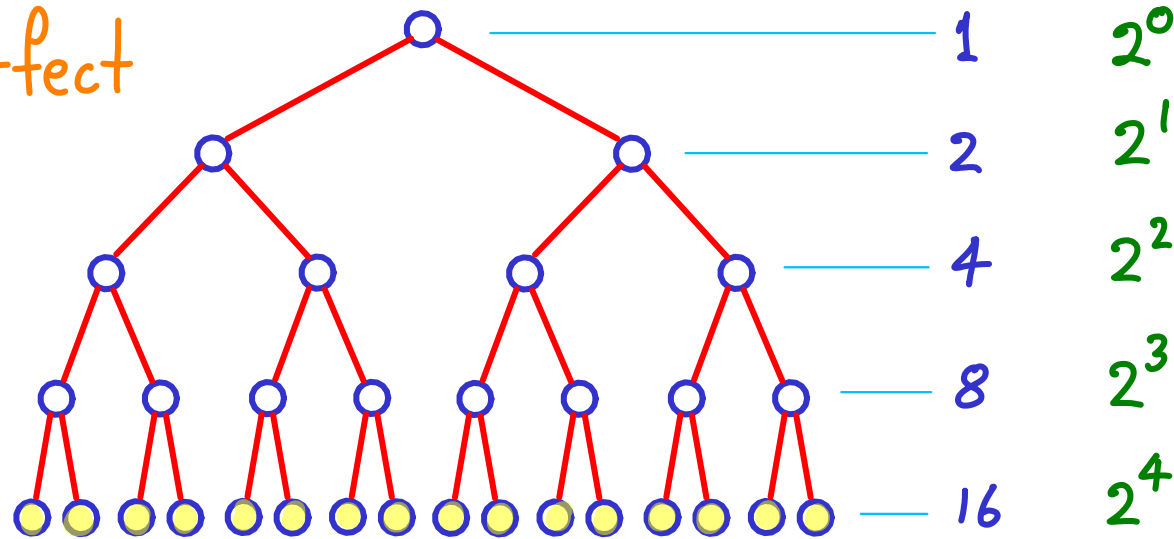
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Base case trivial
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#nodes per level?

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$$2^4 = 2^{L-1} = \#leaves = l$$

Let $n =$ total #nodes. notice: n is odd

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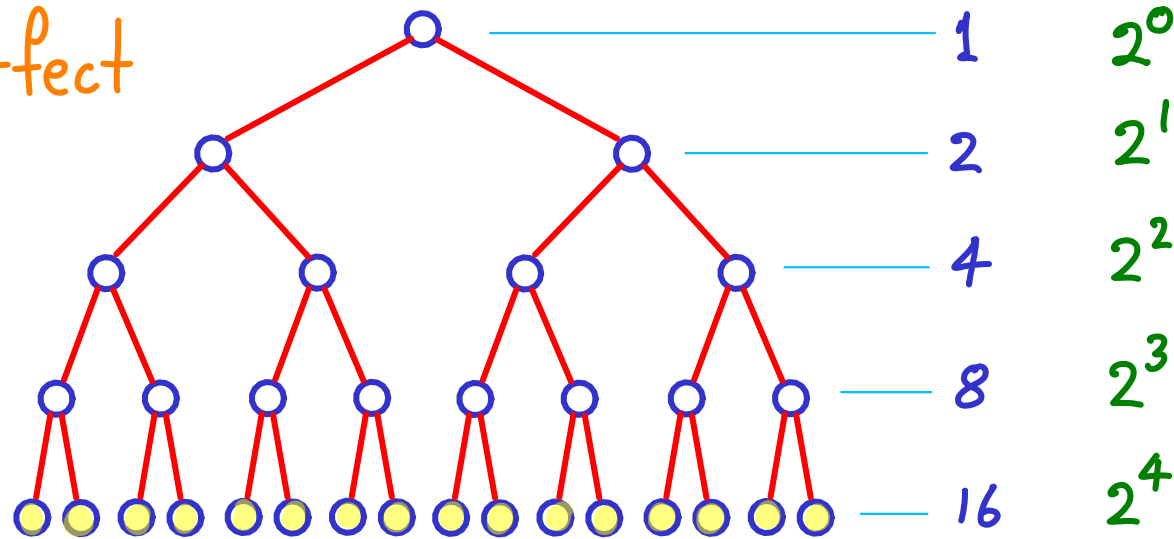
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Base case trivial
for $L=1$

$$\sum_{i=0}^{L-1} 2^i = 2^{L-1} + \sum_{i=0}^{L-2} 2^i = 2^{L-1} + 2^{L-1} - 1$$

perfect



#nodes per level?

↳ 2^i for level i

$i = \{0, 1, 2, \dots, L-1\}$

#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let $n =$ total #nodes. notice: n is odd

• how many levels?

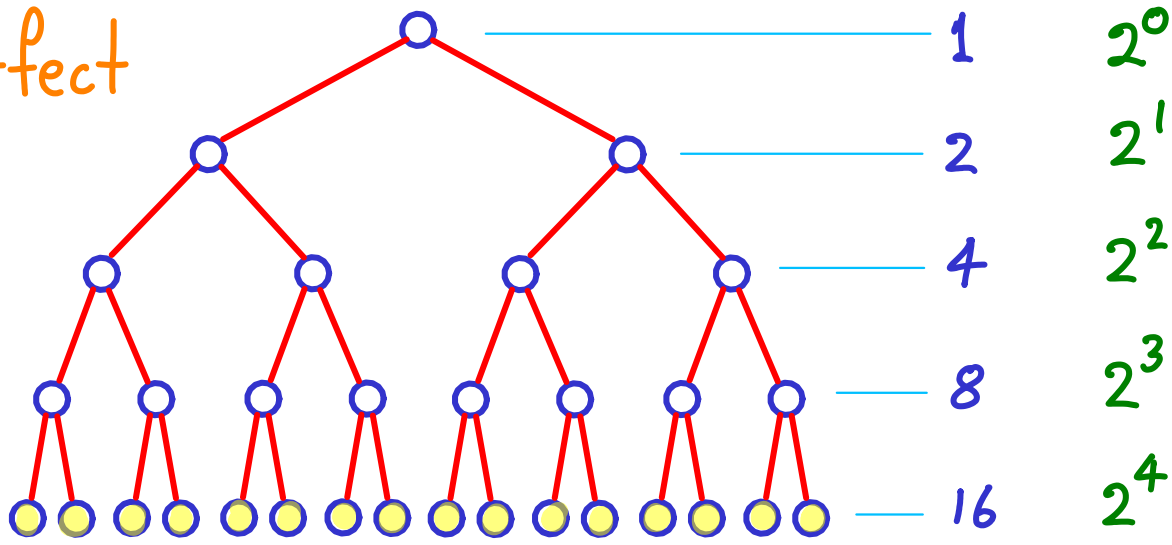
$$n = \sum_{i=0}^{L-1} 2^i = \underline{2^L - 1}$$

For $L \geq 2$: Hypothesis: $\sum_{i=0}^{L-2} 2^i = 2^{L-1} - 1$

Base case trivial
for $L=1$

$$\sum_{i=0}^{L-1} 2^i = 2^{L-1} + \sum_{i=0}^{L-2} 2^i = \underline{2^{L-1} + 2^{L-1} - 1}$$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

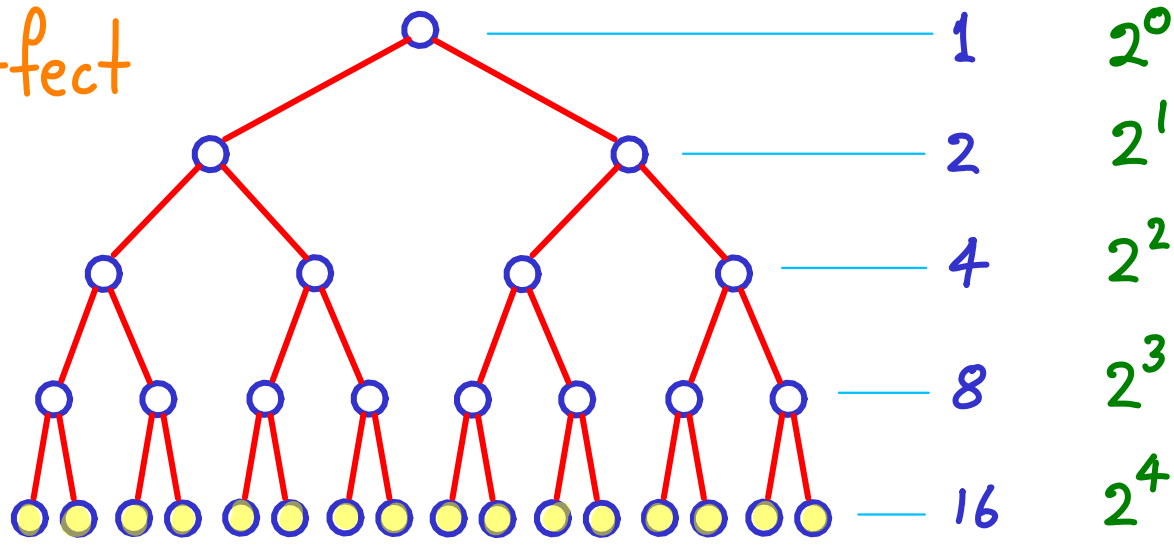
$$2^4 = 2^{L-1} = \#leaves = l$$

Let n = total #nodes. notice: n is odd

- how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \rightarrow \underline{L = \log_2(n+1)}$$

perfect



#nodes per level?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let n = total #nodes.

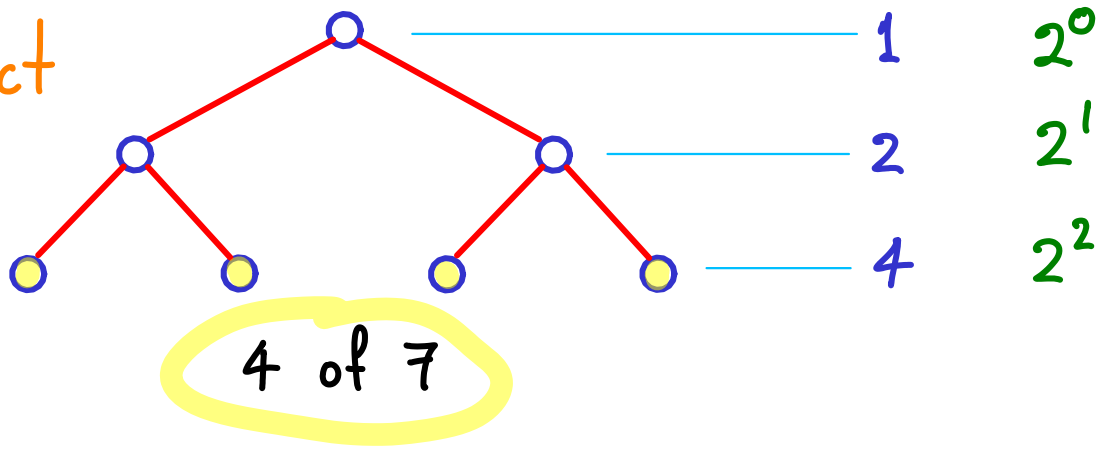
notice: n is odd

- how many levels?

- how many leaves?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \quad \rightarrow \quad L = \log_2(n+1)$$

perfect



#nodes per level?

↳ 2^i for level i

$i = \{0, 1, 2, \dots, L-1\}$

#levels = L

Let n = total #nodes.

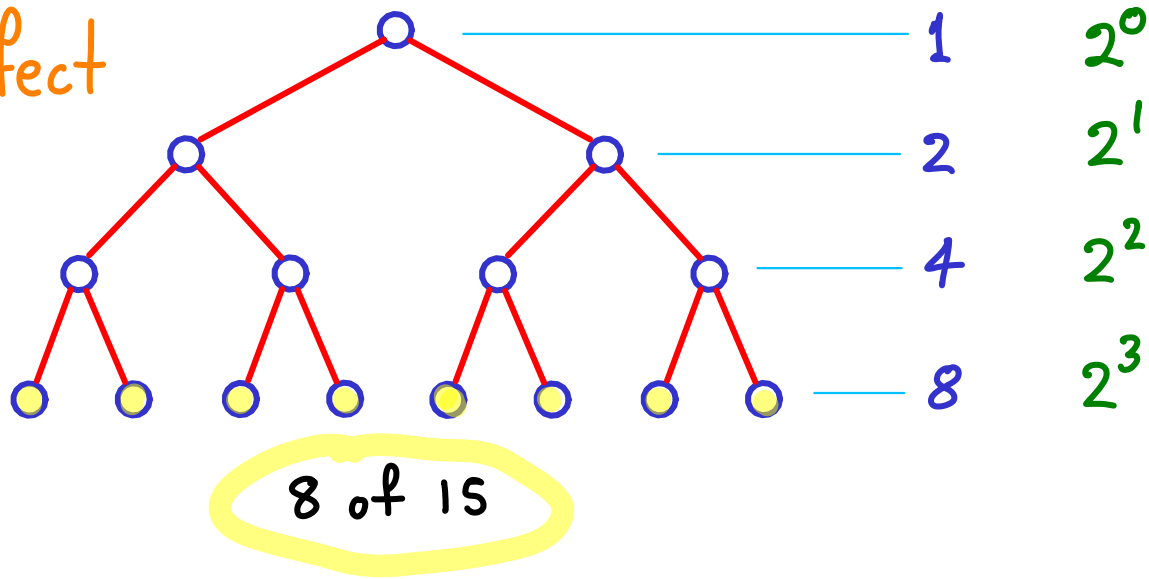
notice: n is odd

- how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \quad \rightarrow \quad L = \log_2(n+1)$$

- how many leaves?

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

Let n = total #nodes.

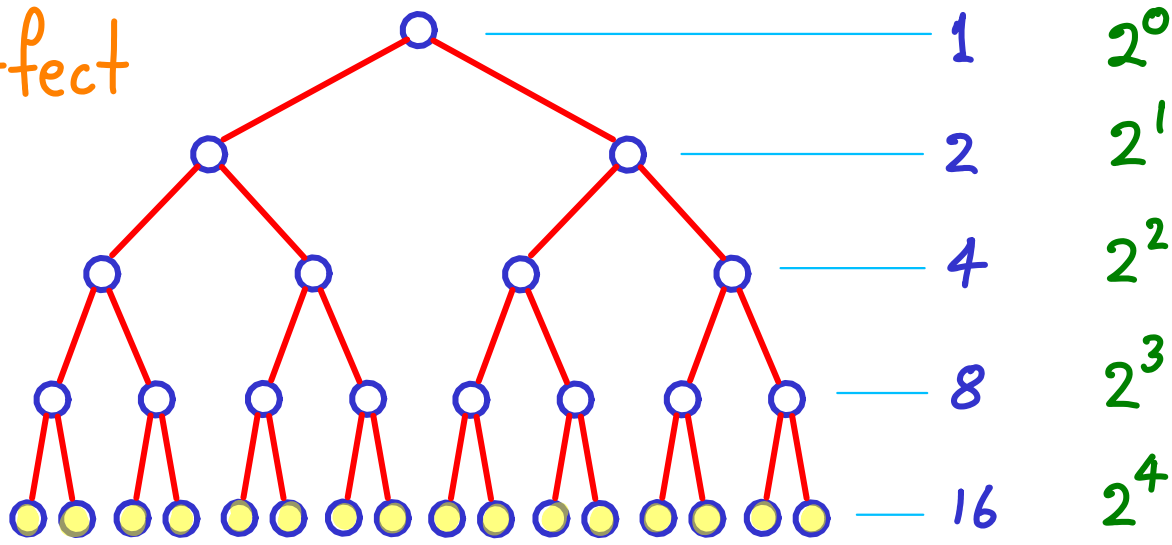
notice: n is odd

- how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \quad \rightarrow \quad L = \log_2(n+1)$$

- how many leaves?

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \text{\#leaves} = l$$

Let n = total #nodes. notice: n is odd

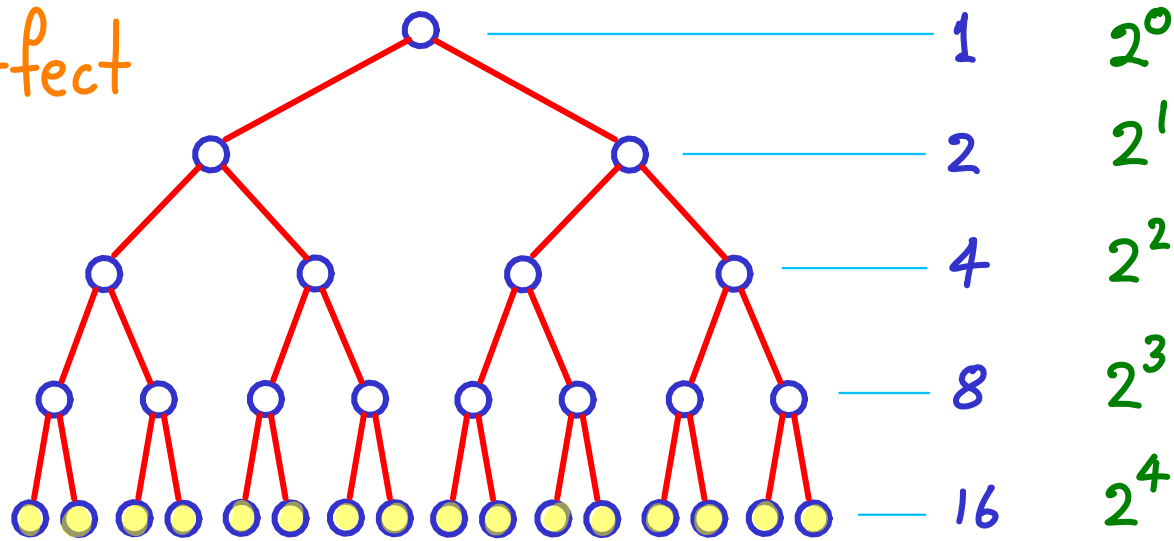
- how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \rightarrow L = \log_2(n+1)$$

- how many leaves?

16 of 31

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let n = total #nodes.

notice: n is odd

- how many levels?

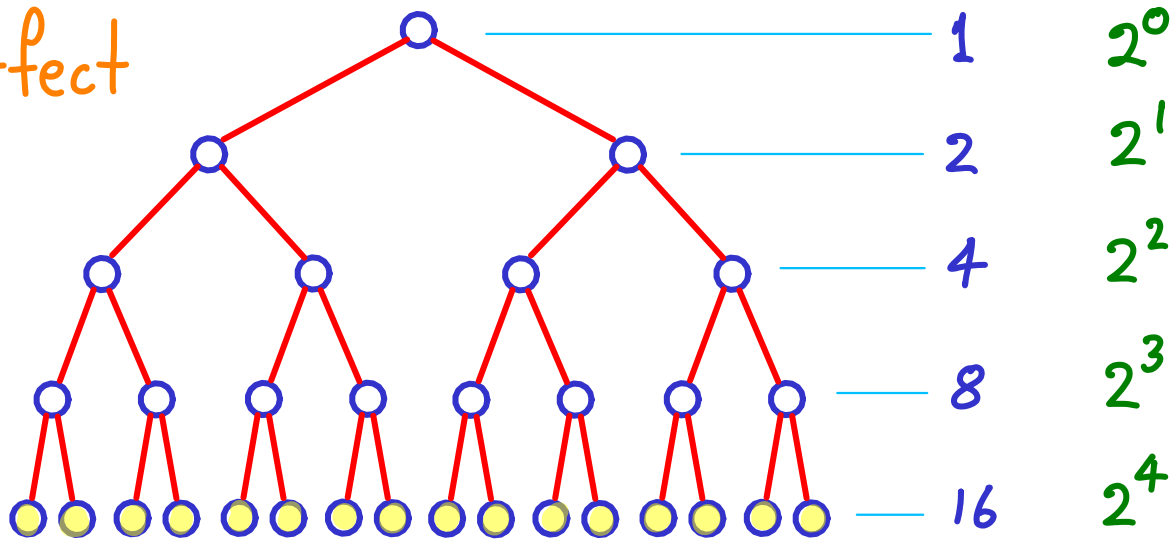
$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1$$

$$\rightarrow L = \log_2(n+1)$$

- how many leaves?

$$n = 2 \cdot 2^{L-1} - 1$$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = \underline{2^{L-1}} = \text{\#leaves} = \underline{l}$$

Let n = total #nodes.

notice: n is odd

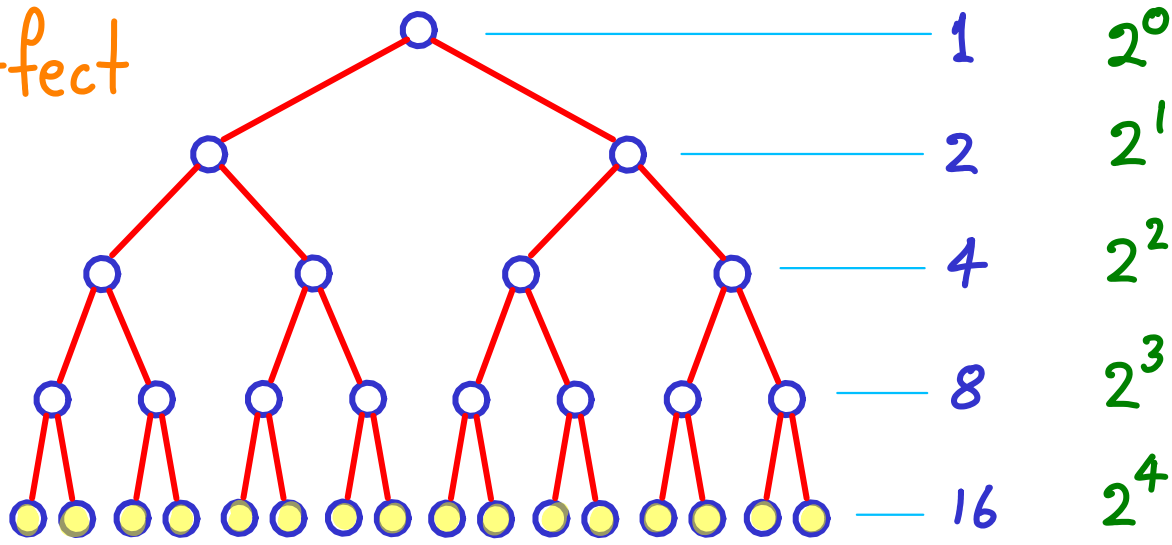
- how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \rightarrow L = \log_2(n+1)$$

- how many leaves?

$$n = 2 \cdot \underline{2^{L-1}} - 1 = 2 \underline{l} - 1$$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let n = total #nodes.

notice: n is odd

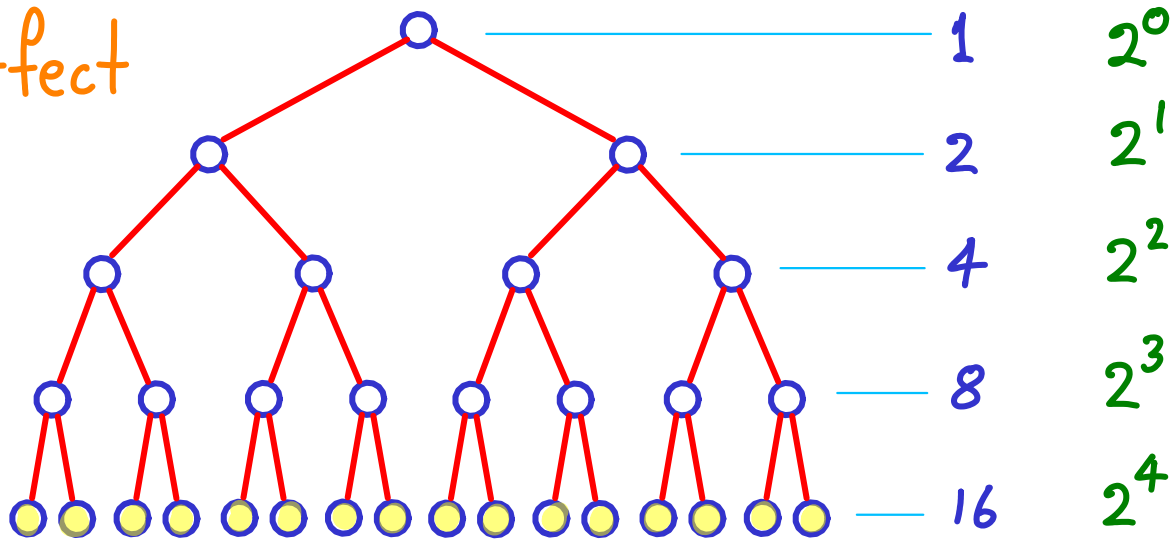
• how many levels ?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \rightarrow L = \log_2(n+1)$$

• how many leaves ?

$$n = 2 \cdot 2^{L-1} - 1 = 2l - 1 \rightarrow l = \frac{n+1}{2}$$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let n = total #nodes. notice: n is odd

- how many levels?

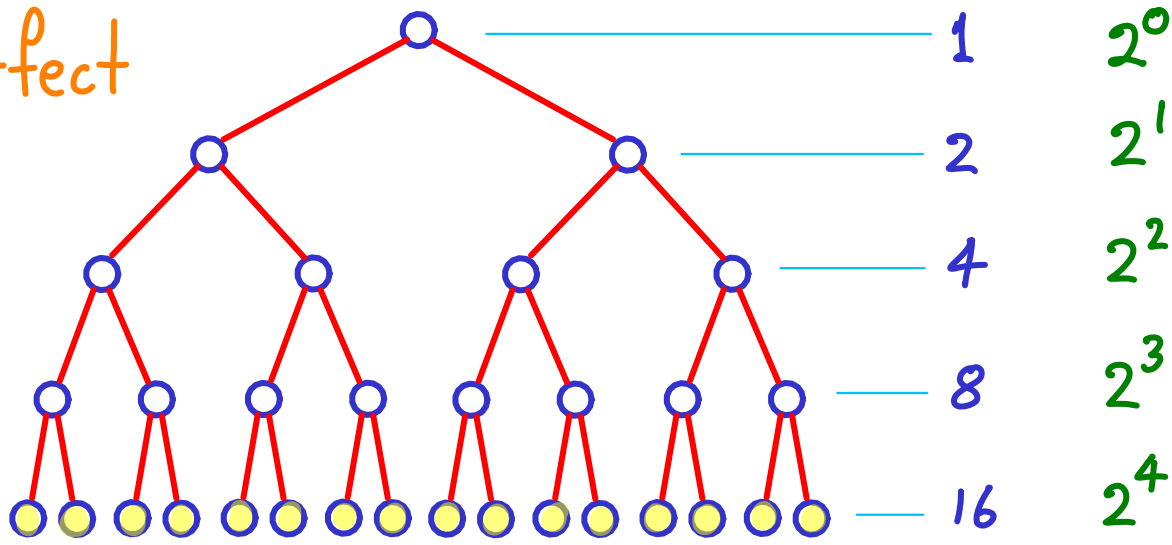
$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \rightarrow L = \log_2(n+1)$$

- how many leaves?

$$n = 2 \cdot 2^{L-1} - 1 = 2l - 1 \rightarrow l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$

- how many internal nodes?

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let n = total #nodes. notice: n is odd

• how many levels ?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \rightarrow L = \log_2(n+1)$$

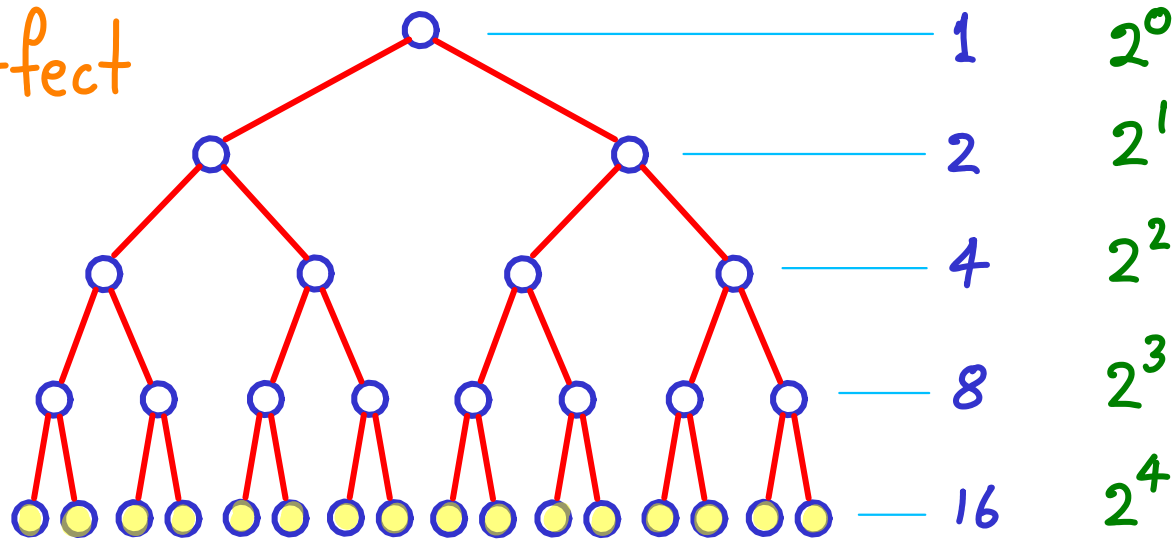
• how many leaves ?

$$n = 2 \cdot 2^{L-1} - 1 = 2l - 1 \rightarrow l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$

• how many internal nodes ?

$$(n - \#leaves)$$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \#leaves = l$$

Let $n =$ total #nodes. notice: n is odd

• how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \rightarrow L = \log_2(n+1)$$

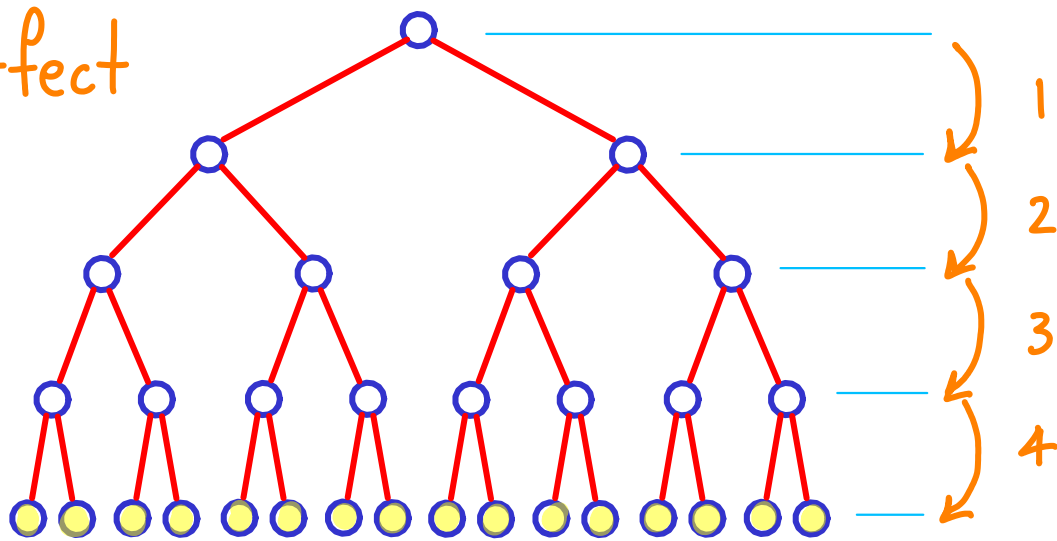
• how many leaves?

$$n = 2 \cdot 2^{L-1} - 1 = 2l - 1 \rightarrow l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$

• how many internal nodes?

$$\lfloor \frac{n}{2} \rfloor = \frac{n-1}{2} \quad (n - \#leaves)$$

perfect

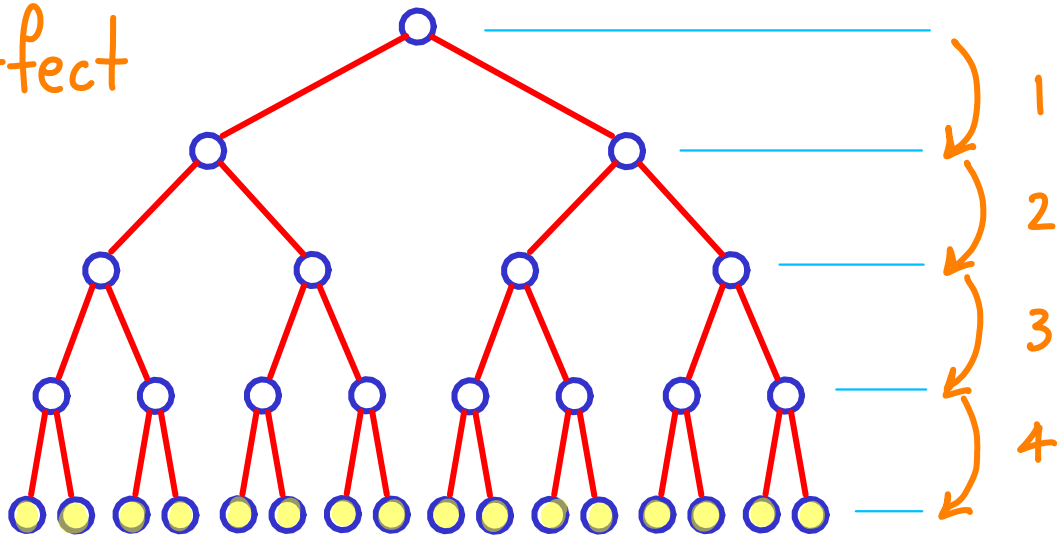


depth of tree



height of tree

perfect



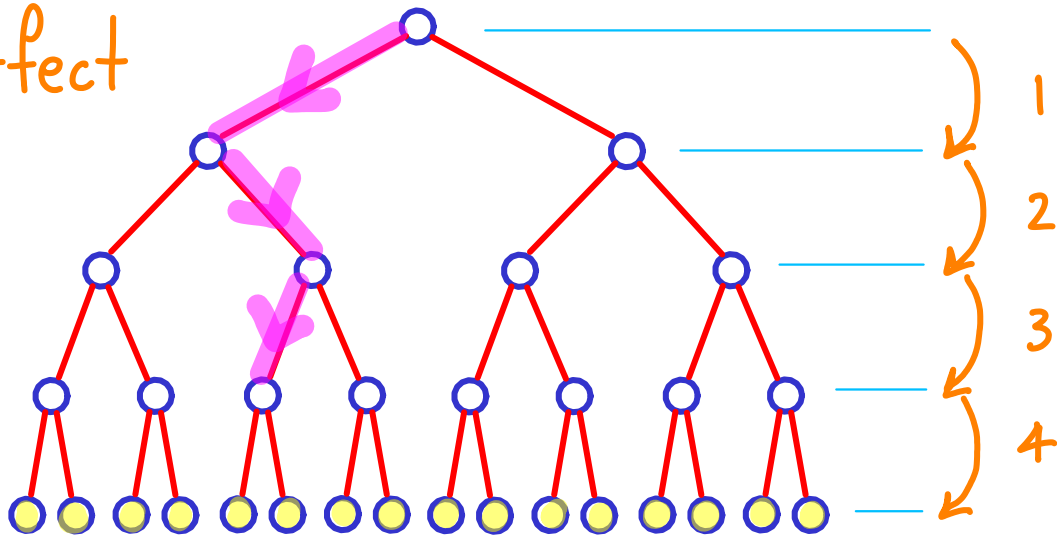
depth of tree



height of tree = h

h = number of "steps" (edges) from root to deepest leaf
lowest level

perfect



depth of tree

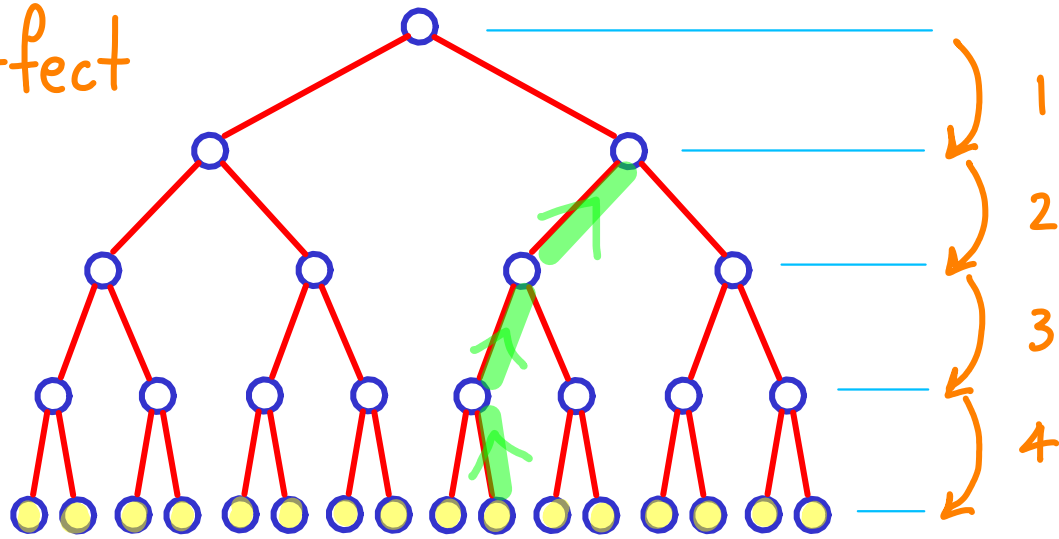


height of tree = h

h = number of "steps" (edges) from root to deepest leaf
lowest level

• depth of node = #steps from root

perfect



depth of tree

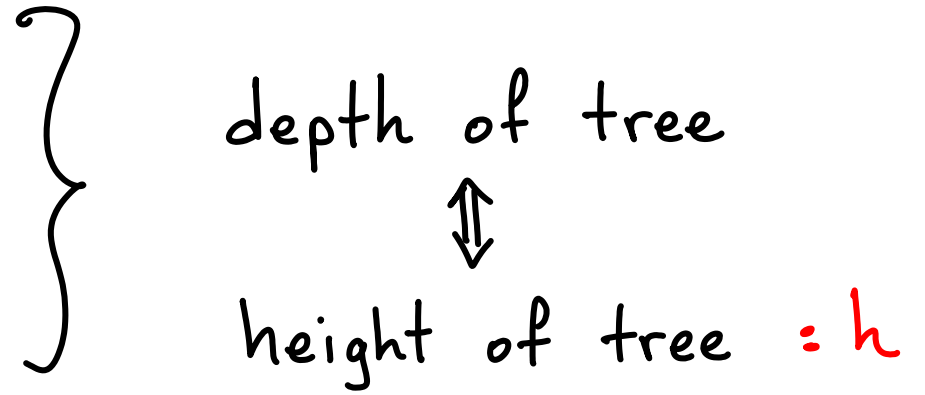


height of tree = h

h = number of "steps" (edges) from root to deepest leaf
lowest level

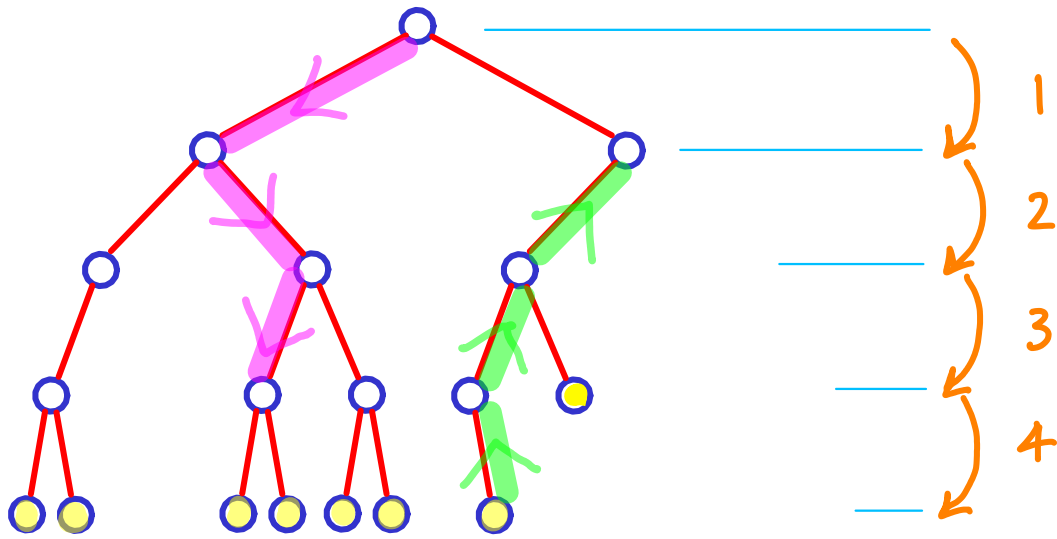
- depth of node = #steps from root

- height of node = #steps from deepest descendant



h = number of "steps" (edges) from root to deepest leaf
lowest level

- depth of node = #steps from root
- height of node = #steps from deepest descendant
- definitions hold for any tree



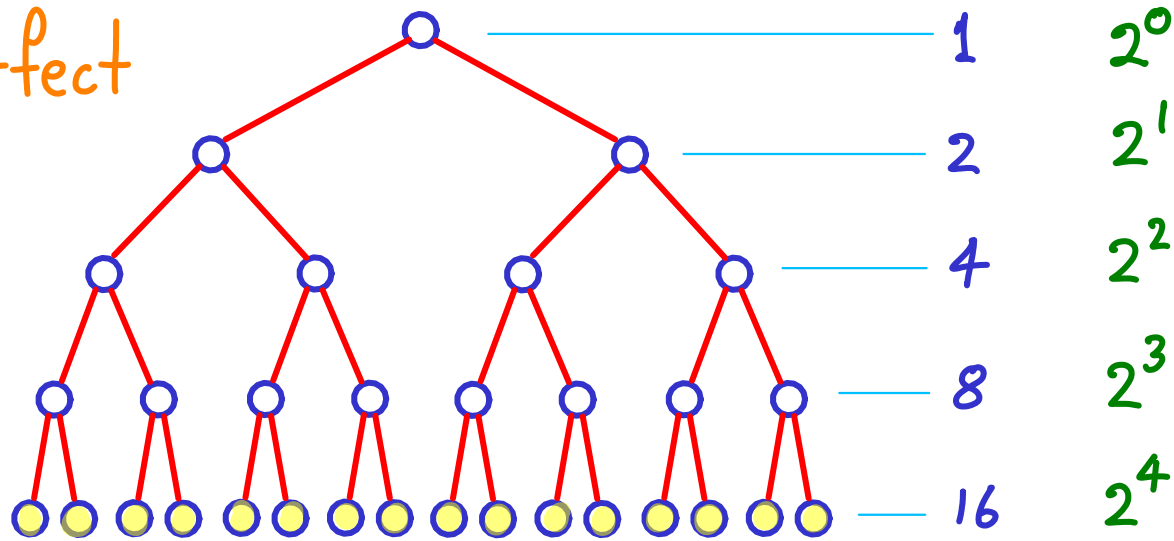
depth of tree
↕
height of tree = h

h = number of "steps" (edges) from root to deepest leaf
lowest level

- depth of node = #steps from root
- height of node = #steps from deepest descendant
- definitions hold for any tree

$$h = L - 1$$

perfect



#nodes per level?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \# \text{leaves} = l$$

Let $n = \text{total \#nodes}$.

notice: n is odd

• how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \rightarrow L = \log_2(n+1)$$

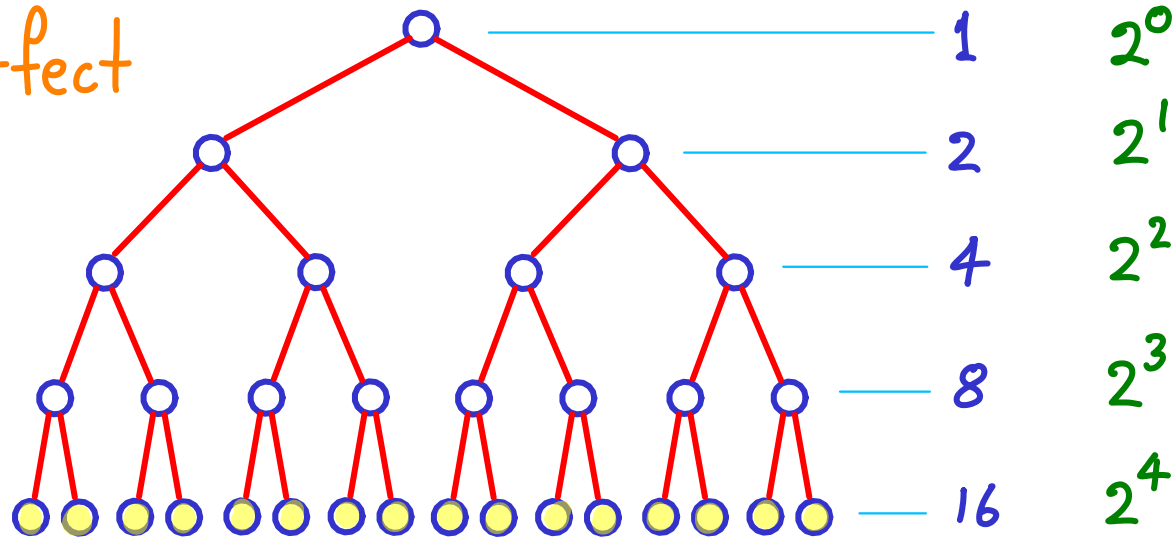
• how many leaves?

$$n = 2 \cdot 2^{L-1} - 1 = 2l - 1 \rightarrow l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$

• how many internal nodes?

$$\lfloor \frac{n}{2} \rfloor = \frac{n-1}{2} \quad (n - \# \text{leaves})$$

perfect



#nodes per level ?
↳ 2^i for level i
 $i = \{0, 1, 2, \dots, L-1\}$
#levels = L

$$2^4 = 2^{L-1} = \# \text{leaves} = l$$

$$h = L - 1$$

Let n = total #nodes.

notice: n is odd

• how many levels?

$$n = \sum_{i=0}^{L-1} 2^i = 2^L - 1 \rightarrow L = \log_2(n+1)$$

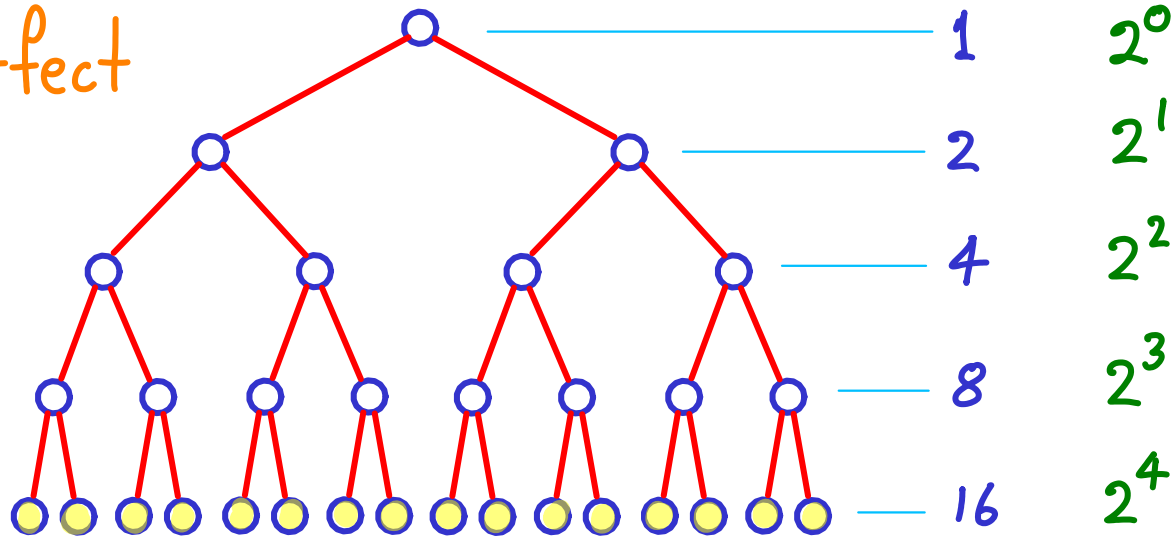
• how many leaves?

$$n = 2 \cdot 2^{L-1} - 1 = 2l - 1 \rightarrow l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$

• how many internal nodes?

$$\lfloor \frac{n}{2} \rfloor = \frac{n-1}{2} \quad (n - \# \text{leaves})$$

perfect



#nodes per level ?
 $\hookrightarrow 2^i$ for level i
 $i = \{0, 1, 2, \dots, L-1\}$
 #levels = L

$2^4 = 2^h = \text{\#leaves} = l$

$h = L - 1$

Let n = total #nodes.

notice: n is odd

• how many levels?

$n = \sum_{i=0}^h 2^i = 2^{h+1} - 1 \rightarrow h+1 = \log_2(n+1)$

• how many leaves?

$n = 2 \cdot 2^{L-1} - 1 = 2l - 1 \rightarrow l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$

• how many internal nodes?

$\lfloor \frac{n}{2} \rfloor = \frac{n-1}{2} \quad (n - \text{\#leaves})$

summary

l vs h

$$l = 2^h$$
$$h = \log_2 l$$

l vs n

$$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$
$$l = \# \text{internal nodes} + 1$$

h vs n

$$h+1 = \log_2(n+1)$$
$$n = 2^{h+1} - 1$$

Exact summary

l vs h

$$\begin{aligned} l &= 2^h \\ h &= \log_2 l \end{aligned}$$

Approximate summary



nothing to
approximate



l vs n

$$\begin{aligned} l &= \lceil \frac{n}{2} \rceil = \frac{n+1}{2} \\ l &= \# \text{internal nodes} + 1 \end{aligned}$$

h vs n

$$\begin{aligned} h+1 &= \log_2(n+1) \\ n &= 2^{h+1} - 1 \end{aligned}$$

Exact summary

l vs h

$$l = 2^h$$
$$h = \log_2 l$$

l vs n

$$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$
$$l = \# \text{internal nodes} + 1$$

h vs n

$$h+1 = \log_2(n+1)$$
$$n = 2^{h+1} - 1$$

Approximate summary

←

←

within ± 1

$$l \approx \frac{n}{2}$$

$$l \approx \# \text{internal nodes}$$

Exact summary

l vs h

$$l = 2^h$$
$$h = \log_2 l$$

l vs n

$$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$
$$l = \# \text{internal nodes} + 1$$

h vs n

$$h+1 = \log_2(n+1)$$
$$n = 2^{h+1} - 1$$

Approximate summary



within ± 1

$$l \approx \frac{n}{2}$$

$l \approx \# \text{internal nodes}$

$$h \approx \log_2 n$$

$$h = \Theta(\log n)$$

Exact summary

l vs h

$$l = 2^h$$
$$h = \log_2 l$$

l vs n

$$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$
$$l = \# \text{internal nodes} + 1$$

h vs n

$$h+1 = \log_2(n+1)$$
$$n = 2^{h+1} - 1$$

Approximate summary



within ± 1

$$l \approx \frac{n}{2}$$

$$l \approx \# \text{internal nodes}$$

$$h \approx \log_2 n$$

$$h = \Theta(\log n)$$

within factor of 2

$$n \approx 2^h$$

$$n = \Theta(2^h)$$

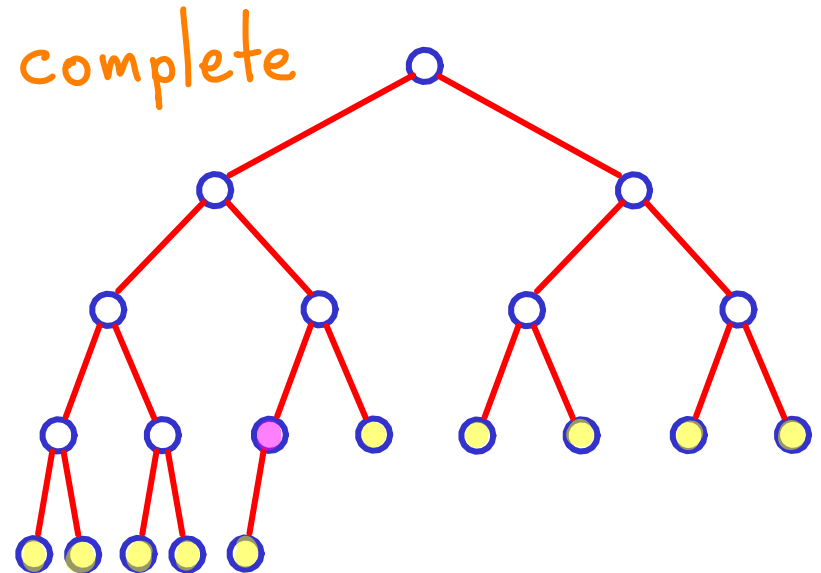
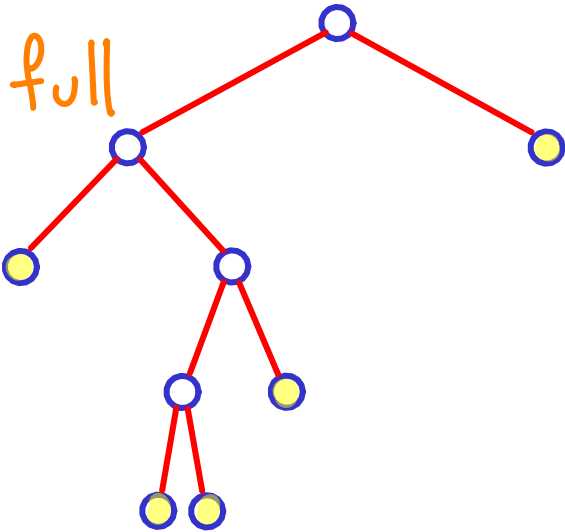
For perfect binary trees, we saw:

l vs n

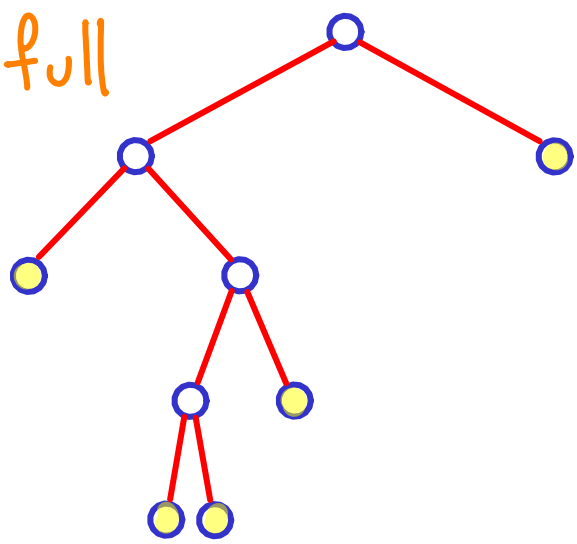
$$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$

$$l = \# \text{internal nodes} + 1$$

What about:



full

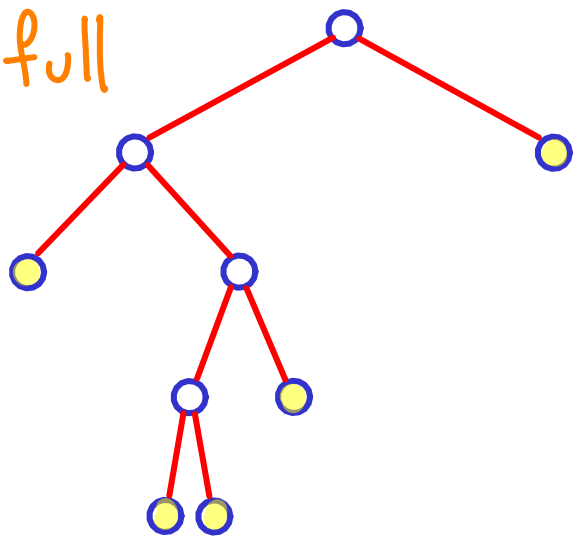


$$l = \# \text{internal nodes} + 1$$

?

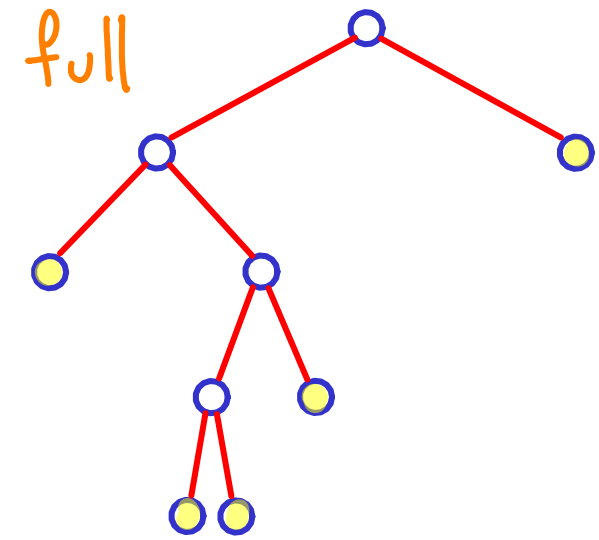
5 leaves
4 internal

full



$$l = \underline{\# \text{internal nodes}} + 1 = i + 1$$

Induction on i



$$l = \underline{\# \text{internal nodes}} + 1 = i + 1$$

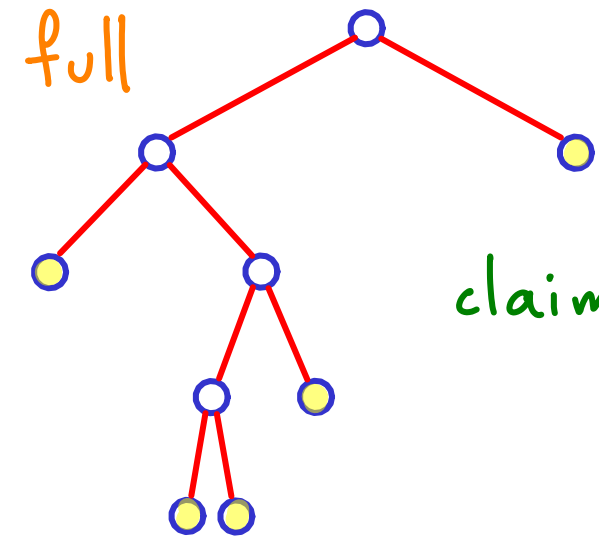
Induction on i

base case
trivial



$$l = 1 \quad i = 0$$

$$n = 1$$



base case
trivial

$$l = \underline{\# \text{internal nodes} + 1} = i + 1 \quad \left| \text{Induction on } i \right.$$

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

○

$l = 1 \quad i = 0$

$n = 1$

[illegible]

$$l = \text{#internal nodes} + 1 = i + 1 \quad \text{Induction on } i$$

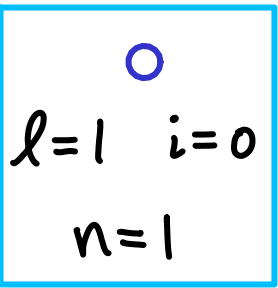
Induction on i

To prove for $i \geq 1$, hypothesis:
holds for full trees with $< i$ internal nodes.

claim holds for full trees with $\leq i$ internal nodes.

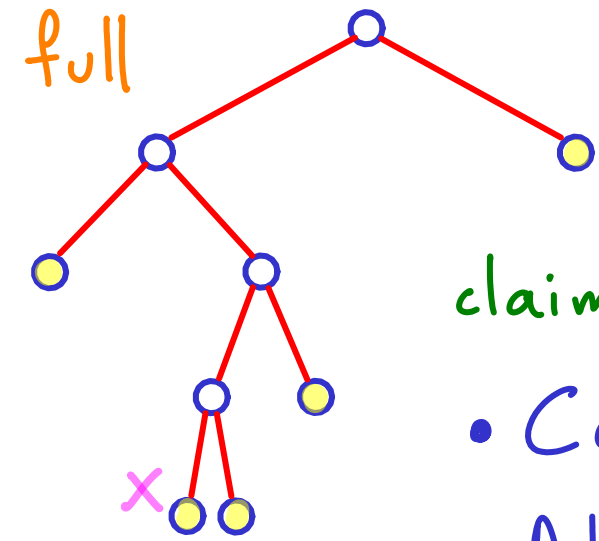
- Consider any full tree with i internal nodes.

base case
trivial



$$l=1 \quad i=0$$

$$n=1$$



base case
trivial

○

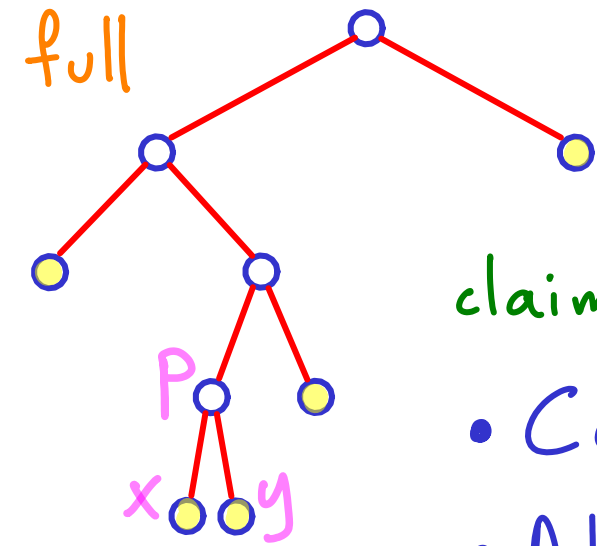
$$l=1 \quad i=0$$
$$n=1$$

$$l = \text{\#internal nodes} + 1 = i + 1 \quad \text{Induction on } i$$

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.
- At lowest level, $\exists$ leaf x .





base case
trivial

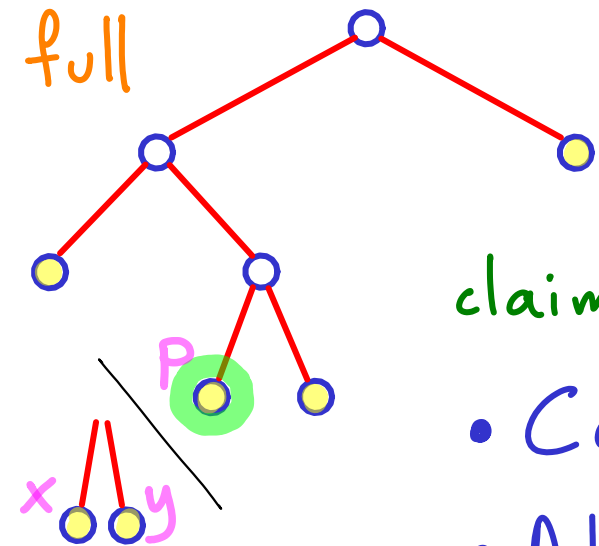
$$l = \text{\#internal nodes} + 1 = i + 1 \quad \text{Induction on } i$$

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.
- At lowest level, $\exists$ leaf x .
- x has a sibling y . (parent p of x has 2 children)


 $l = 1 \quad i = 0$
 $n = 1$

full



base case
trivial

$$l = \text{\#internal nodes} + 1 = i + 1 \quad \left| \text{Induction on } i \right.$$

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

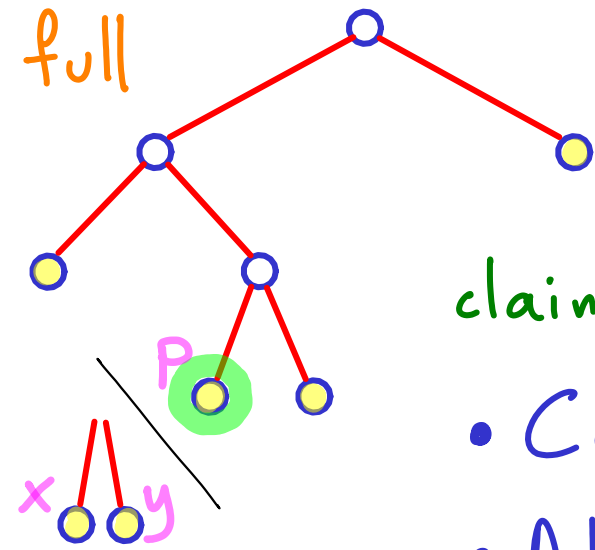
- Consider any full tree with i internal nodes.
- At lowest level, $\exists$ leaf x .
- x has a sibling y . (parent p of x has 2 children)
- Remove x & y : p becomes a leaf.



$$l = 1 \quad i = 0$$

$$n = 1$$

full



base case
trivial

$$l = \text{\#internal nodes} + 1 = i + 1$$

Induction on i

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

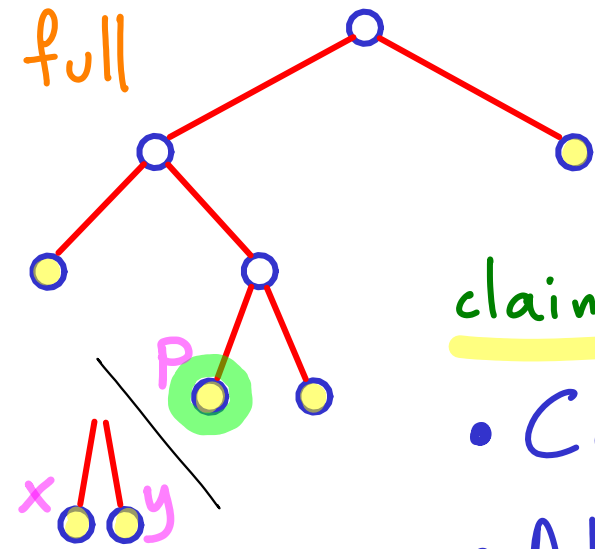
- Consider any full tree with i internal nodes.
- At lowest level, $\exists$ leaf x .
- x has a sibling y . (parent p of x has 2 children)
- Remove x & y : p becomes a leaf.
- New tree has $i-1$ internal nodes & is full.

○

$$l=1 \quad i=0$$

$$n=1$$

full



base case
trivial

○

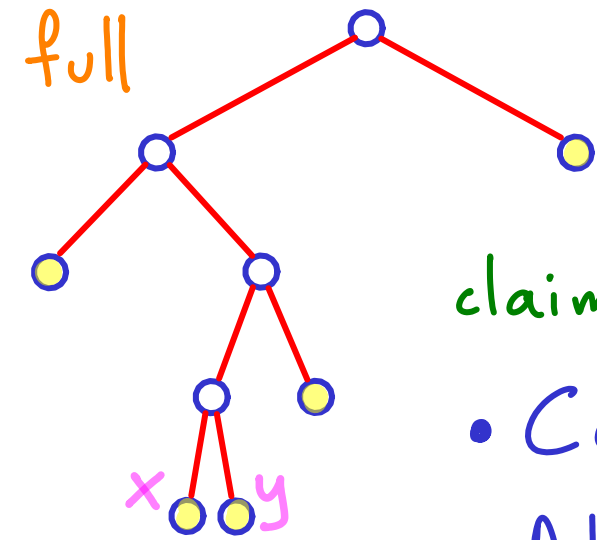
$$l=1 \quad i=0$$
$$n=1$$

$$l = \text{\#internal nodes} + 1 = i + 1$$

Induction on i

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.
- At lowest level, $\exists$ leaf x .
- x has a sibling y . (parent p of x has 2 children)
- Remove x & y : p becomes a leaf.
- New tree has $i-1$ internal nodes & is full.
 $\hookrightarrow$ has i leaves by hypothesis.



base case
trivial

$\begin{aligned} &\circ \\ l=1 \quad i=0 \\ n=1 \end{aligned}$
--

$$l = \text{\#internal nodes} + 1 = i + 1 \quad \Bigg| \text{Induction on } i$$

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.
- At lowest level, $\exists$ leaf x .
- x has a sibling y . (parent p of x has 2 children)
- Remove x & y : p becomes a leaf.
- New tree has $i-1$ internal nodes & is full.
 $\hookrightarrow$ has i leaves by hypothesis.
- Put x & y back. +2 leaves

full

claim

- C

$$l = \underline{\# \text{ internal nodes}} + 1 = i + 1$$

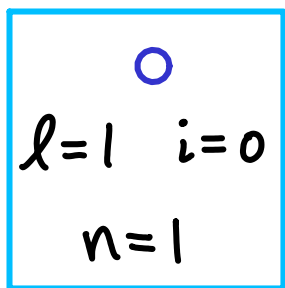
Induction on i

To prove for $i \geq 1$, hypothesis:

claim holds for full trees with $\leq i$ internal nodes.

- Consider any full tree with i internal nodes.
- At lowest level, $\exists$ leaf x .
- x has a sibling y . (parent p of x has 2 children)
- Remove x & y : p becomes a leaf.
- New tree has $i-1$ internal nodes & is full.
↳ has i leaves by hypothesis.
- Put x & y back. +2 leaves
- $p \rightarrow$ internal : -1 leaf

base case
trivial



full

claim

- C

$$l = \text{\#internal nodes} + 1 = i + 1 \quad \Bigg| \quad \text{Induction on } i$$

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.
 - At lowest level, $\exists$ leaf x .
 - x has a sibling y . (parent p of x has 2 children)
 - Remove x & y : p becomes a leaf.
 - New tree has $i-1$ internal nodes & is full.
 $\hookrightarrow$ has i leaves by hypothesis.
 - Put x & y back. $+2$ leaves
 - $p \rightarrow$ internal : -1 leaf
- } $i+1$ leaves

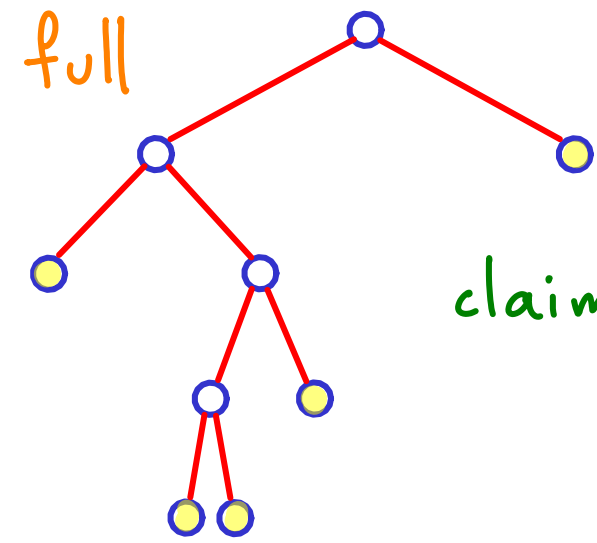
base case
trivial

O

$$l=1 \quad i=0$$
$$n=1$$

Alternate proof

(for practice)



base case
trivial

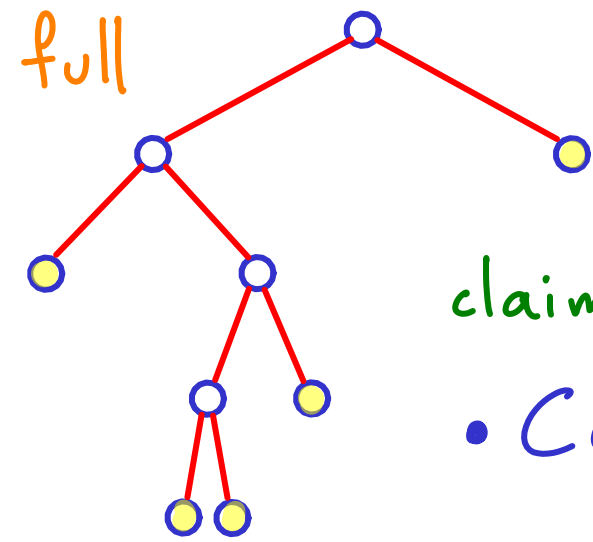
$$l = \underline{\# \text{internal nodes} + 1} = i + 1 \quad \Bigg| \quad \text{Induction on } i$$

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

○

$$l = 1 \quad i = 0$$
$$n = 1$$

full



base case
trivial


 $l=1 \quad i=0$
 $n=1$

$$l = \underline{\# \text{internal nodes} + 1} = i + 1$$

Induction on i

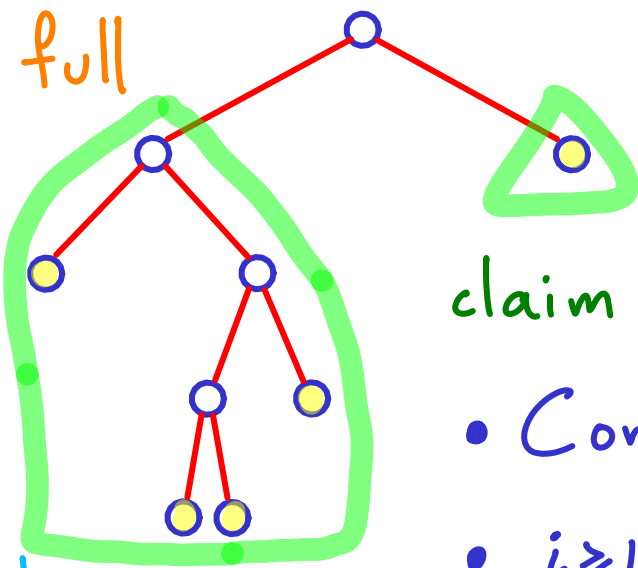
To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.

full

$$l = \# \text{internal nodes} + 1 = i + 1$$

Induction on i



base case
trivial

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

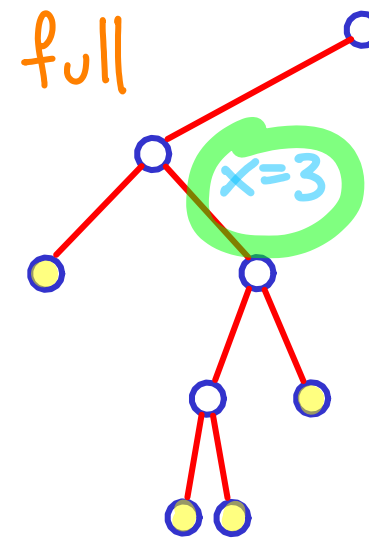
- Consider any full tree with i internal nodes.
- $i \geq 1$ so the root has 2 non-empty subtrees.



$$l = 1 \quad i = 0$$

$$n = 1$$

full



base case
trivial

$$l = \# \text{internal nodes} + 1 = i + 1$$

Induction on i

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.
- $i \geq 1$ so the root has 2 non-empty subtrees.
- Left subtree has x internal nodes, right subtree has y .



$$l = 1 \quad i = 0$$

$$n = 1$$

full

claim

- C

base case
trivial

$$l = \text{\#internal nodes} + 1 = i + 1$$

Induction on i

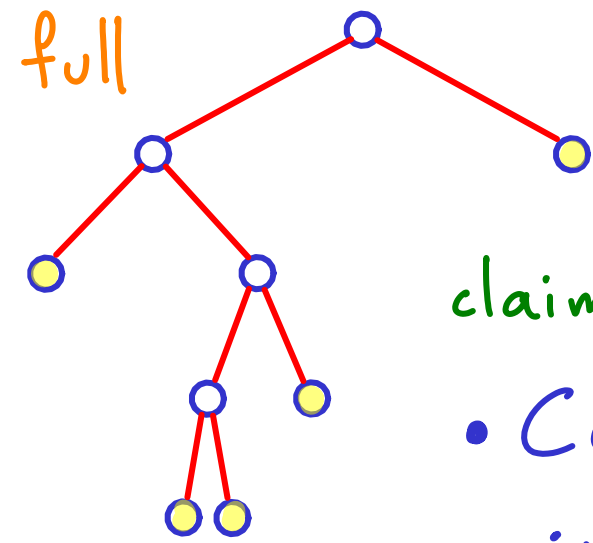
To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.
- $i \geq 1$ so the root has 2 non-empty subtrees.
- Left subtree has x internal nodes, right subtree has y .
- $x + y = i - 1$ (excluding root)

$$l=1 \quad i=0$$

$$n=1$$

full



base case
trivial


 $l=1 \quad i=0$
 $n=1$

$$l = \underline{\# \text{internal nodes} + 1} = i + 1$$

Induction on i

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

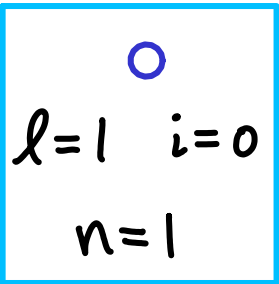
- Consider any full tree with i internal nodes.
- $i \geq 1$ so the root has 2 non-empty subtrees.
- Left subtree has x internal nodes, right subtree has y .
- $x + y = i - 1$ (excluding root) $\rightarrow \underline{x \leq i - 1}$ & $\underline{y \leq i - 1}$

full

claim

- C

base case
trivial



$$l = \text{\#internal nodes} + 1 = i + 1$$

Induction on i

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.
- $i \geq 1$ so the root has 2 non-empty subtrees.
- Left subtree has x internal nodes, right subtree has y .
- $x + y = i - 1$ (excluding root) $\rightarrow x \leq i - 1$ & $y \leq i - 1$
- Subtrees are full

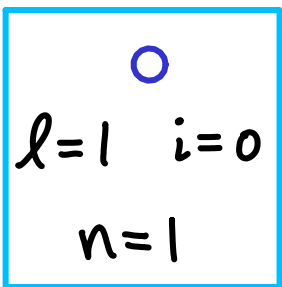
→ by contradiction

full

claim

- C

base case
trivial



$$l = \underline{\# \text{ internal nodes}} + 1 = i + 1$$

Induction on i

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

- Consider any full tree with i internal nodes.
- $i \geq 1$ so the root has 2 non-empty subtrees.
- Left subtree has x internal nodes, right subtree has y .
- $x + y = i - 1$ (excluding root) $\rightarrow \underline{x \leq i - 1}$ & $\underline{y \leq i - 1}$
- Subtrees are full, so by hypothesis,
left subtree has $x + 1$ leaves & right subtree has $y + 1$.

[illegible]

base case
trivial

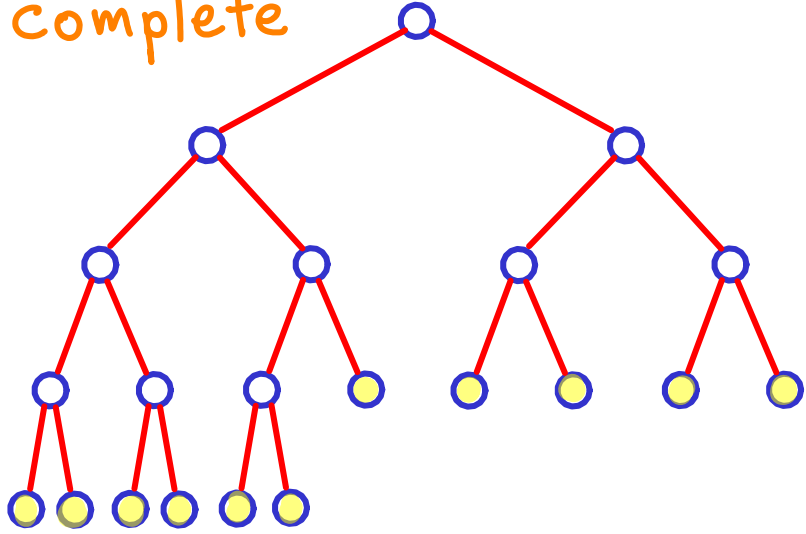
$$l = \underline{\# \text{ internal nodes}} + 1 = i + 1$$

Induction on i

To prove for $i \geq 1$, hypothesis:
claim holds for full trees with $< i$ internal nodes.

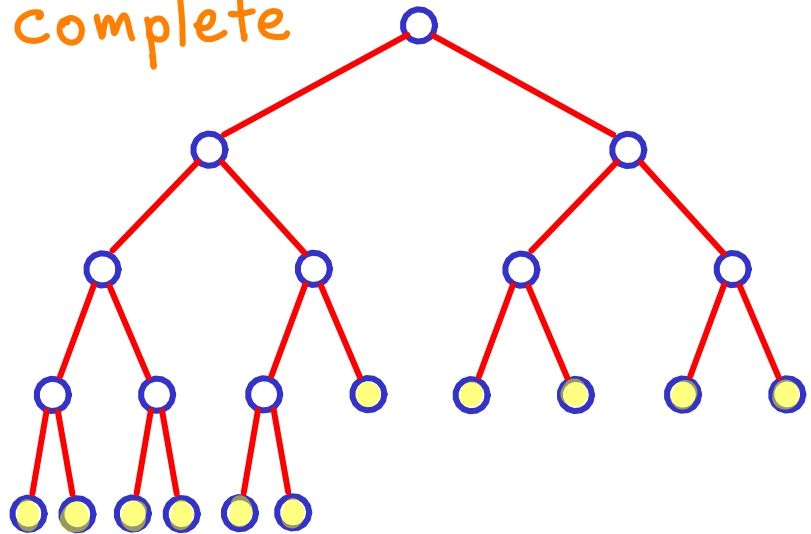
- Consider any full tree with i internal nodes.
- $i \geq 1$ so the root has 2 non-empty subtrees.
- Left subtree has x internal nodes, right subtree has y .
- $x + y = i - 1$ (excluding root) $\rightarrow x \leq i - 1$ & $y \leq i - 1$
- Subtrees are full, so by hypothesis,
left subtree has $x + 1$ leaves & right subtree has $y + 1$.
- Combined, they have $x + y + 2$ = $(i - 1) + 2$ = $i + 1$ leaves $\square$

complete



n is odd, tree is full.

complete

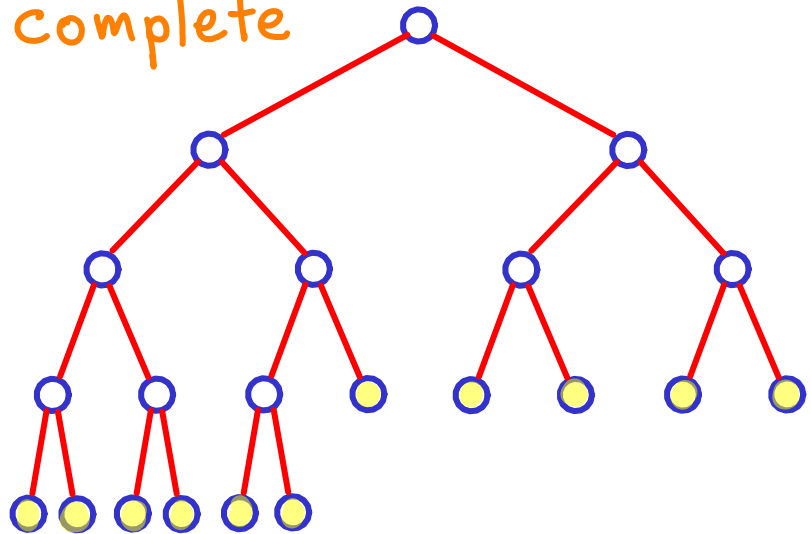


n is odd, tree is full.

$l = \# \text{internal nodes} + 1$

$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$

complete

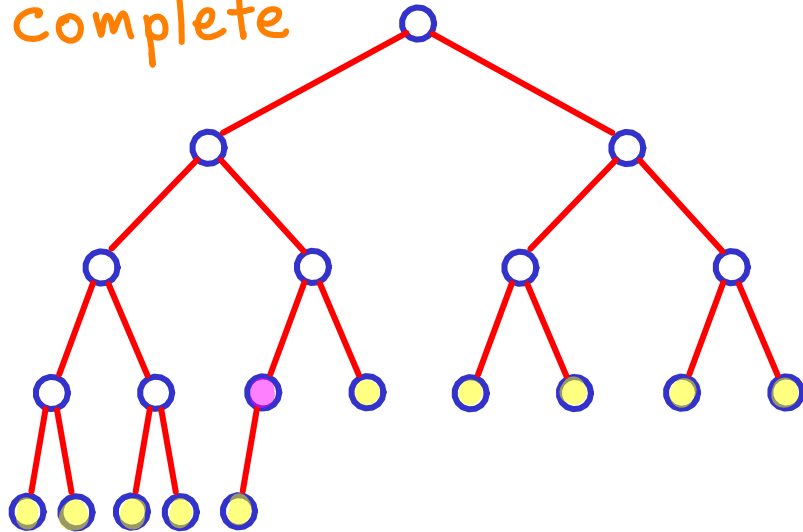


n is odd, tree is full.

$l = \# \text{internal nodes} + 1$

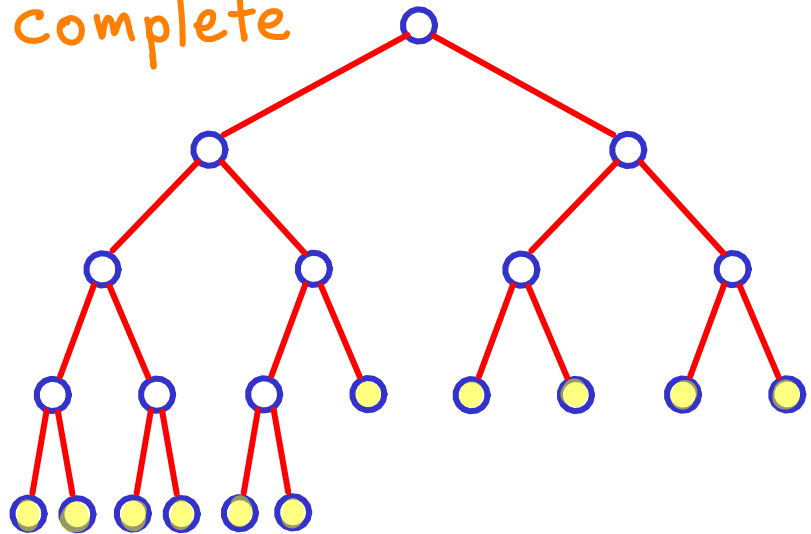
$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$

complete



n is even, tree is not full.

complete

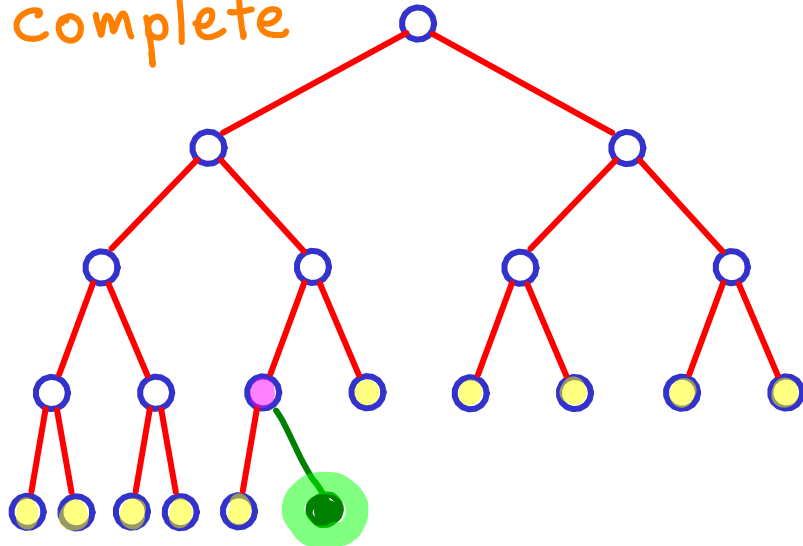


n is odd, tree is full.

$l = \# \text{internal nodes} + 1$

$$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$

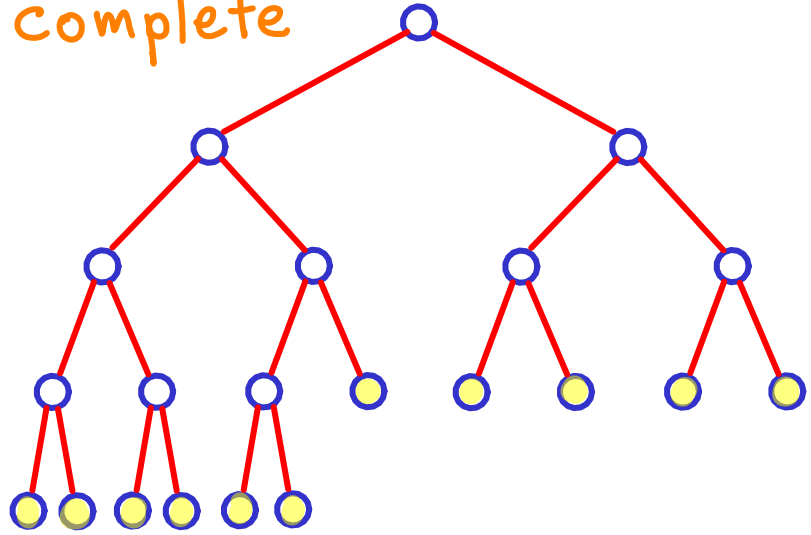
complete



n is even, tree is not full.

• can add one leaf...

complete

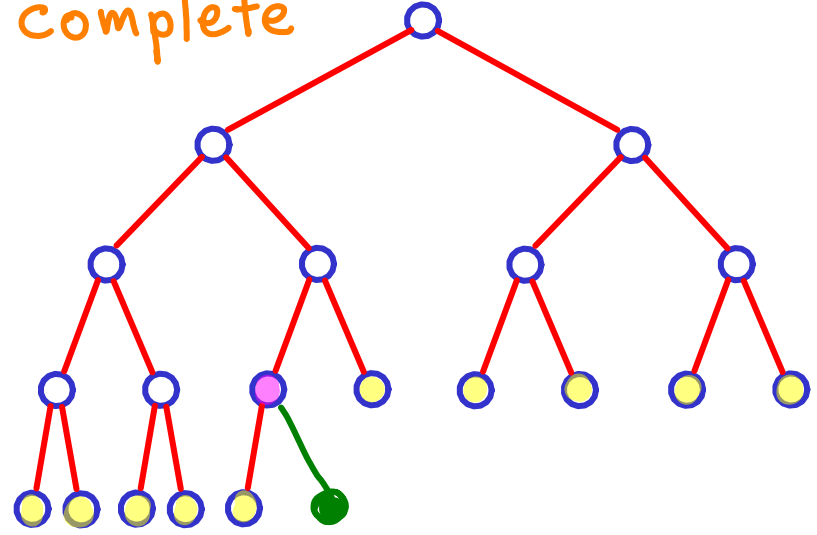


n is odd, tree is full.

$l = \# \text{internal nodes} + 1$

$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$

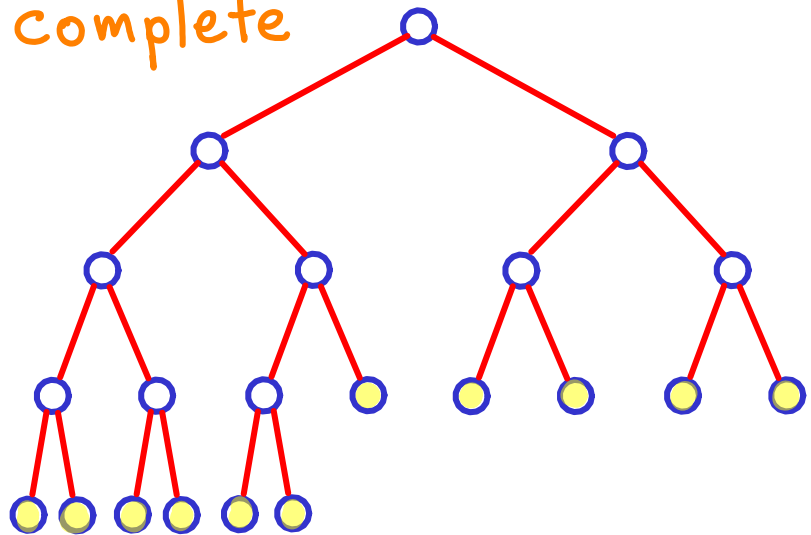
complete



n is even, tree is not full.

- can add one leaf...
- new tree has $n+1$ nodes & is full

complete

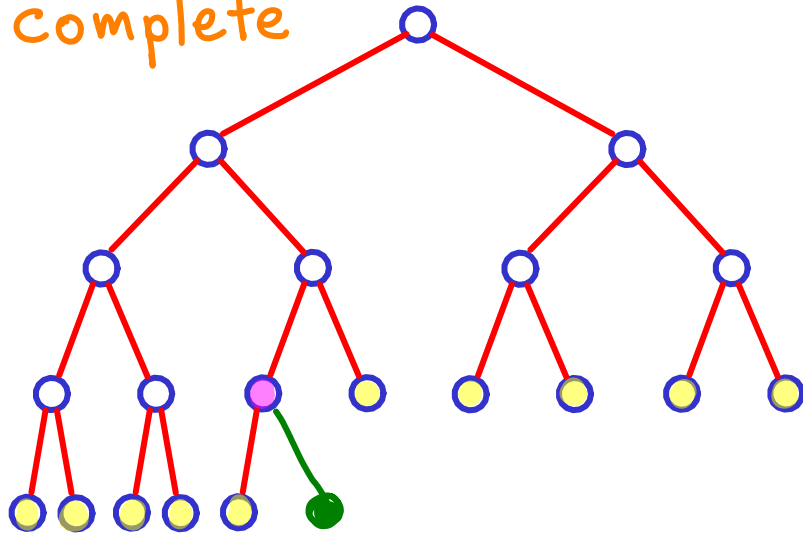


n is odd, tree is full.

$l = \# \text{internal nodes} + 1$

$$l = \left\lceil \frac{n}{2} \right\rceil = \frac{n+1}{2}$$

complete

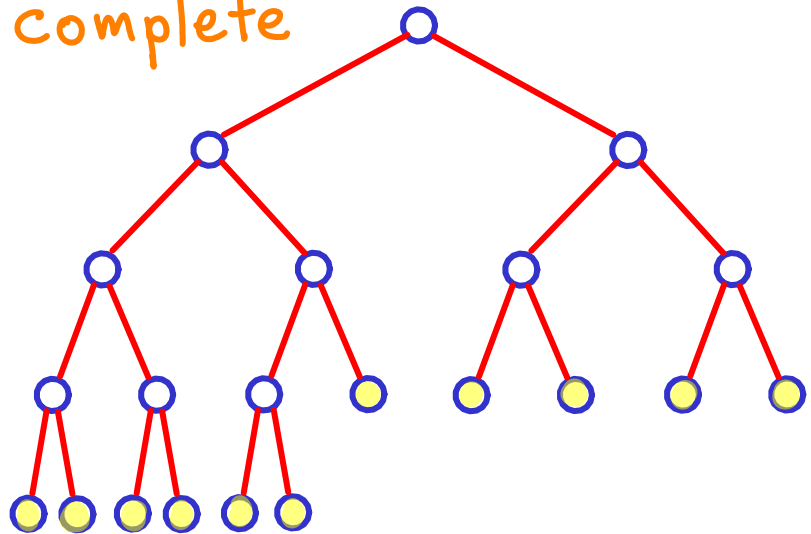


n is even, tree is not full.

- can add one leaf...
- new tree has $n+1$ nodes & is full

$$\underline{l+1} = \frac{(\underline{n+1})+1}{2}$$

complete

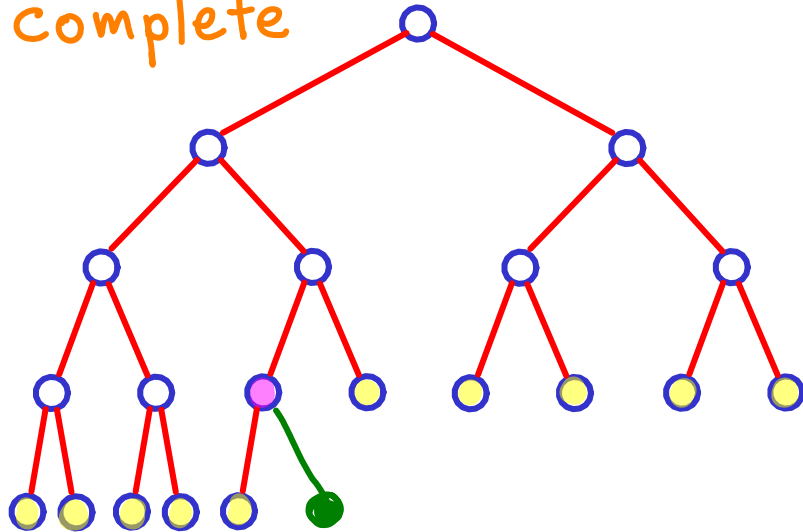


n is odd, tree is full.

$l = \# \text{internal nodes} + 1$

$$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$

complete

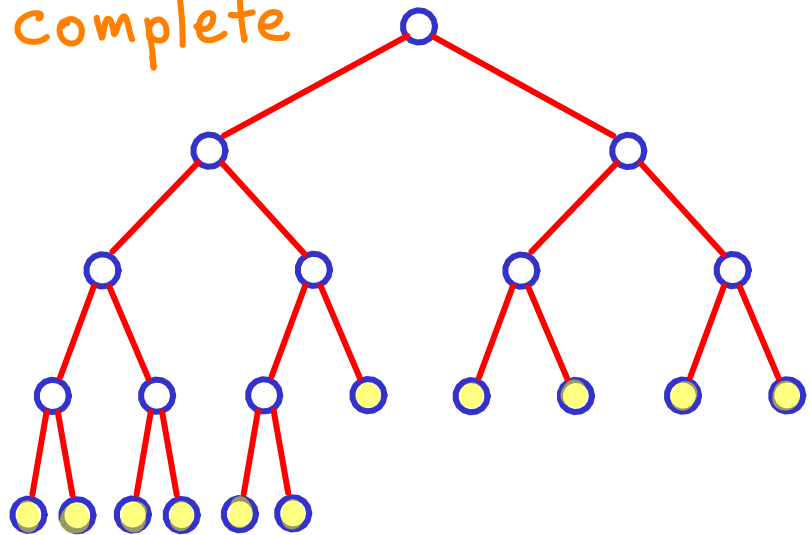


n is even, tree is not full.

- can add one leaf...
- new tree has $n+1$ nodes & is full

$$l+1 = \frac{(n+1)+1}{2} \rightarrow l = \frac{n}{2}$$

complete

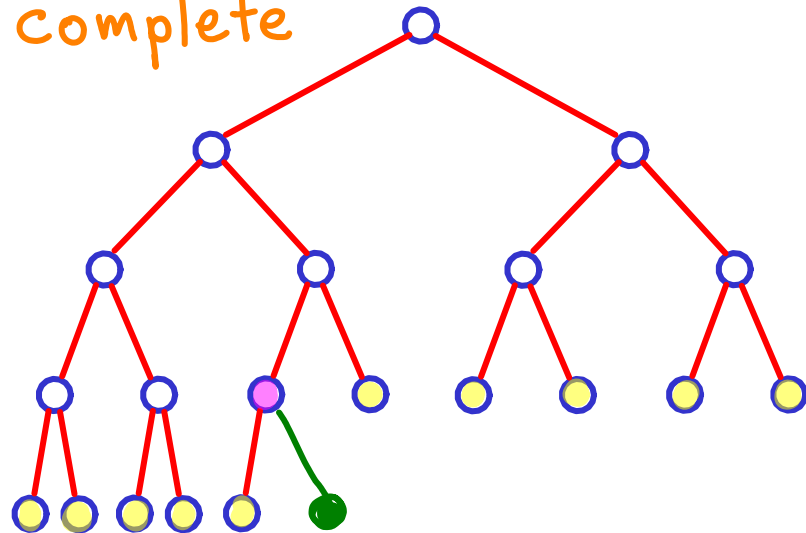


n is odd, tree is full.

$l = \# \text{internal nodes} + 1$

$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$

complete

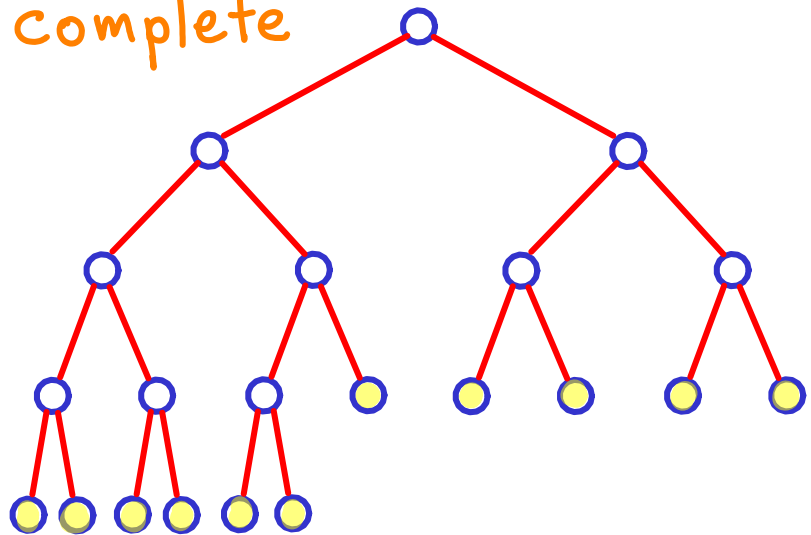


n is even, tree is not full.

- can add one leaf...
- new tree has $n+1$ nodes & is full

$l+1 = \frac{(n+1)+1}{2} \rightarrow l = \frac{n}{2} = \lceil \frac{n}{2} \rceil$

complete

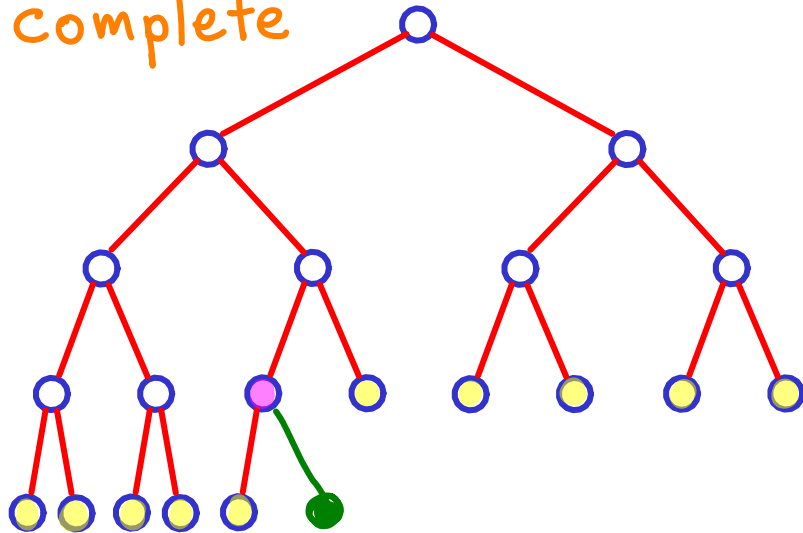


n is odd, tree is full.

$$l = \# \text{internal nodes} + 1$$

$$l = \lceil \frac{n}{2} \rceil = \frac{n+1}{2}$$

complete



n is even, tree is not full.

- can add one leaf...
- new tree has $n+1$ nodes & is full

$$l+1 = \frac{(n+1)+1}{2} \rightarrow l = \frac{n}{2} = \lceil \frac{n}{2} \rceil$$

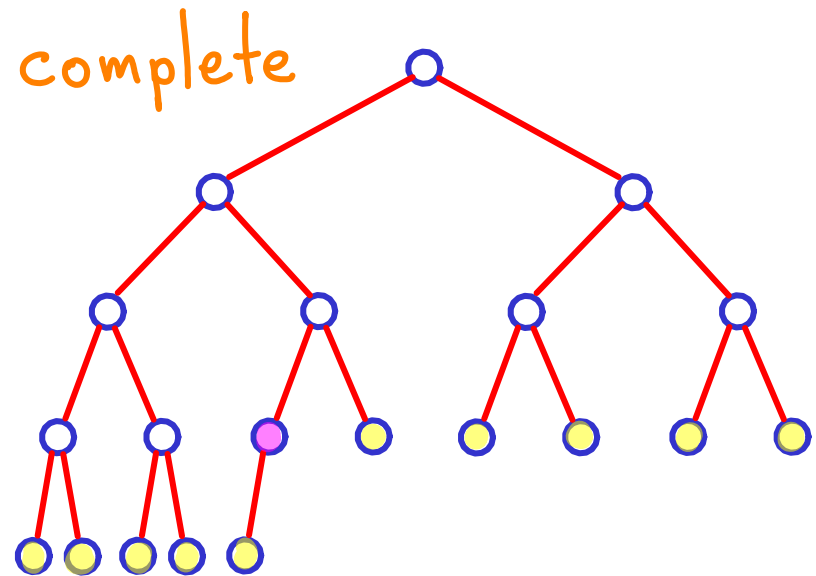
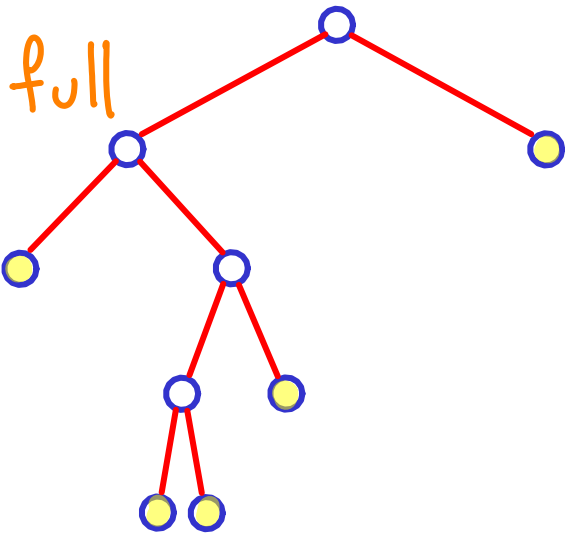
$$l = \# \text{internal nodes}$$

For perfect binary trees, we saw:

l vs h

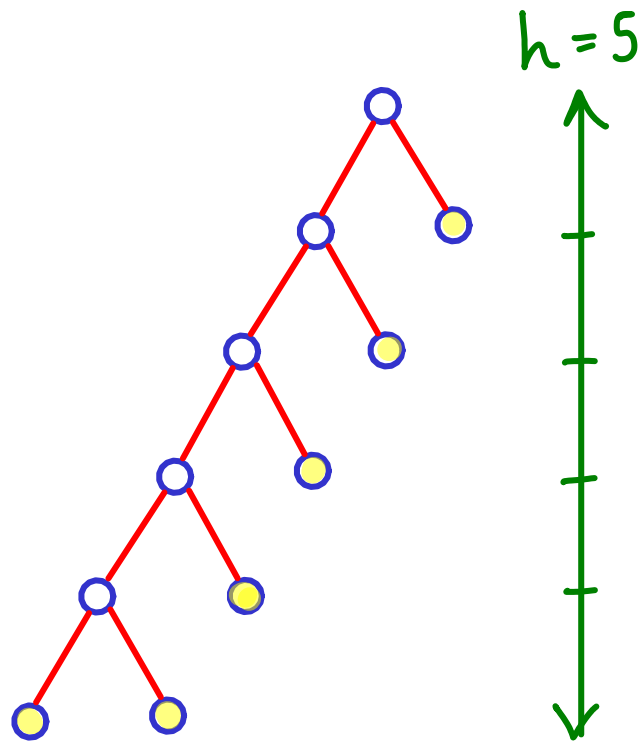
$$l = 2^h$$
$$h = \log_2 l$$

What about:



full

can get $l = h+1$

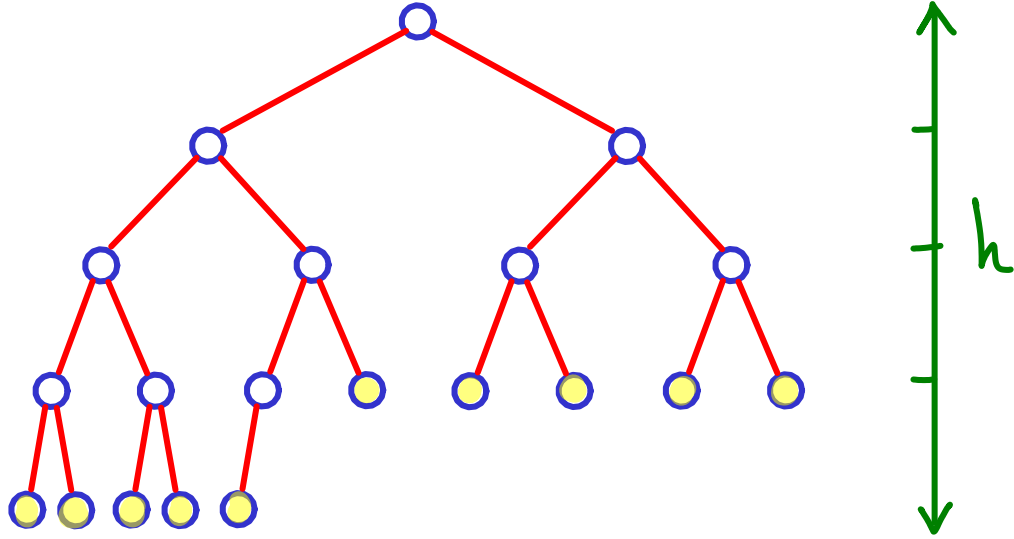


$$l = 6$$

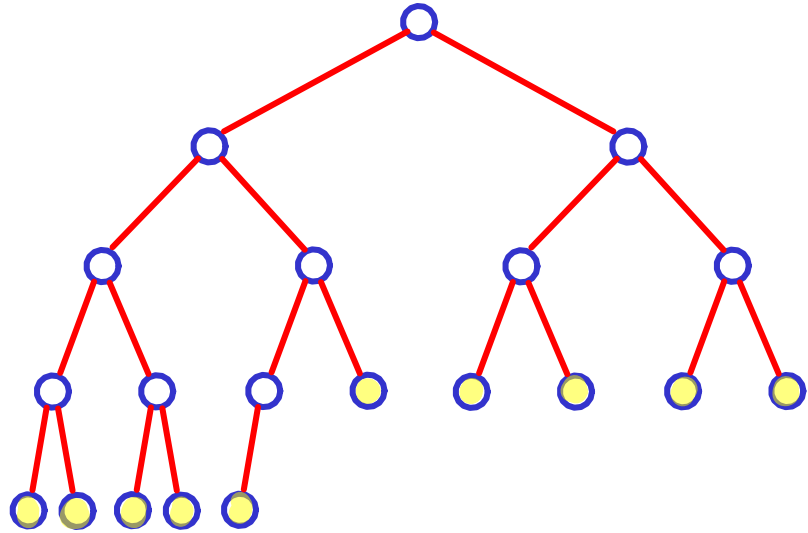
$$l \neq 2^h$$
$$h \neq \log_2 l$$

not even $h = \Theta(\log l)$

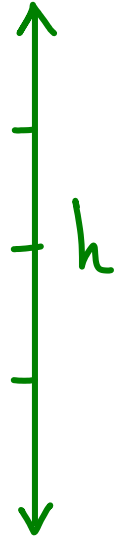
complete
 n nodes $\rightarrow$ what is h ?



complete
n nodes $\rightarrow$ what is h ?

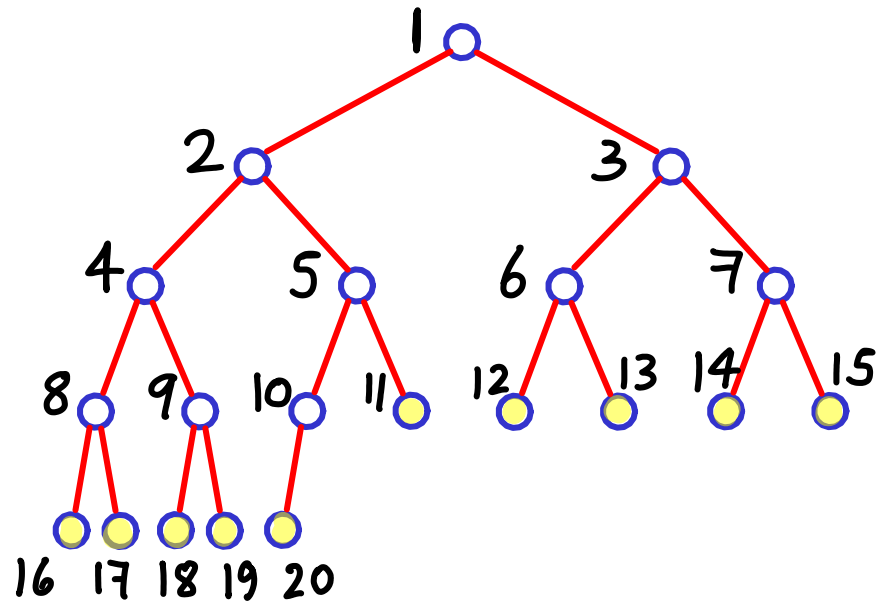


Intuition: h doesn't change much
compared to perfect tree



complete
n nodes $\rightarrow$ what is h?

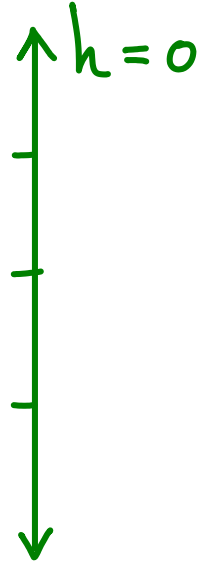
Intuition: h doesn't change much
compared to perfect tree



complete
n nodes $\rightarrow$ what is h?

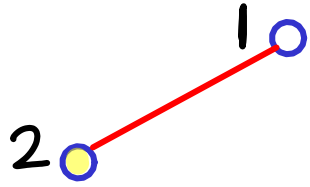
10

Intuition: h doesn't change much
compared to perfect tree

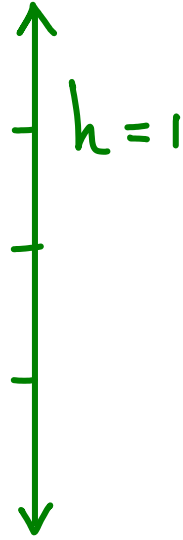


$$h = \log_2 n$$

complete
n nodes $\rightarrow$ what is h?

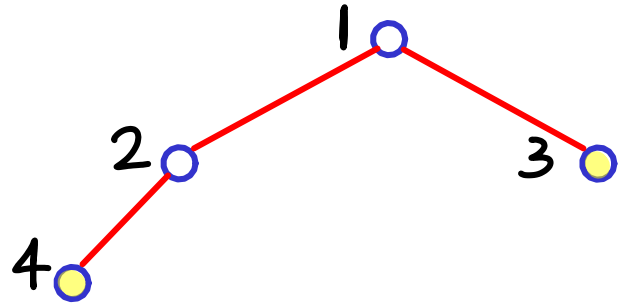


Intuition: h doesn't change much
compared to perfect tree

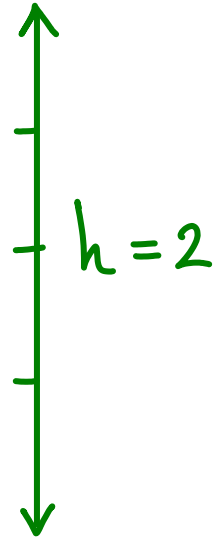


$$h = \log_2 n$$

complete
n nodes $\rightarrow$ what is h?

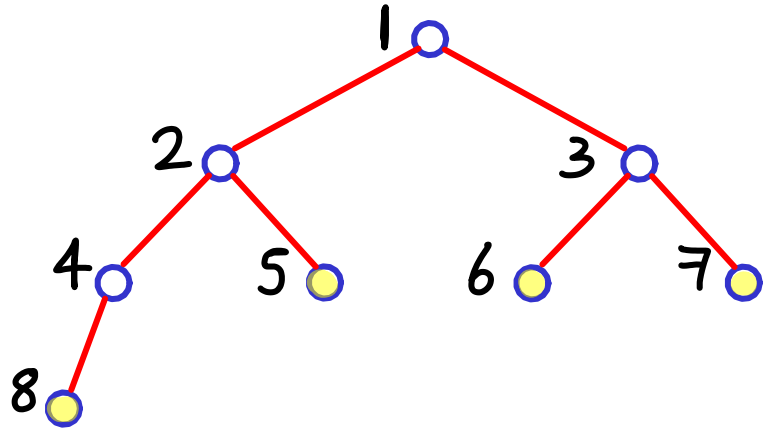


Intuition: h doesn't change much
compared to perfect tree

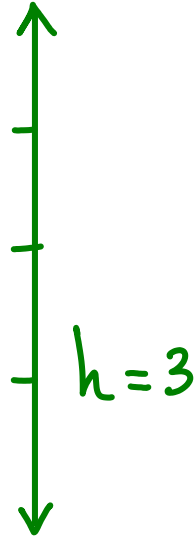


$$h = \log_2 n$$

complete
n nodes $\rightarrow$ what is h?



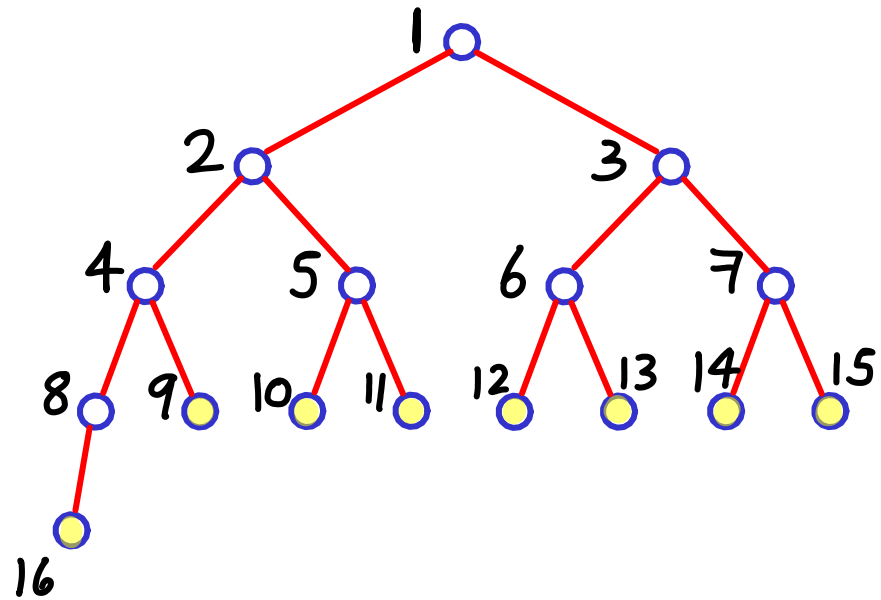
Intuition: h doesn't change much
compared to perfect tree



$$h = \log_2 n$$

complete
n nodes $\rightarrow$ what is h?

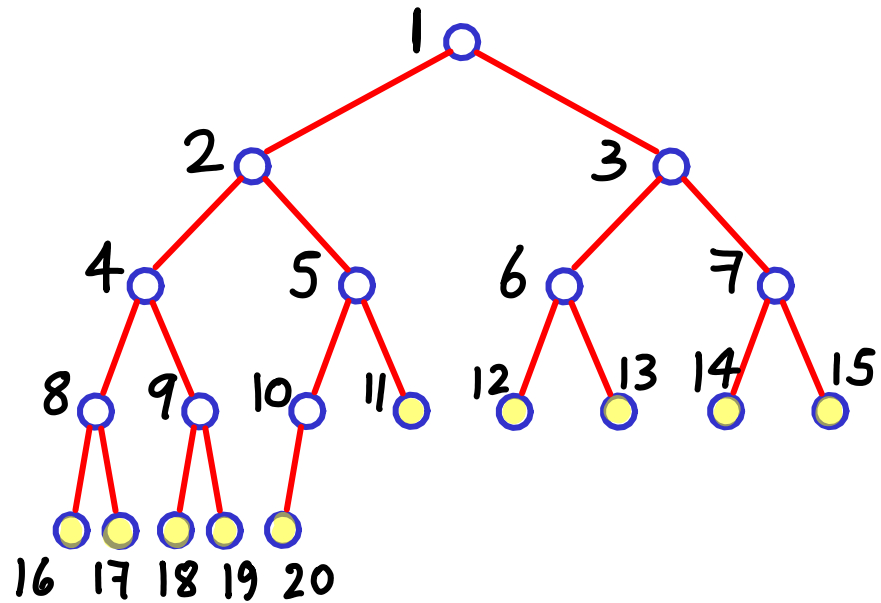
Intuition: h doesn't change much
compared to perfect tree



$h = 4$

$$h = \log_2 n$$

complete
n nodes $\rightarrow$ what is h?



Intuition: h doesn't change much
compared to perfect tree

for $2^h < n < 2^{h+1}$
 $h < \log_2 n < h+1$

$h = 4$

$$h = \lfloor \log_2 n \rfloor$$

balanced binary trees

balanced binary trees

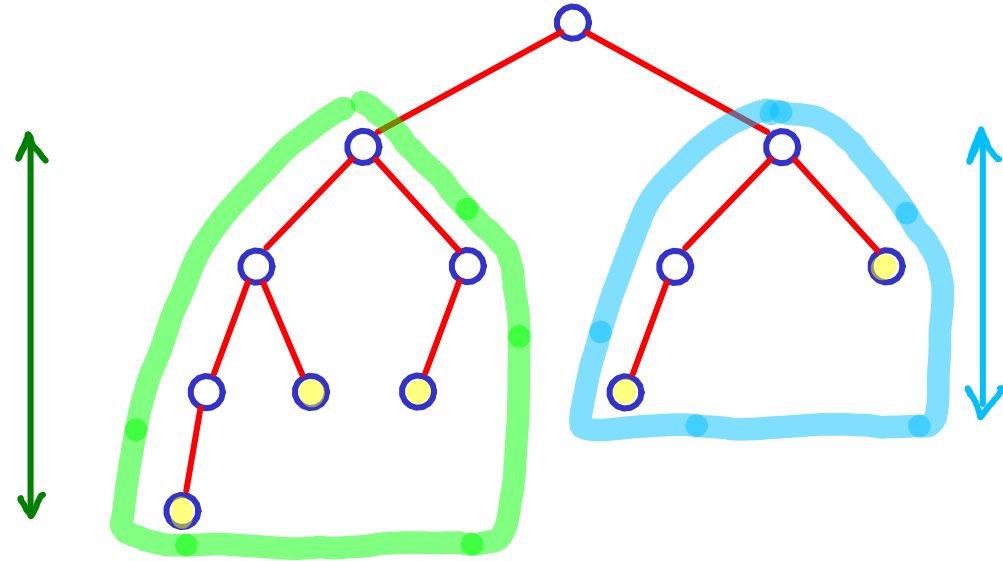
no unique definition

common: depth of left & right subtrees differ by ≤ 1

balanced binary trees

no unique definition

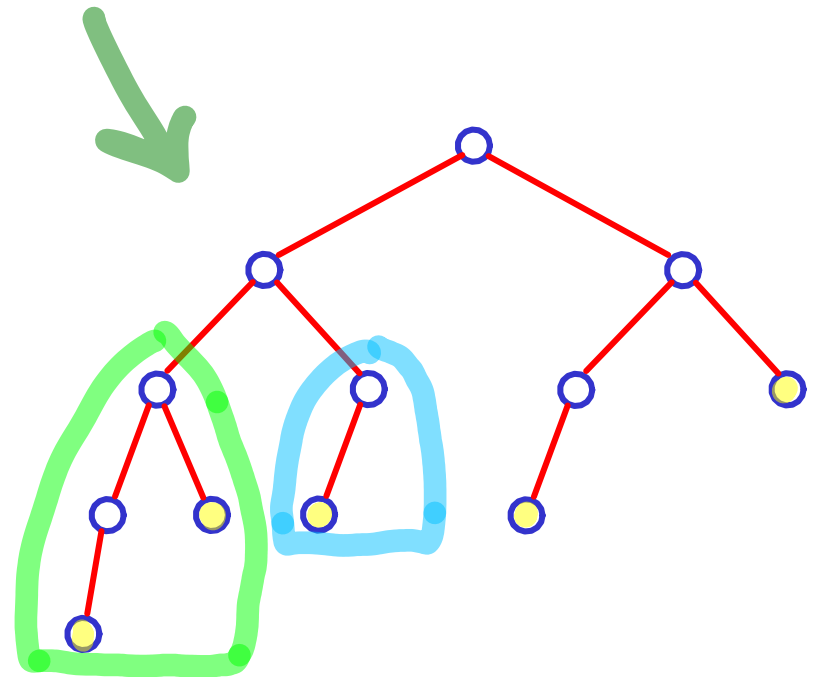
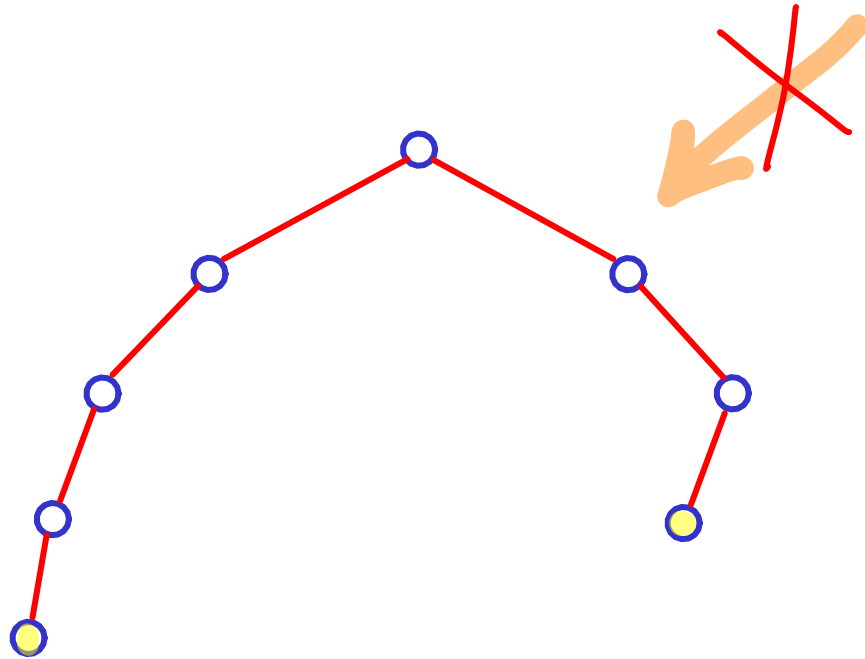
common: depth of left & right subtrees differ by ≤ 1



balanced binary trees

no unique definition

common: depth of left & right subtrees differ by ≤ 1
(recursively)



balanced binary trees

no unique definition

common: depth of left & right subtrees differ by ≤ 1
(recursively)

also common: depth is $O(\log n)$

