

HEAPS:

REGULAR

BINOMIAL

REPORT MIN:

$O(1)$



EXTRACT MIN:

$O(\log n)$



INSERT:

$O(\log n)$

$O(1)$ amortized



DECREASE KEY:

$O(\log n)$



DELETE:

$O(\log n)$



MERGE/UNION:

$O(n)$

$O(\log n)$

HEAPS:

REGULAR

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QUAKE

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$O(n)$
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MERGE/UNION:

$O(n)$

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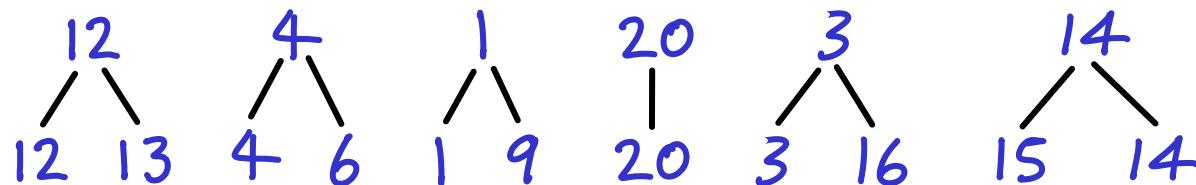
TOURNAMENT TREES

- ALL DATA STORED IN LEAVES AT LOWEST LEVEL

12 13 4 6 1 9 20 3 16 15 14

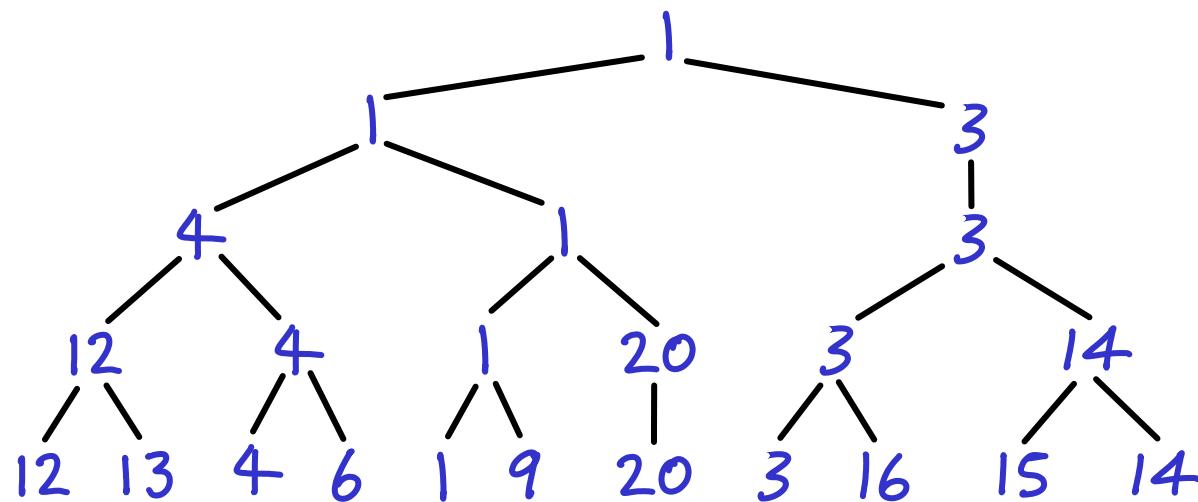
TOURNAMENT TREES

- ALL DATA STORED IN LEAVES AT LOWEST LEVEL
- PARENT NODE = $\min\{\text{CHILDREN}\}$



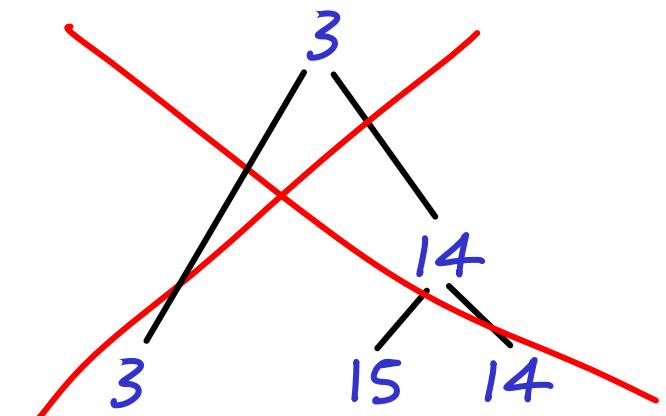
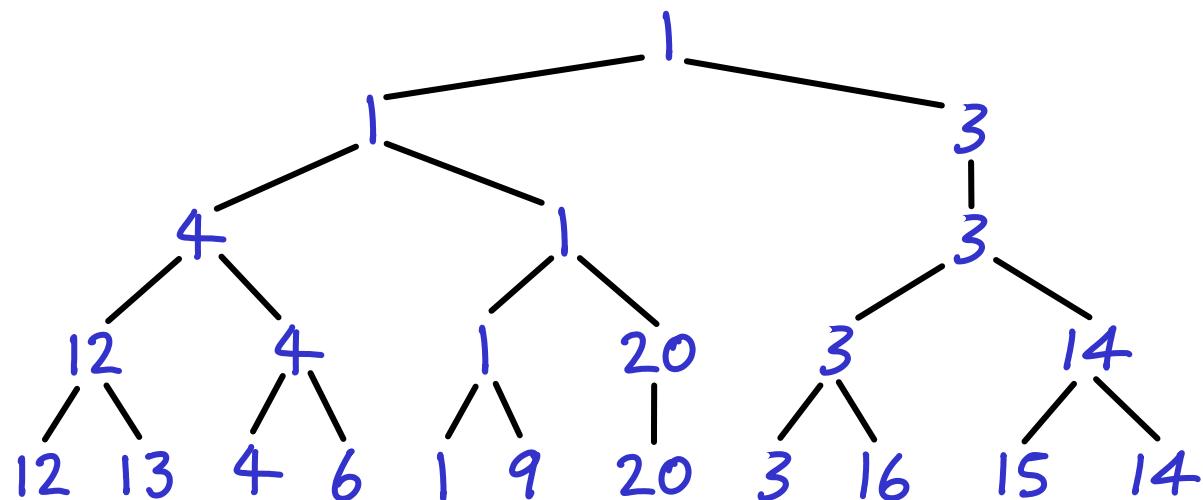
TOURNAMENT TREES

- ALL DATA STORED IN LEAVES AT LOWEST LEVEL
- PARENT NODE = $\min\{\text{CHILDREN}\}$
- EVERY NODE HAS 1 OR 2 CHILDREN



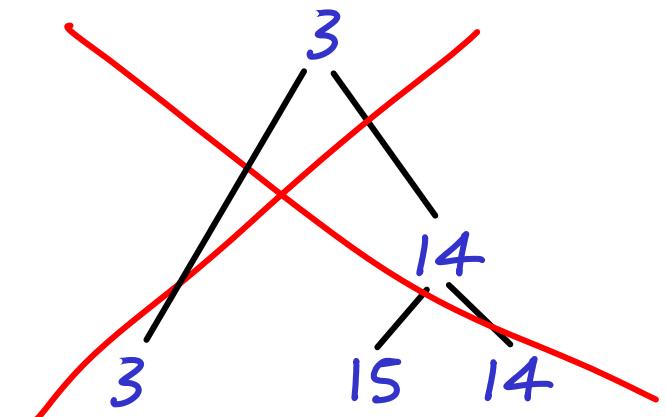
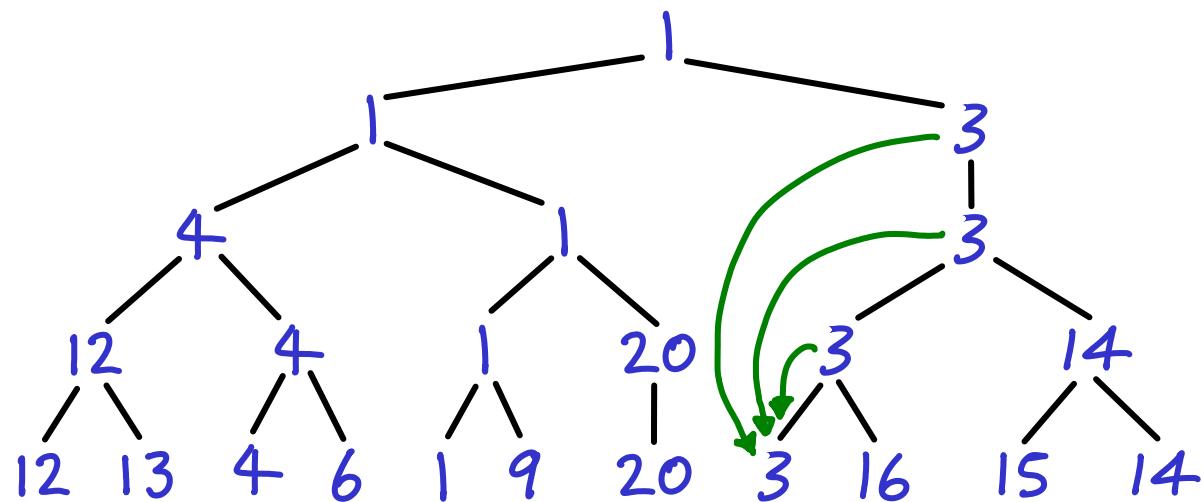
TOURNAMENT TREES

- ALL DATA STORED IN LEAVES AT LOWEST LEVEL
(EDGES CAN'T SKIP LEVELS)
- PARENT NODE = $\min\{\text{CHILDREN}\}$
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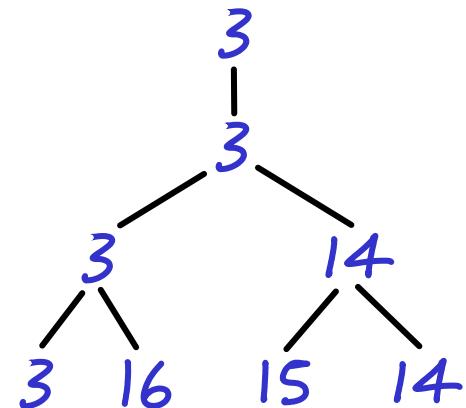
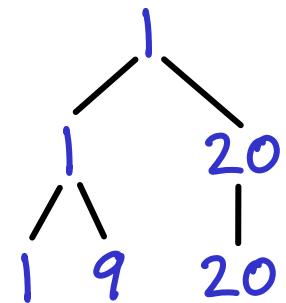
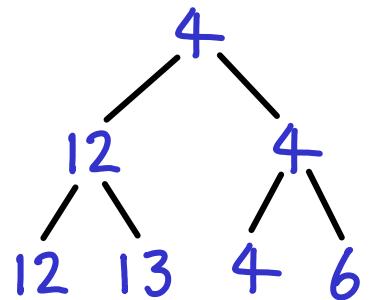


TOURNAMENT TREES

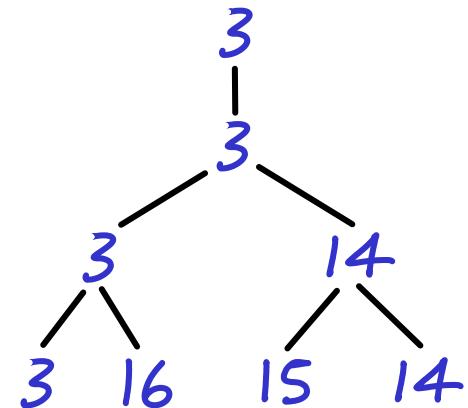
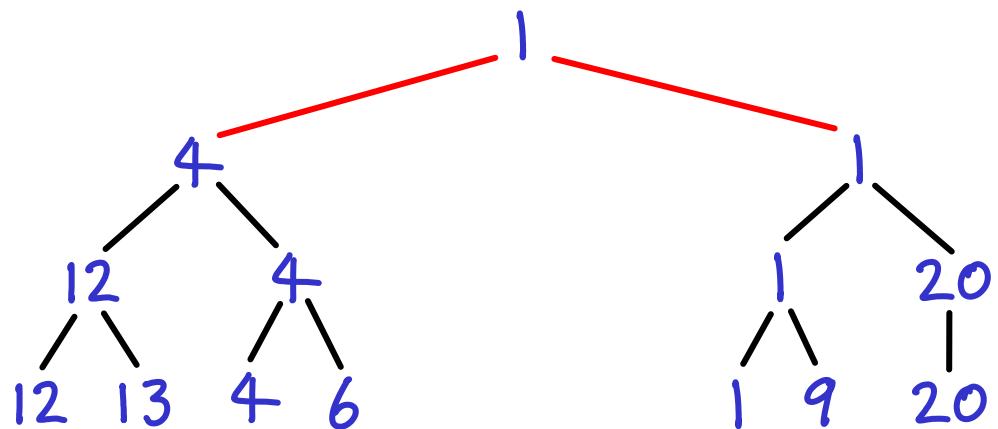
- ALL DATA STORED IN LEAVES AT LOWEST LEVEL
(EDGES CAN'T SKIP LEVELS)
- PARENT NODE = $\min\{\text{CHILDREN}\}$ (*CLONE = use pointer*)
- EVERY NODE HAS 1 OR 2 CHILDREN



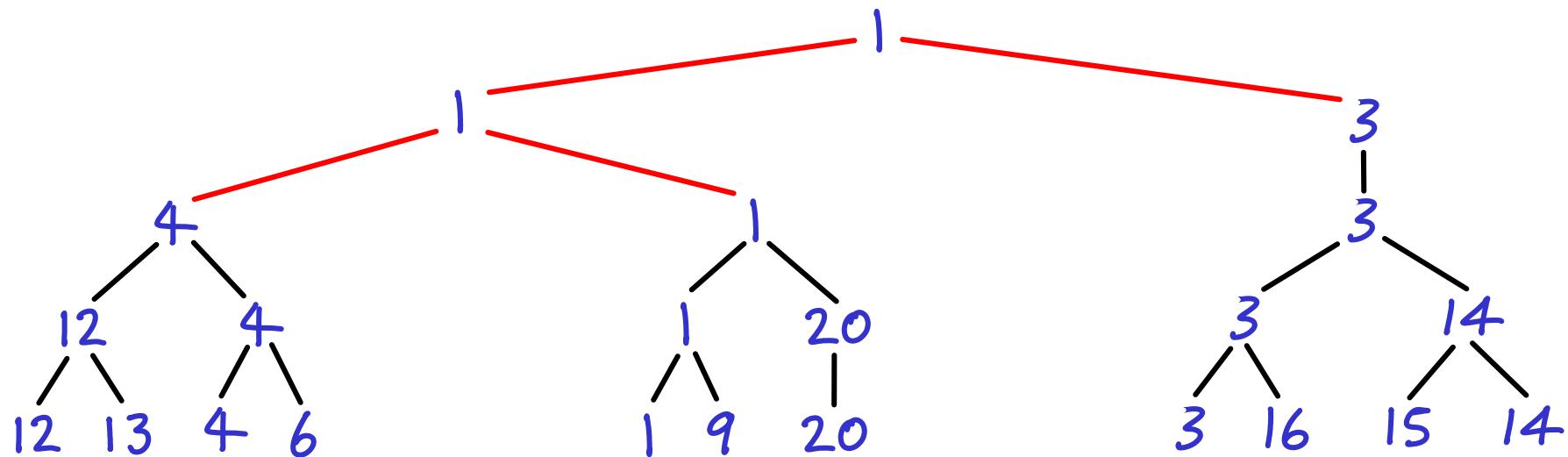
LINK (2 trees) : assumes same height



LINK (2 trees) : assumes same height → Make new root & clone

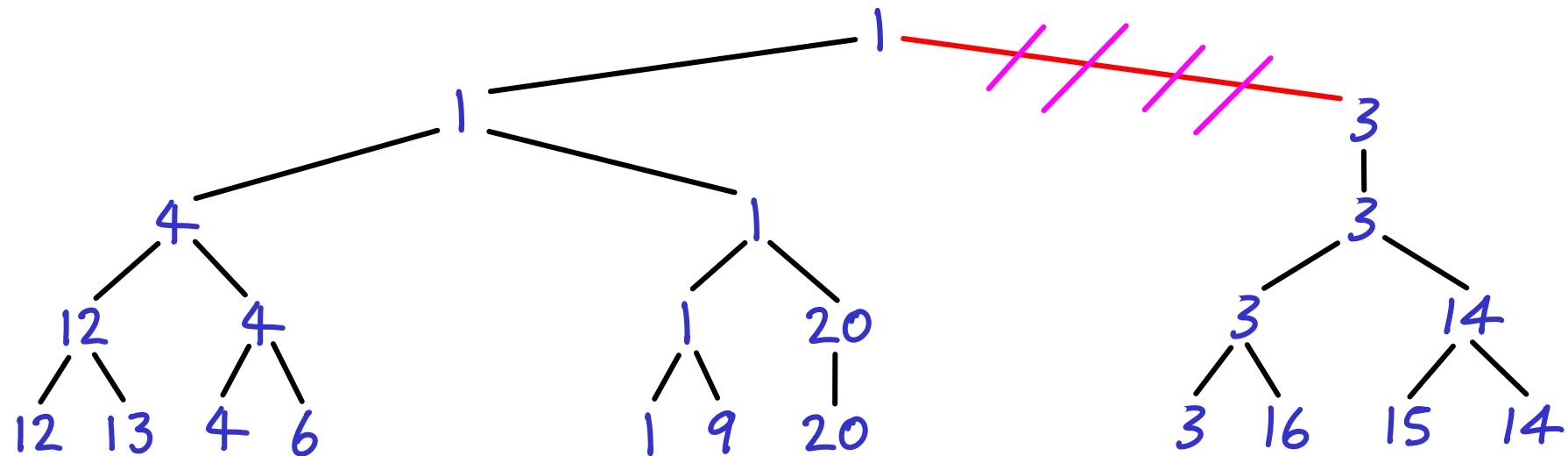


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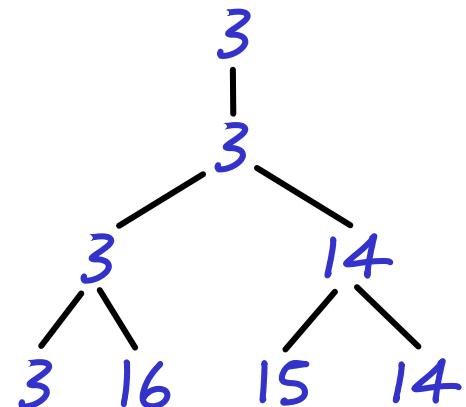
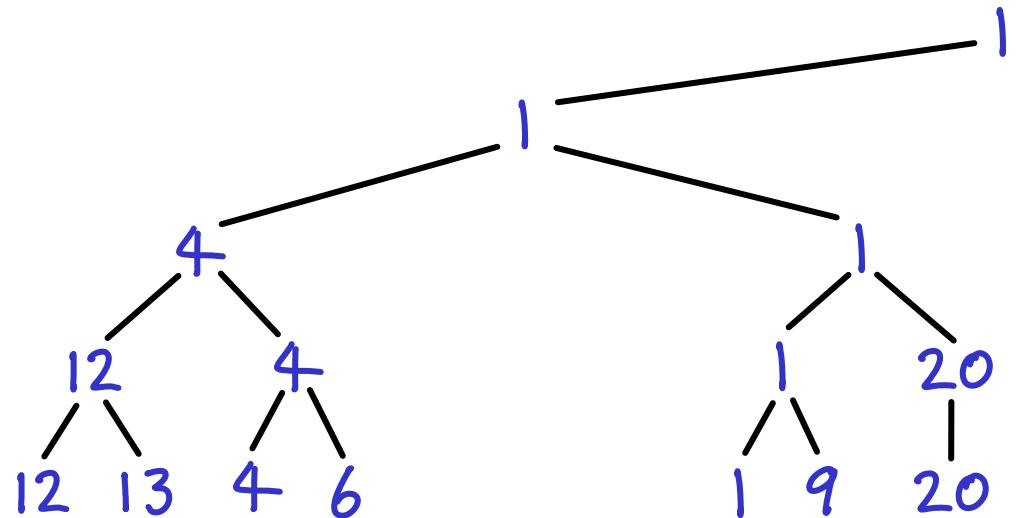
LINK (2 trees) : assumes same height → Make new root & clone

CUT (at an edge)



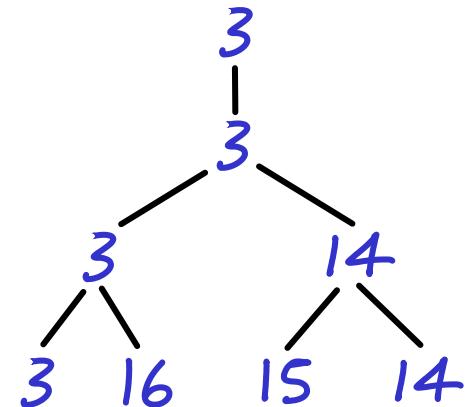
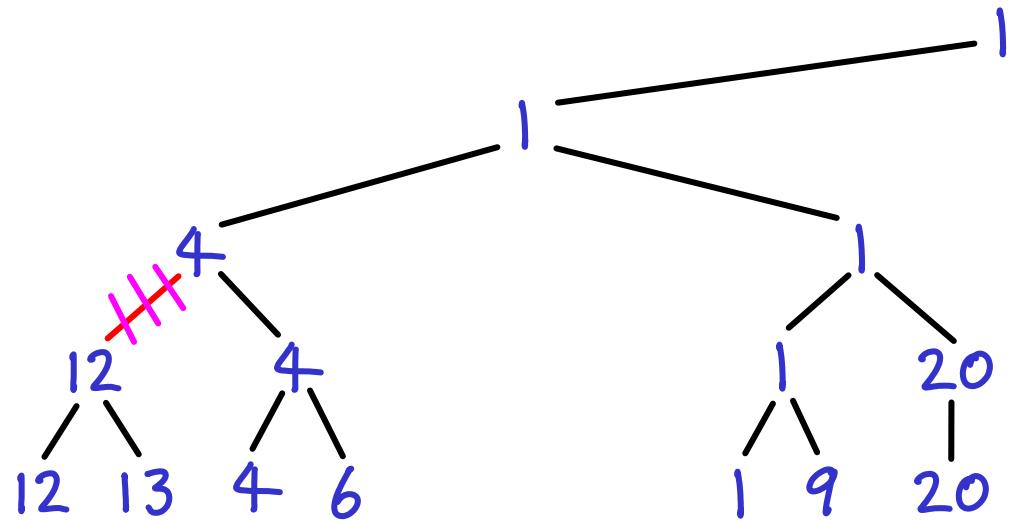
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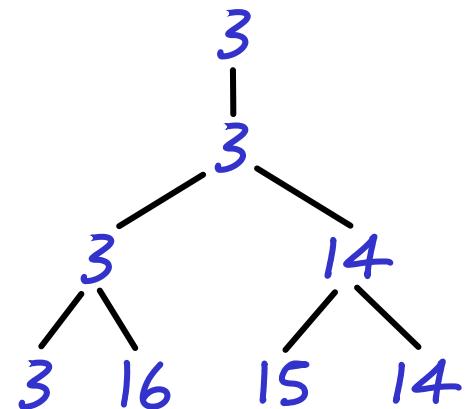
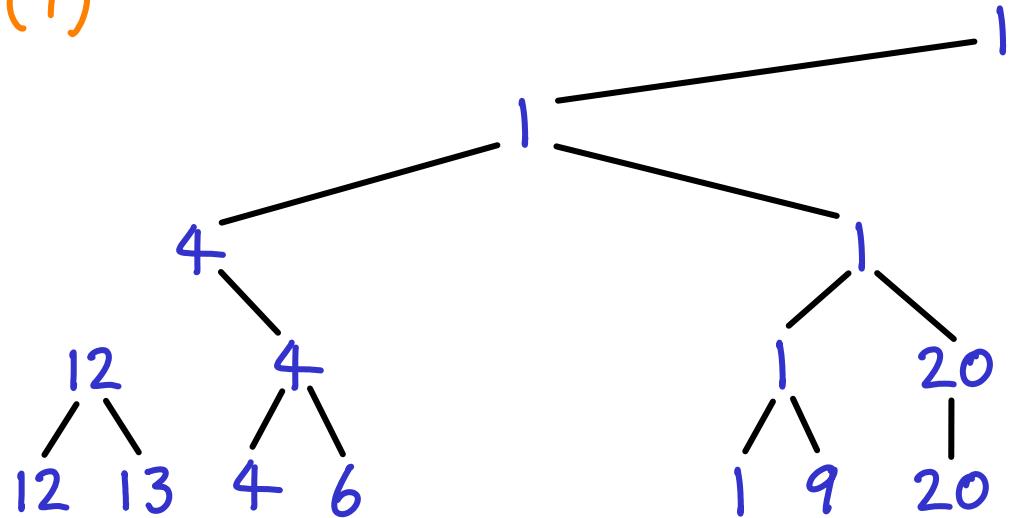
CUT (at an edge) : → Trivial : 2 new trees



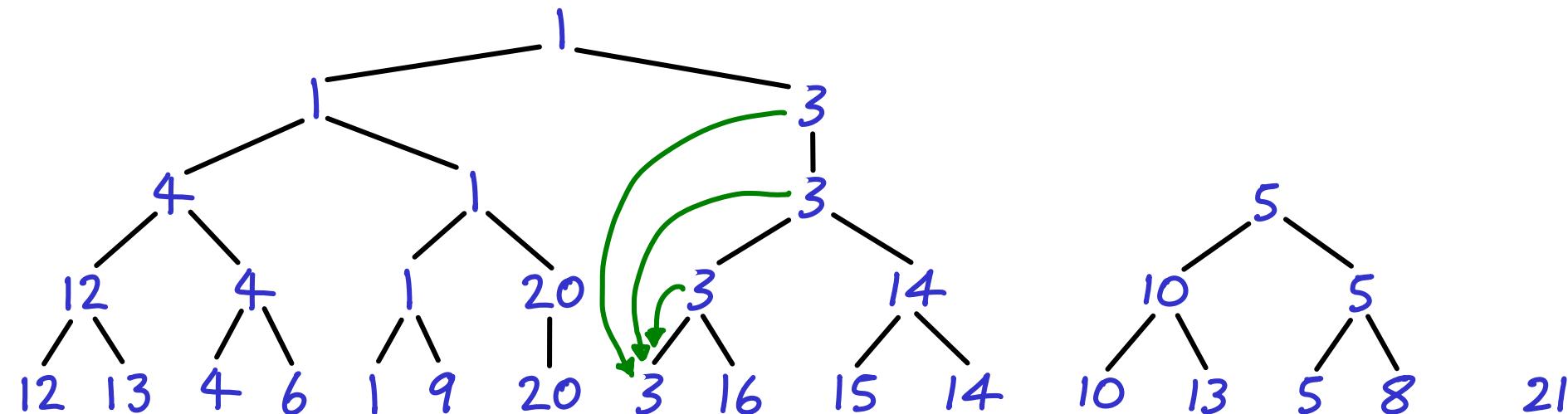
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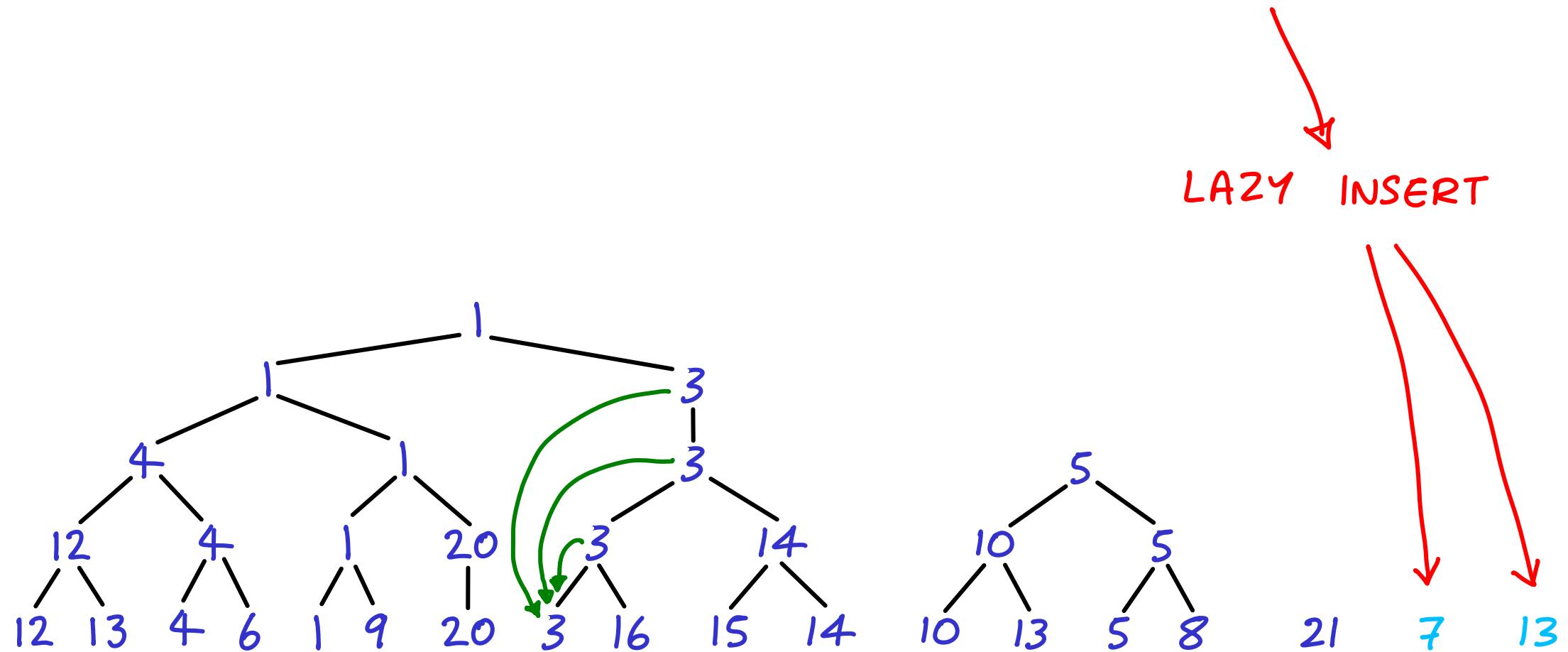
$O(1)$



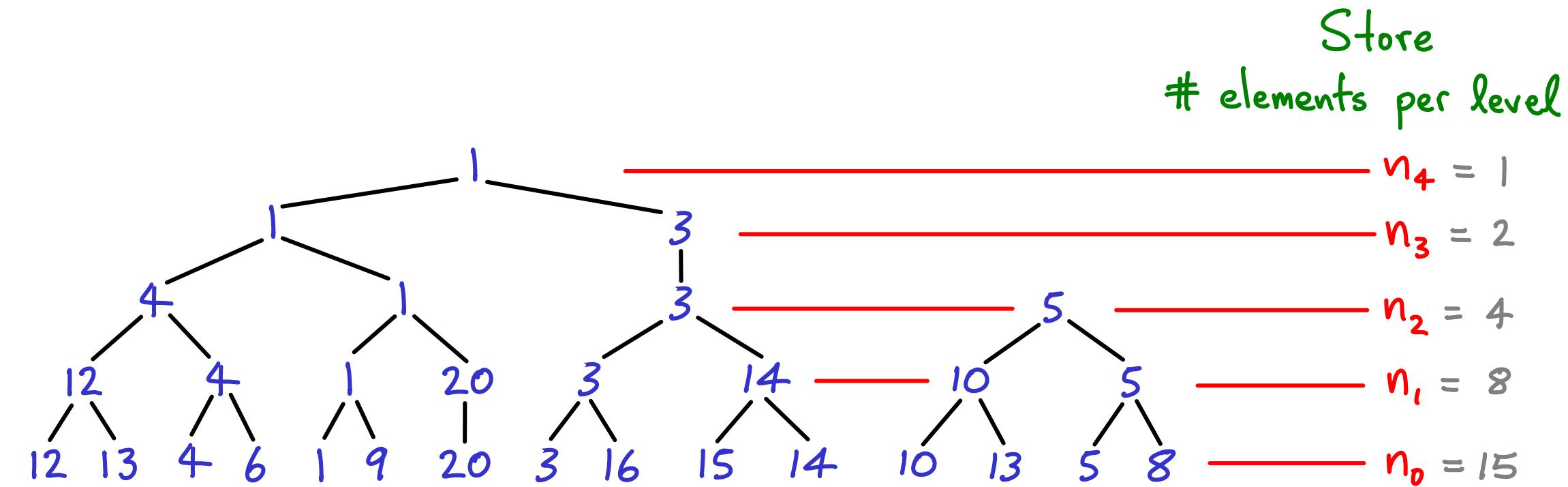
QUAKE HEAP ~ collection of TOURNAMENT TREES
with distinct heights



QUAKE HEAP ~ collection of TOURNAMENT TREES
with distinct heights ... most of the time



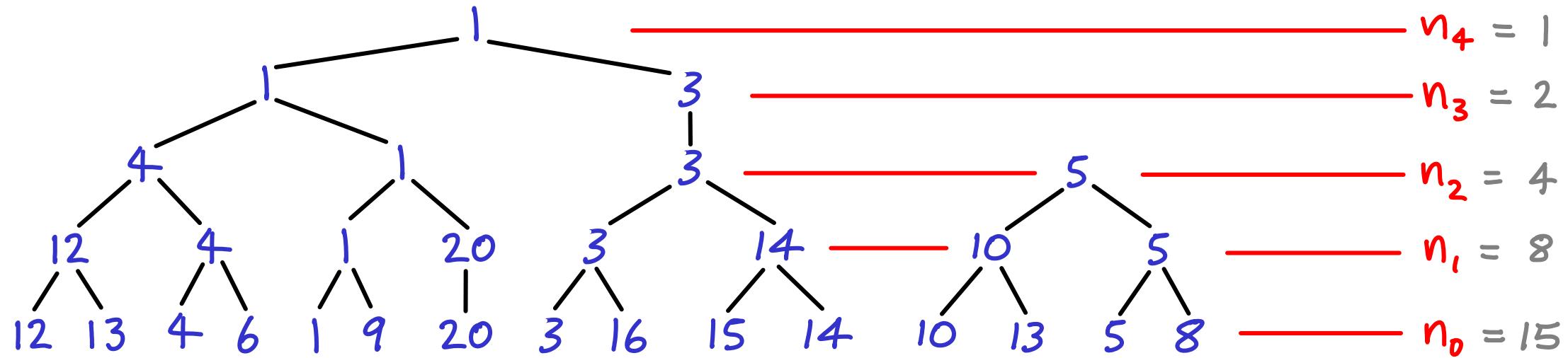
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Enforce

$$\frac{n_{i+1}}{n_i} \leq \alpha \quad (\frac{1}{2} < \alpha < 1)$$



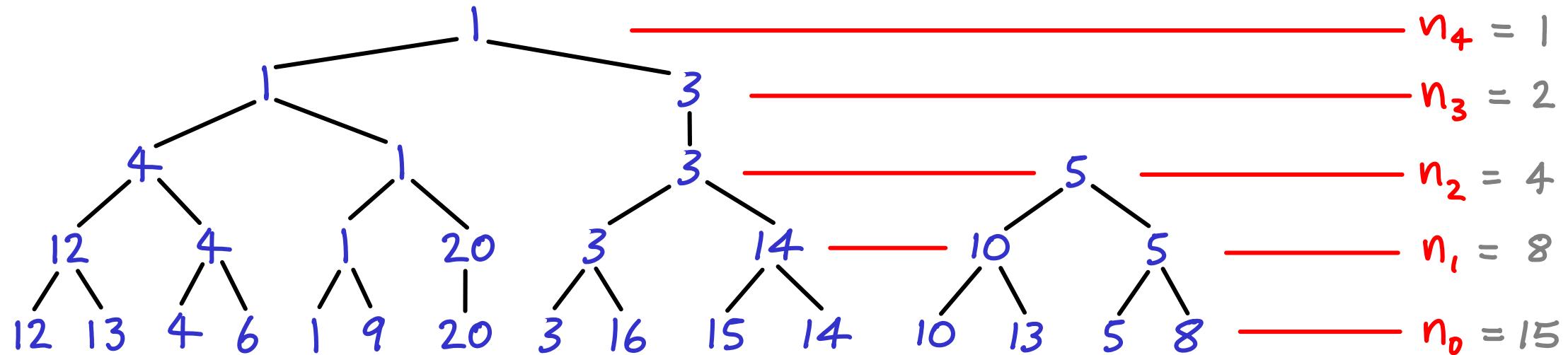
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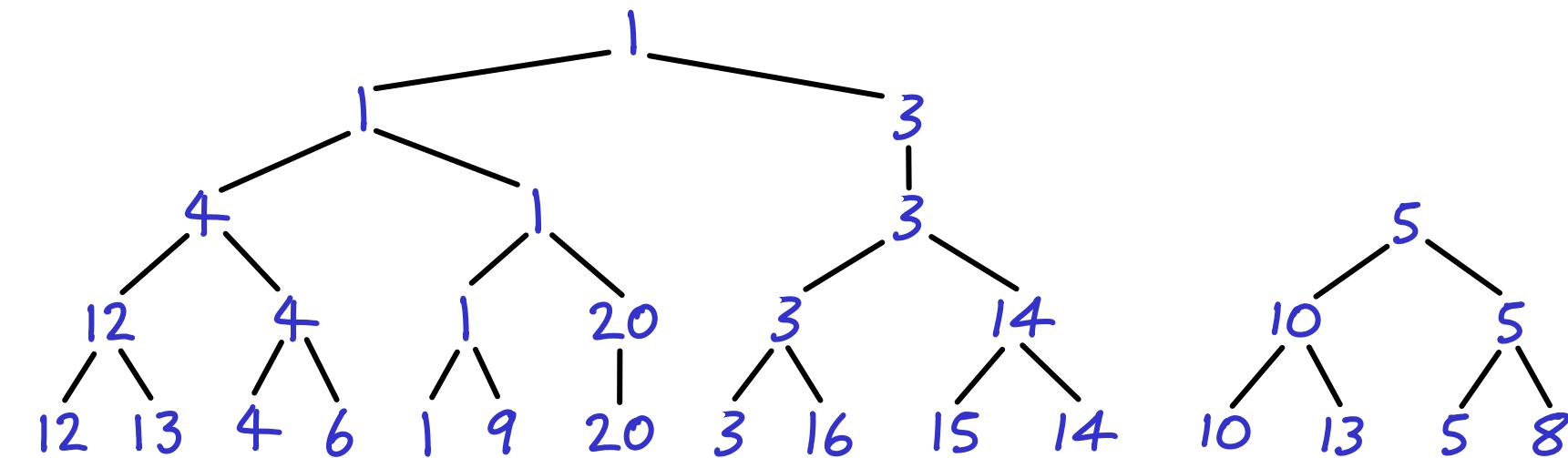
$$\frac{n_{i+1}}{n_i} \leq \alpha \quad (\frac{1}{2} < \alpha < 1)$$

We will use $\alpha = \frac{3}{4}$

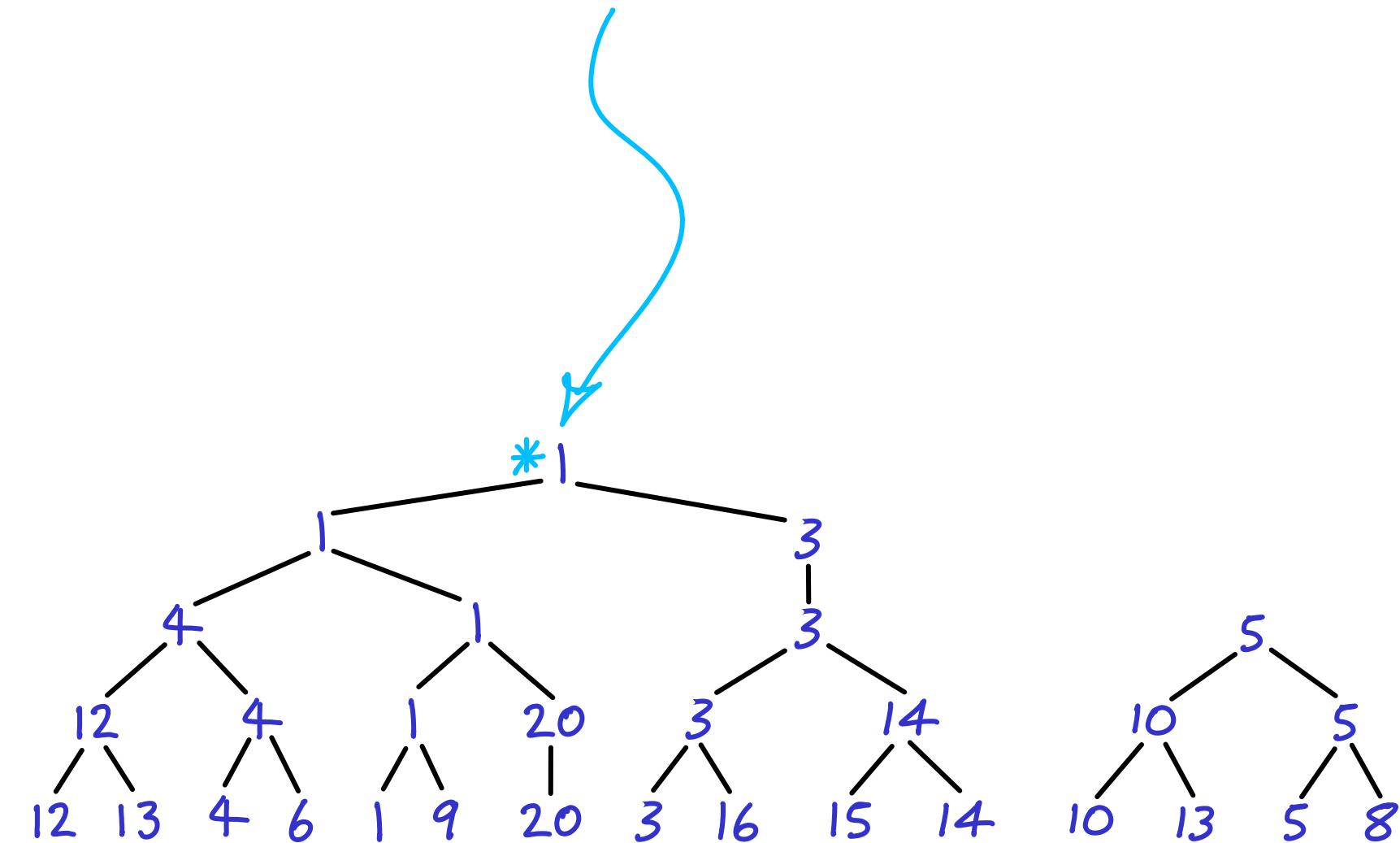
MAX HEIGHT $\leq \log_{4/3} n_0$



REPORT MIN: ?

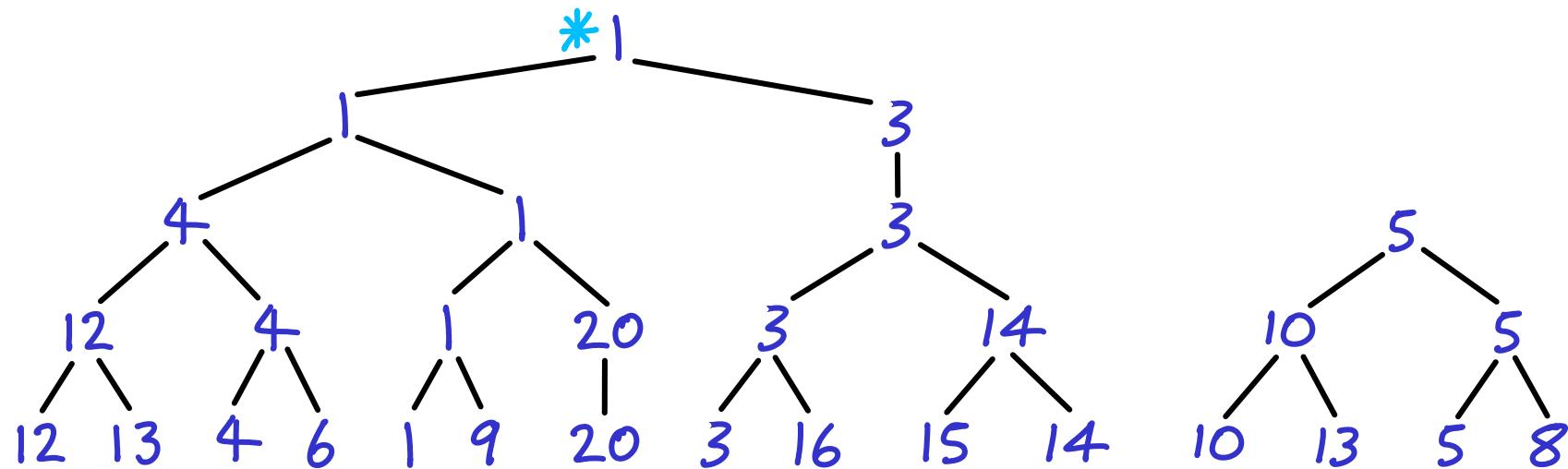


REPORT MIN: KEEP POINTER $O(1)$



REPORT MIN: KEEP POINTER $O(1)$

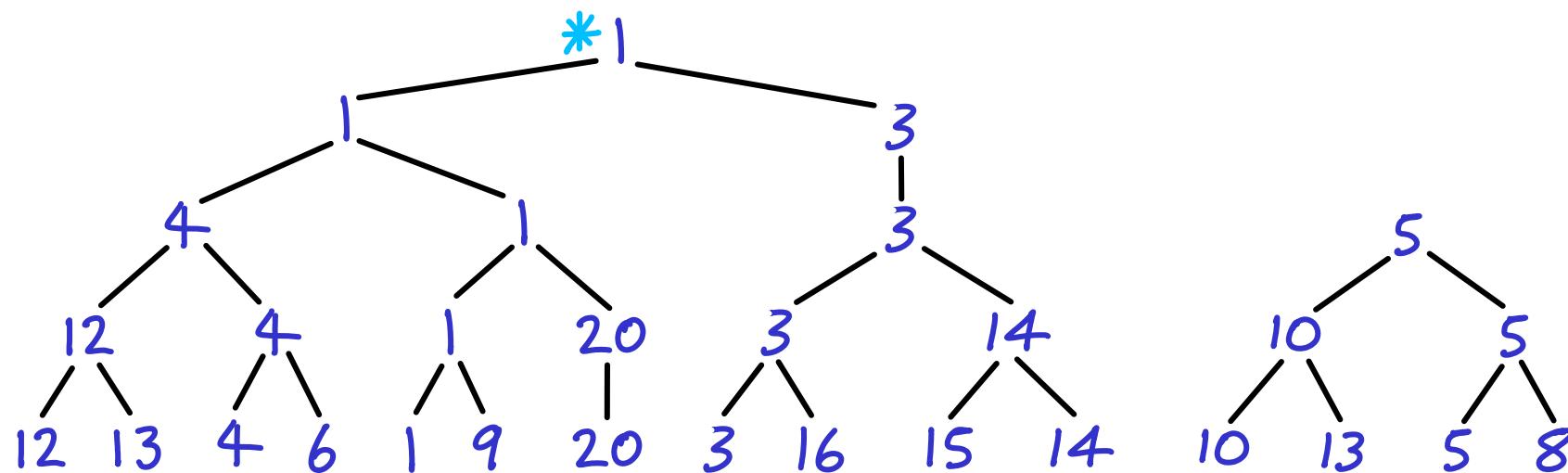
INSERT: ?



REPORT MIN: KEEP POINTER $O(1)$

$$\frac{n_{i+1}}{n_i} \leq \frac{3}{4}$$

INSERT: increment n_0 $O(1)$



$$n_4 = 1$$

$$n_3 = 2$$

$$n_2 = 3$$

$$n_1 = 8$$

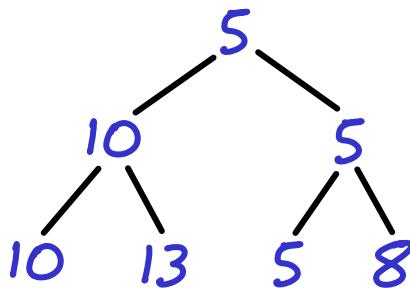
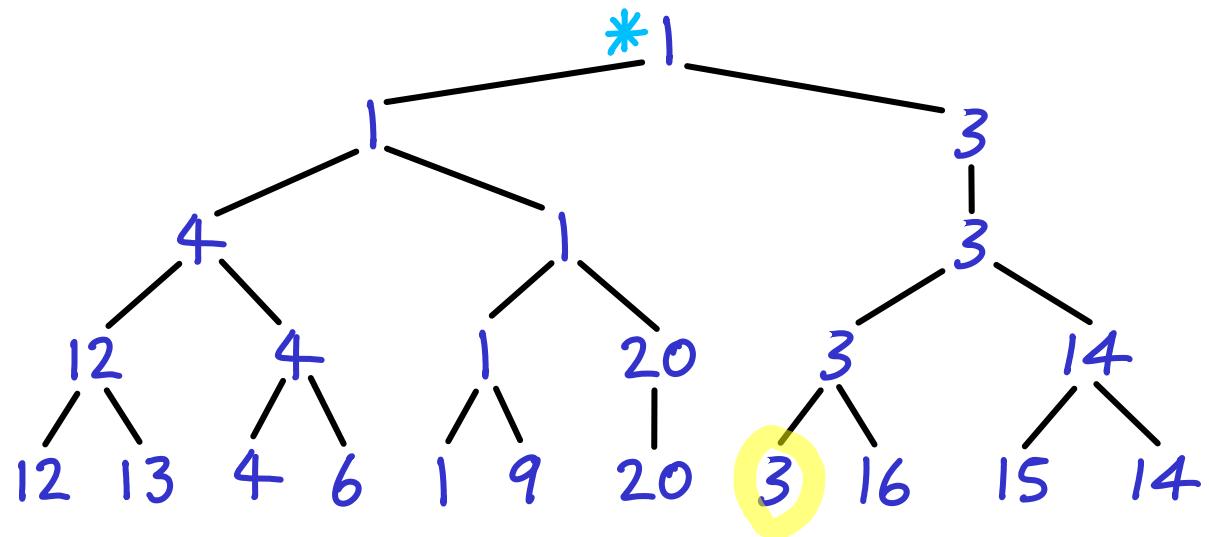
21 → $n_0 = 16$

REPORT MIN: KEEP POINTER $O(1)$

$$\frac{n_{i+1}}{n_i} \leq \frac{3}{4}$$

INSERT: increment no $O(1)$

DECREASE KEY: ?



21

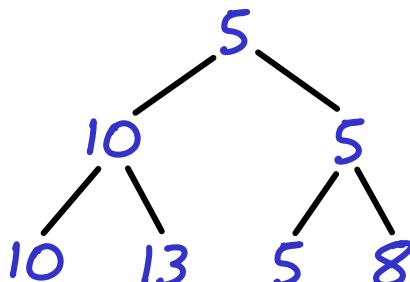
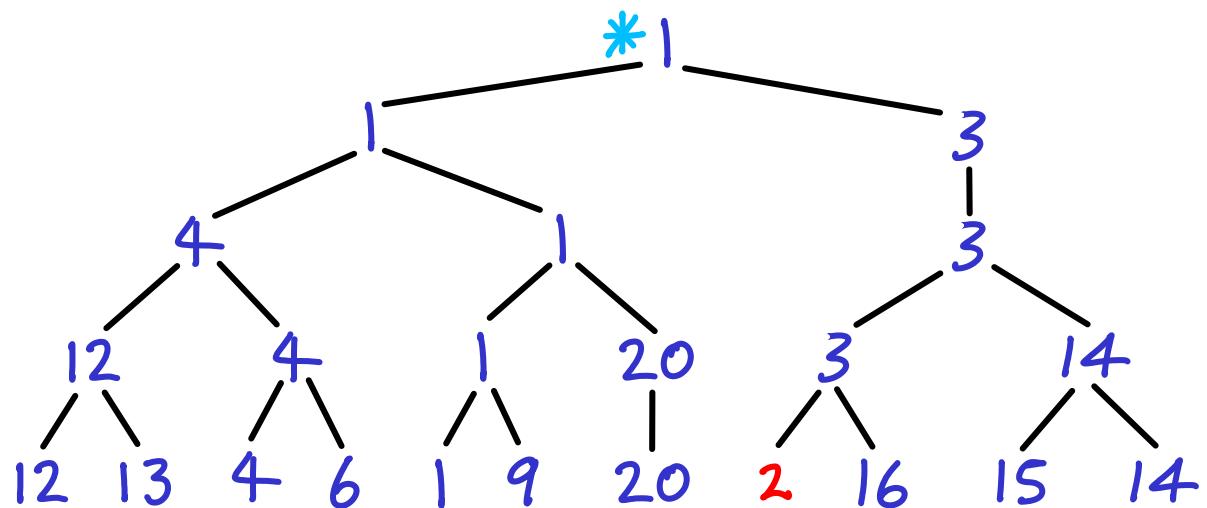
$$\begin{aligned}n_4 &= 1 \\n_3 &= 2 \\n_2 &= 3 \\n_1 &= 8 \\n_0 &= 16\end{aligned}$$

REPORT MIN: KEEP POINTER $O(1)$

$$\frac{n_{i+1}}{n_i} \leq \frac{3}{4}$$

INSERT: increment no. $O(1)$

DECREASE KEY :



21

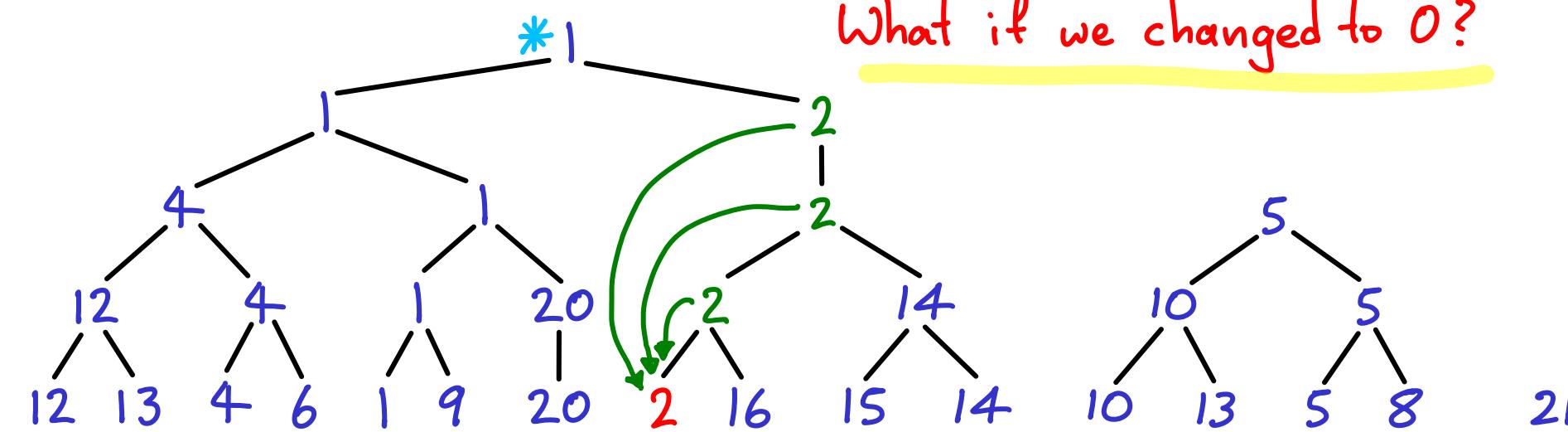
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REPORT MIN: KEEP POINTER $O(1)$

$$\frac{n_{i+1}}{n_i} \leq \frac{3}{4}$$

INSERT: increment no $O(1)$

DECREASE KEY: clones reflect changed leaf $O(1) \dots$



$$n_4 = 1$$

$$n_3 = 2$$

$$n_2 = 3$$

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REPORT MIN: KEEP POINTER $O(1)$

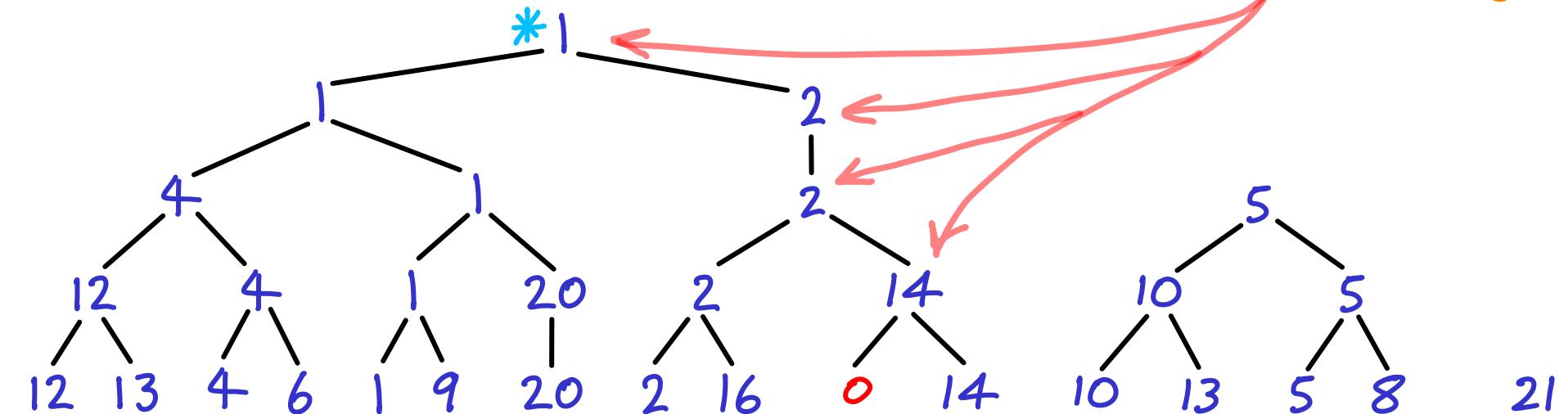
$$\frac{n_{i+1}}{n_i} \leq \frac{3}{4}$$

INSERT: increment no. $O(1)$

DECREASE KEY: clones reflect changed leaf.

too expensive to update up to root

$\hookrightarrow O(\log n)$



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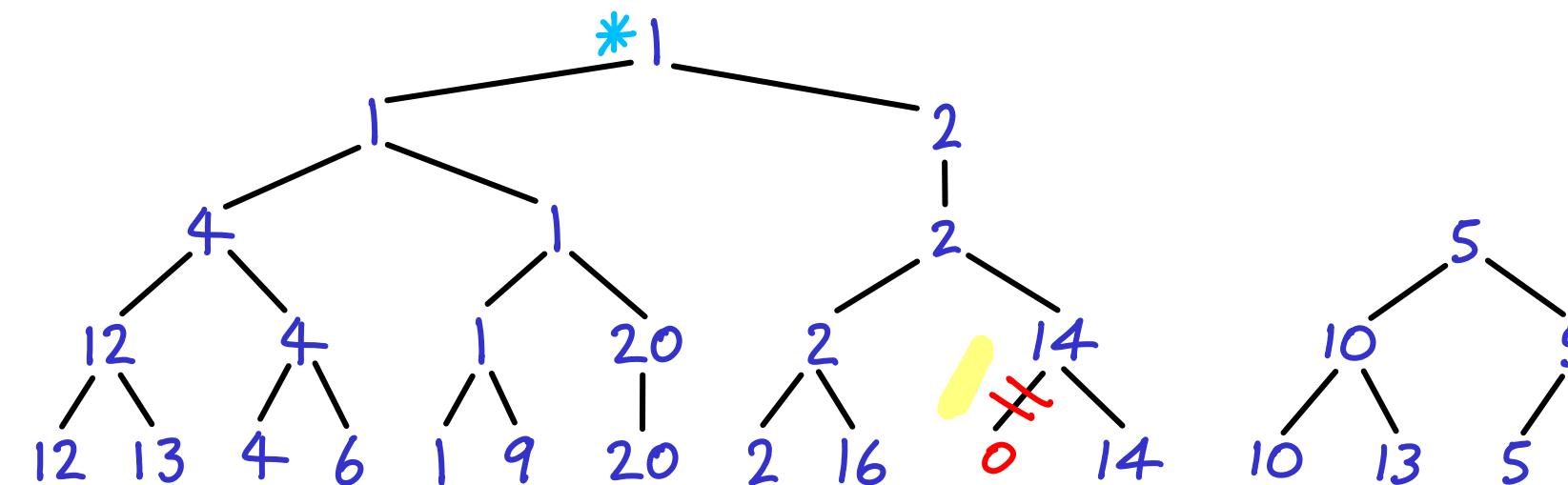
$$n_0 = 16$$

REPORT MIN: KEEP POINTER $O(1)$

$$\frac{n_{i+1}}{n_i} \leq \frac{3}{4}$$

INSERT: increment no $O(1)$

DECREASE KEY: clones reflect changed leaf. Just CUT
too expensive to update up to root



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REPORT MIN: KEEP POINTER $O(1)$

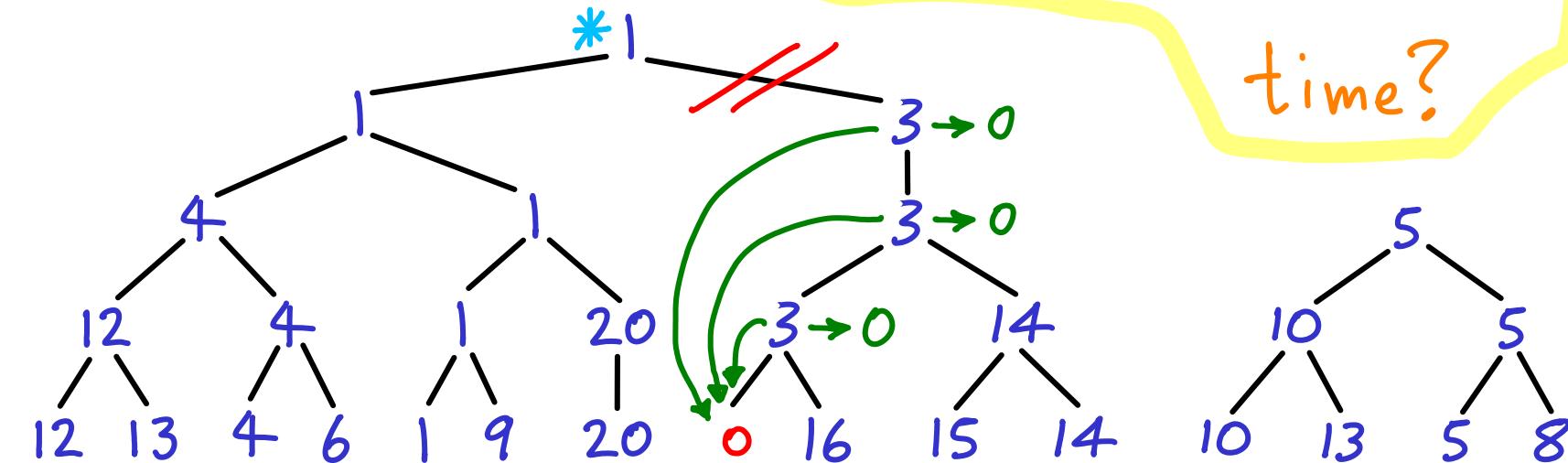
$$\frac{n_{i+1}}{n_i} \leq \frac{3}{4}$$

INSERT: increment no. $O(1)$

DECREASE KEY: clones reflect changed leaf.
too expensive to update up to root

CUT above highest clone

time?



$$\begin{aligned}n_4 &= 1 \\n_3 &= 2 \\n_2 &= 3 \\n_1 &= 8 \\n_0 &= 16\end{aligned}$$

REPORT MIN: KEEP POINTER $O(1)$

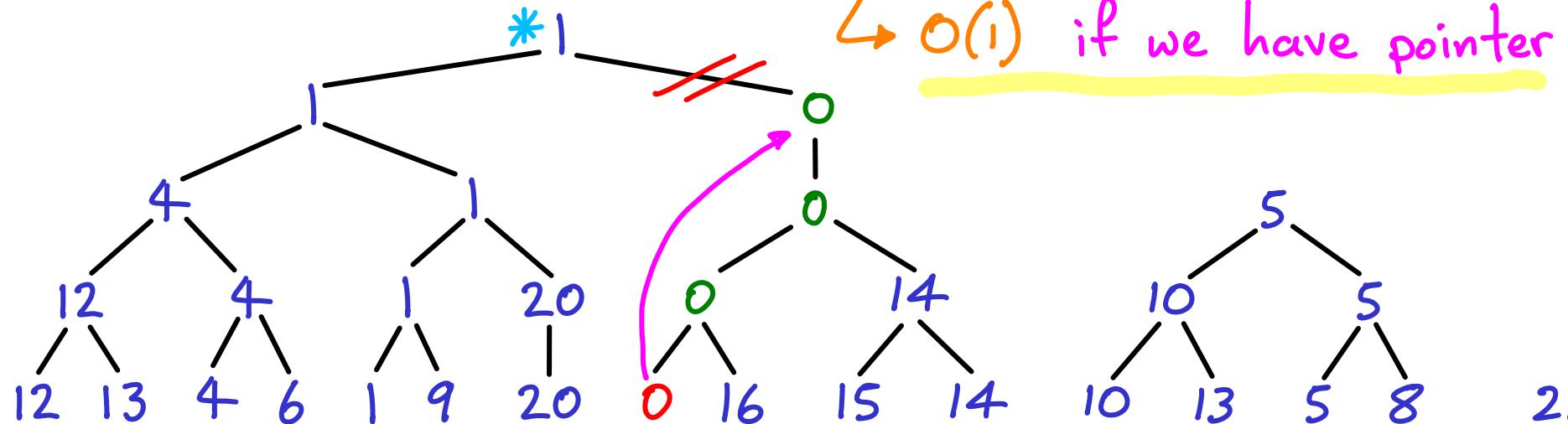
$$\frac{n_{i+1}}{n_i} \leq \frac{3}{4}$$

INSERT : increment n_o O(1)

DECREASE KEY : clones reflect changed leaf.
too expensive to update up to root

CUT above highest clone

$\hookleftarrow O(1)$ if we have pointer



$$n_4 = 1$$

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$$n_s = 16$$

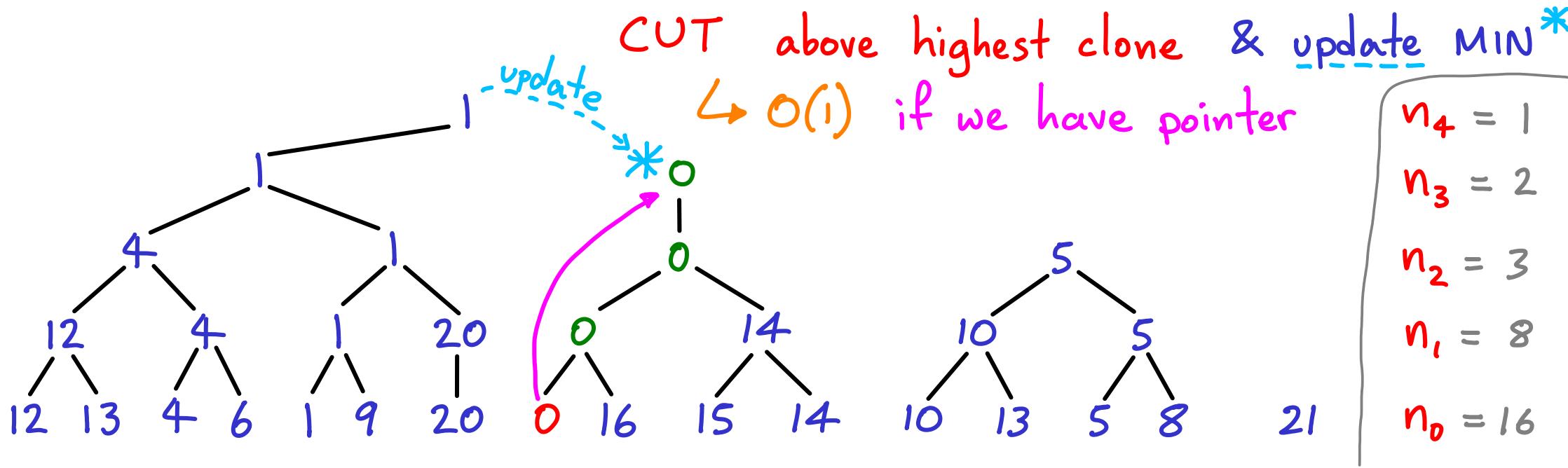
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DECREASE KEY:

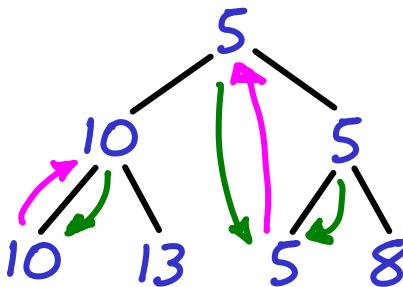
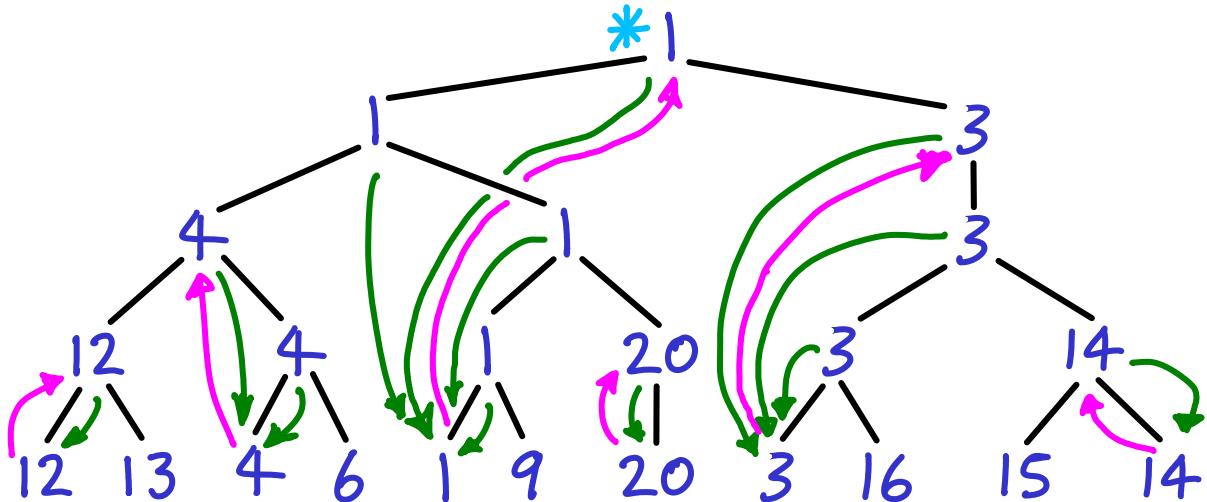
- clones reflect changed leaf.
- too expensive to update up to root



REPORT MIN, INSERT: $O(1)$

DECREASE KEY: CUT above highest clone $O(1)$

Storing: clone pointers, leaf-to-highest-clone, global min, level counts *



21

$$\frac{n_{i+1}}{n_i} \leq \frac{3}{4}$$

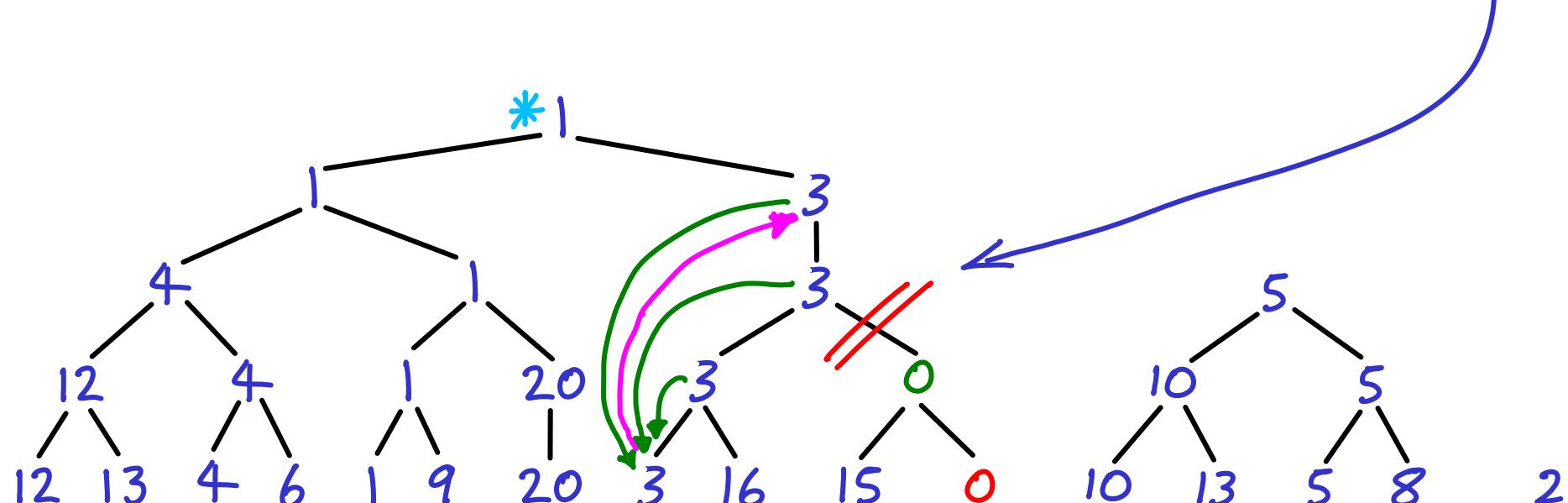
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REPORT MIN, INSERT: $O(1)$

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Storing: clone pointers, leaf-to-highest-clone, global min, level counts *

Also want distinct tree heights; so far we are extra lazy



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REPORT MIN, INSERT: $O(1)$

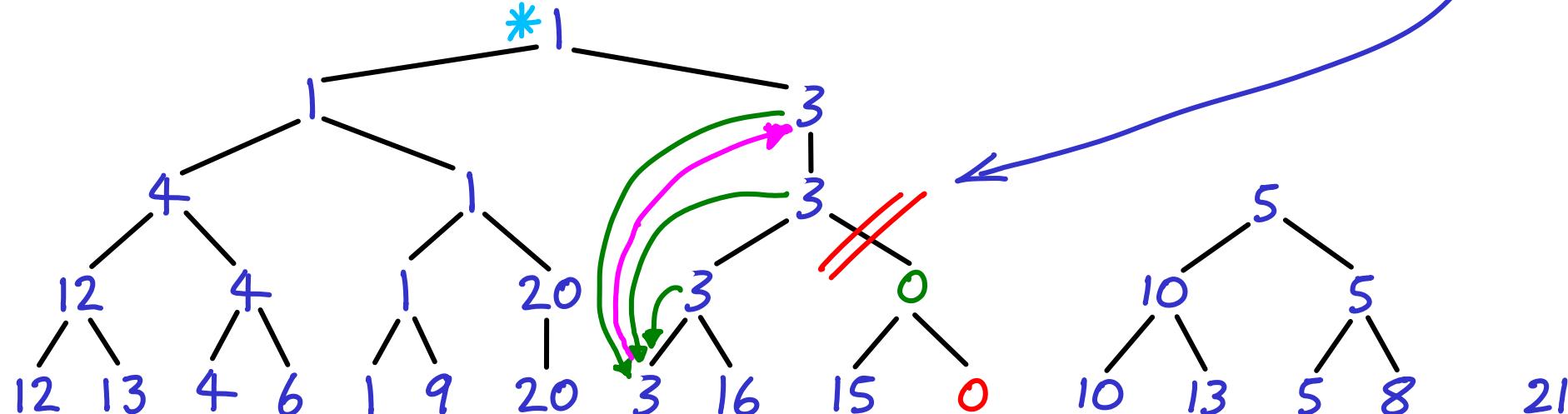
DECREASE KEY: CUT above highest clone $O(1)$

Storing: clone pointers, leaf-to-highest-clone, global min, level counts,

Also want distinct tree heights; so far we are extra lazy

UNION: be even more lazy: $O(1)$

↳ keep level counts separate for now, otherwise $O(\log n)$.



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$$n_4 = 1$$

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$$n_1 = 8$$

$$n_0 = 16$$

REPORT MIN, INSERT, DECREASE KEY, UNION: $O(1)$

So far we could have used a ...

REPORT MIN, INSERT, DECREASE KEY, UNION: $O(1)$

So far we could have used a linked list

12 13 4 6 * 1 9 20 3 16 15 14 10 13 5 8 21

REPORT MIN, INSERT, DECREASE KEY, UNION: $O(1)$

So far we could have used a linked list

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We need to DELETE (& EXTRACT-MIN = FIND-MIN + DELETE)

in $O(n)$ but $O(\log n)$ amortized (Pay for being lazy)

REPORT MIN, INSERT, DECREASE KEY, UNION: $O(1)$

So far we could have used a linked list

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We need to DELETE (& EXTRACT-MIN = FIND-MIN + DELETE)

in $O(n)$ but $O(\log n)$ amortized (Pay for being lazy)

We will also need to deal with separate level counts.

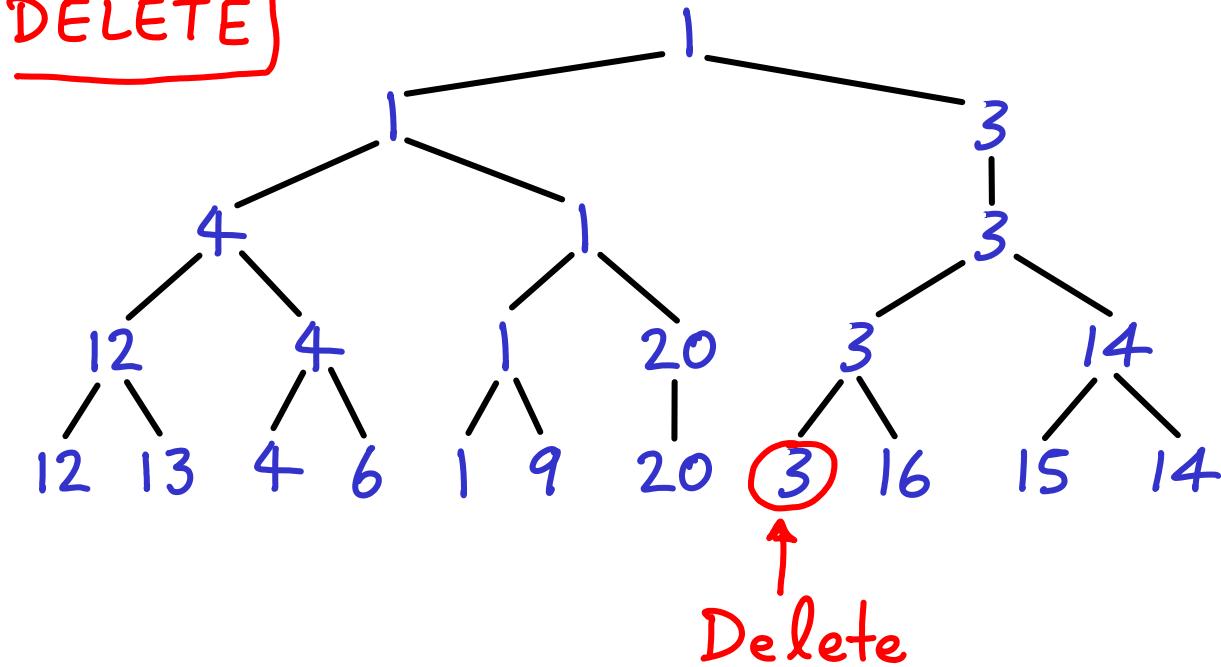
↳ (only if UNION is needed)

Next:

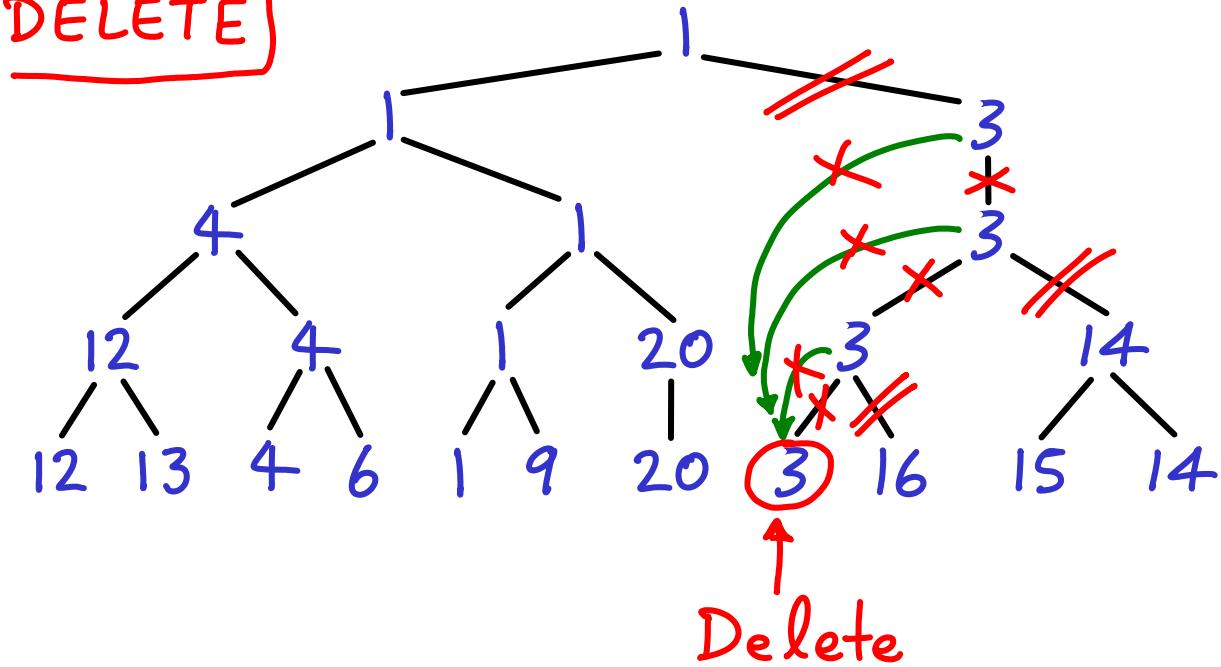
How to get DELETE $O(\log n)$ amortized

assuming no UNION

DELETE)

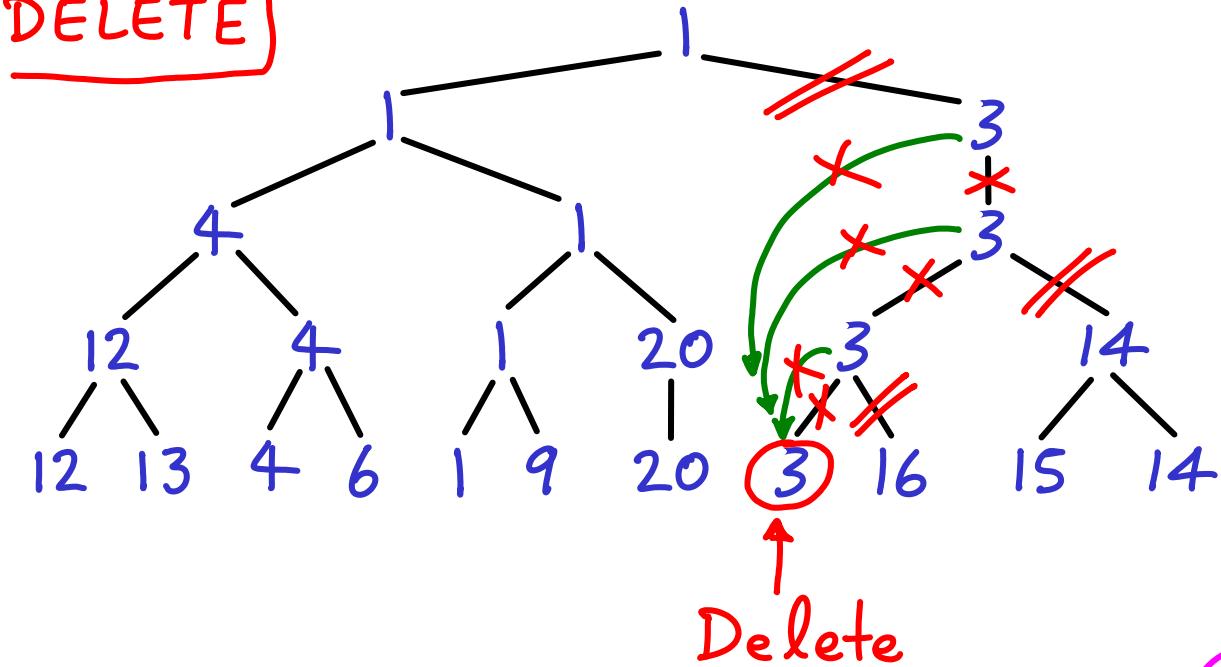


DELETE)



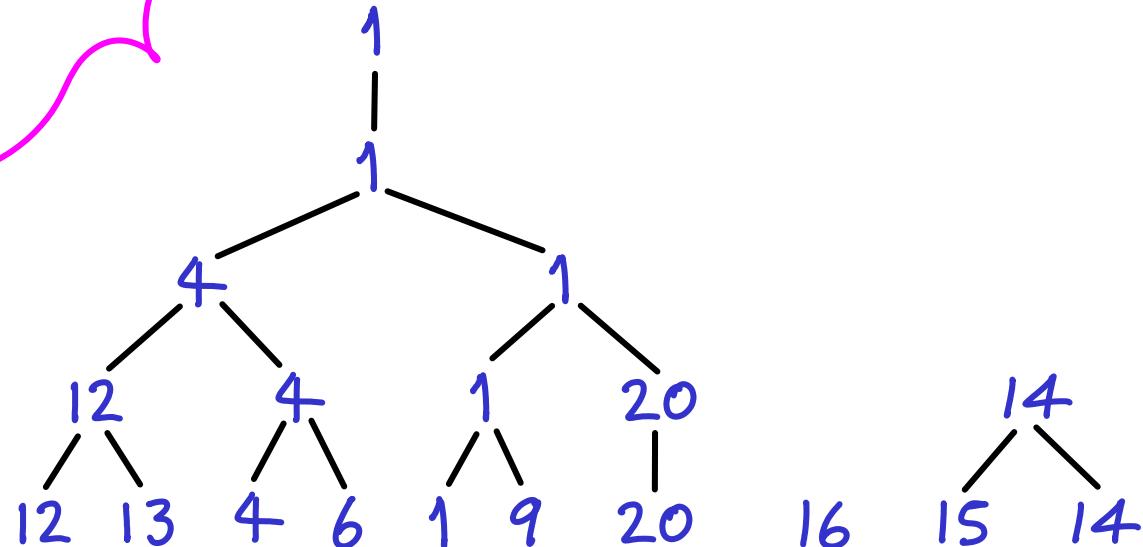
Walk up from leaf,
delete clones & CUT

DELETE)

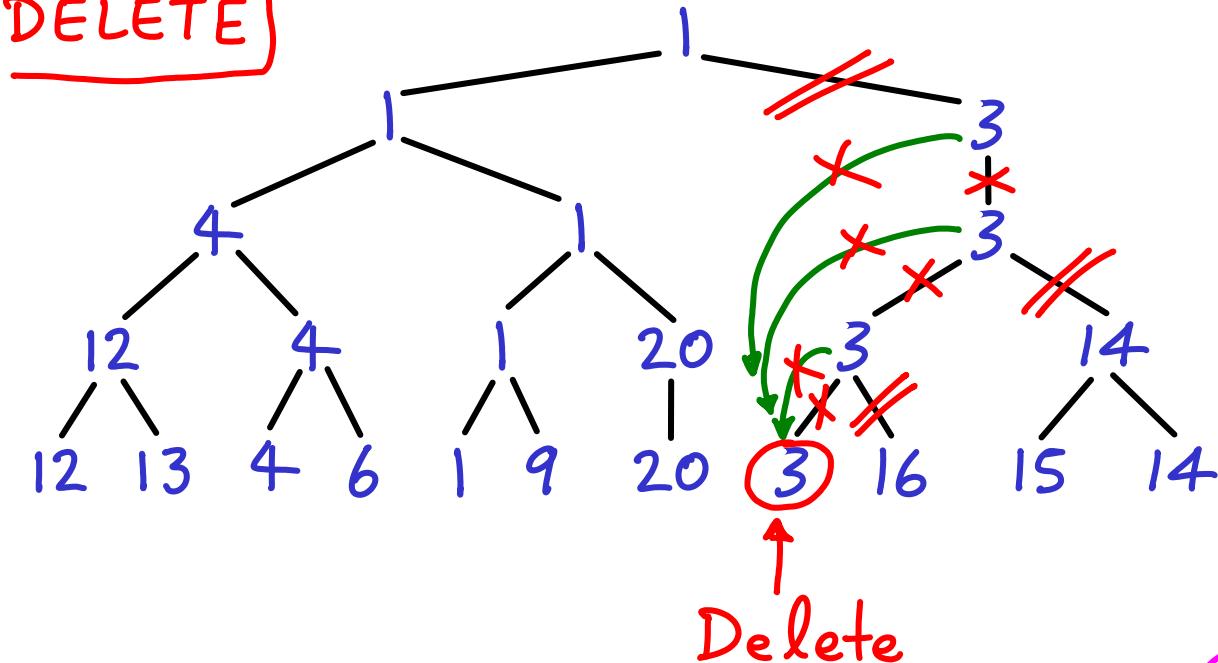


Walk up from leaf,
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Also decrement n_i



DELETE)

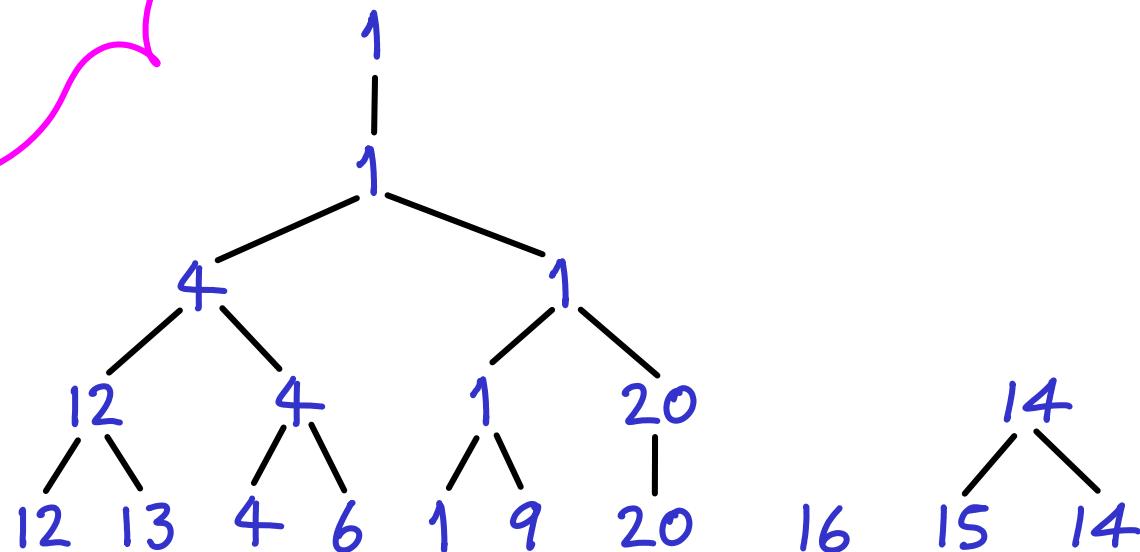


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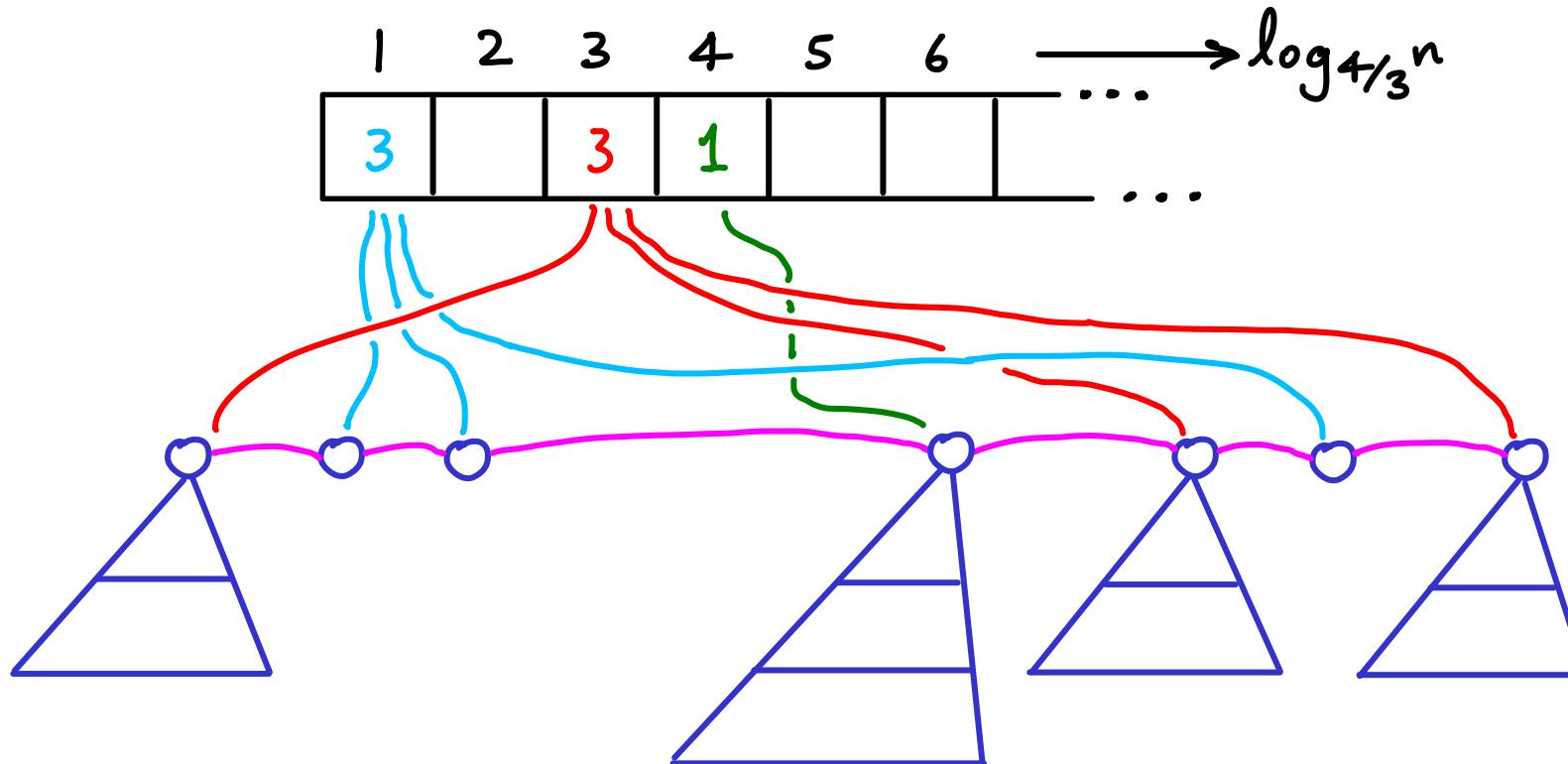
because of α :

- height = $O(\log n)$
- time = $O(\log n)$
- # new trees = $O(\log n)$



Make sure ≤ 1 tournament tree of each height.

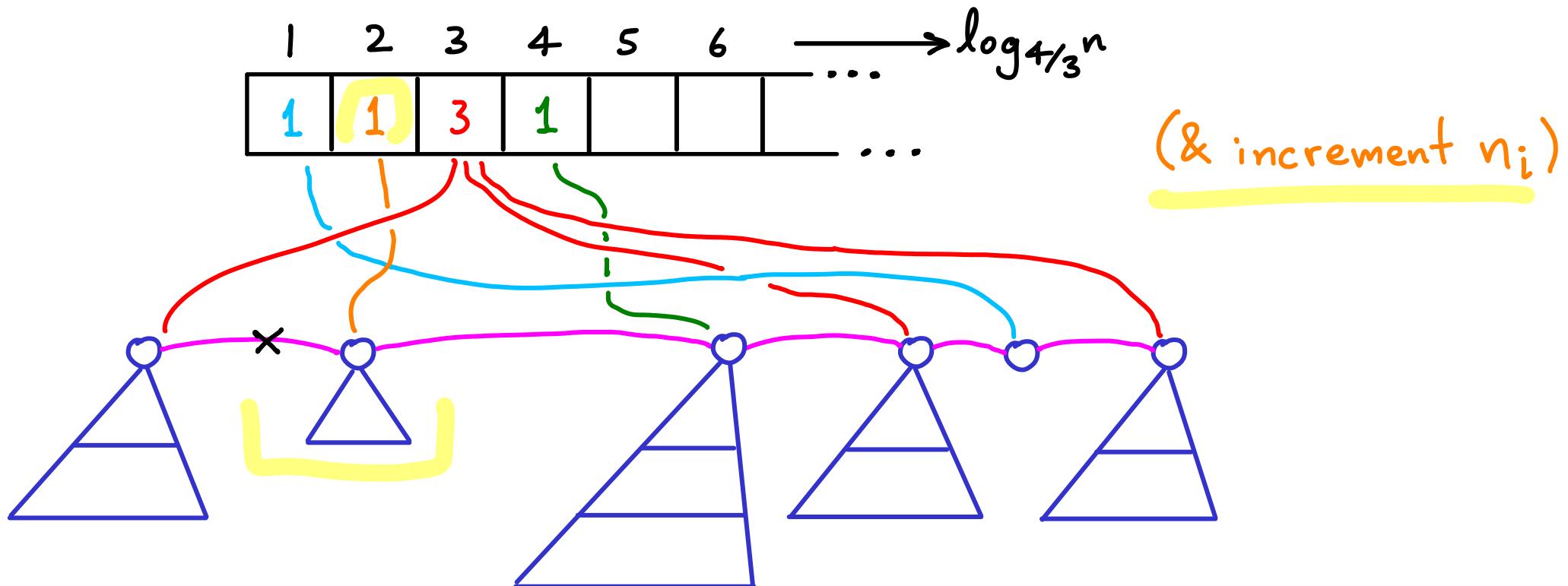
↪ LINK trees if equal height Every tree knows its height;
easy to maintain



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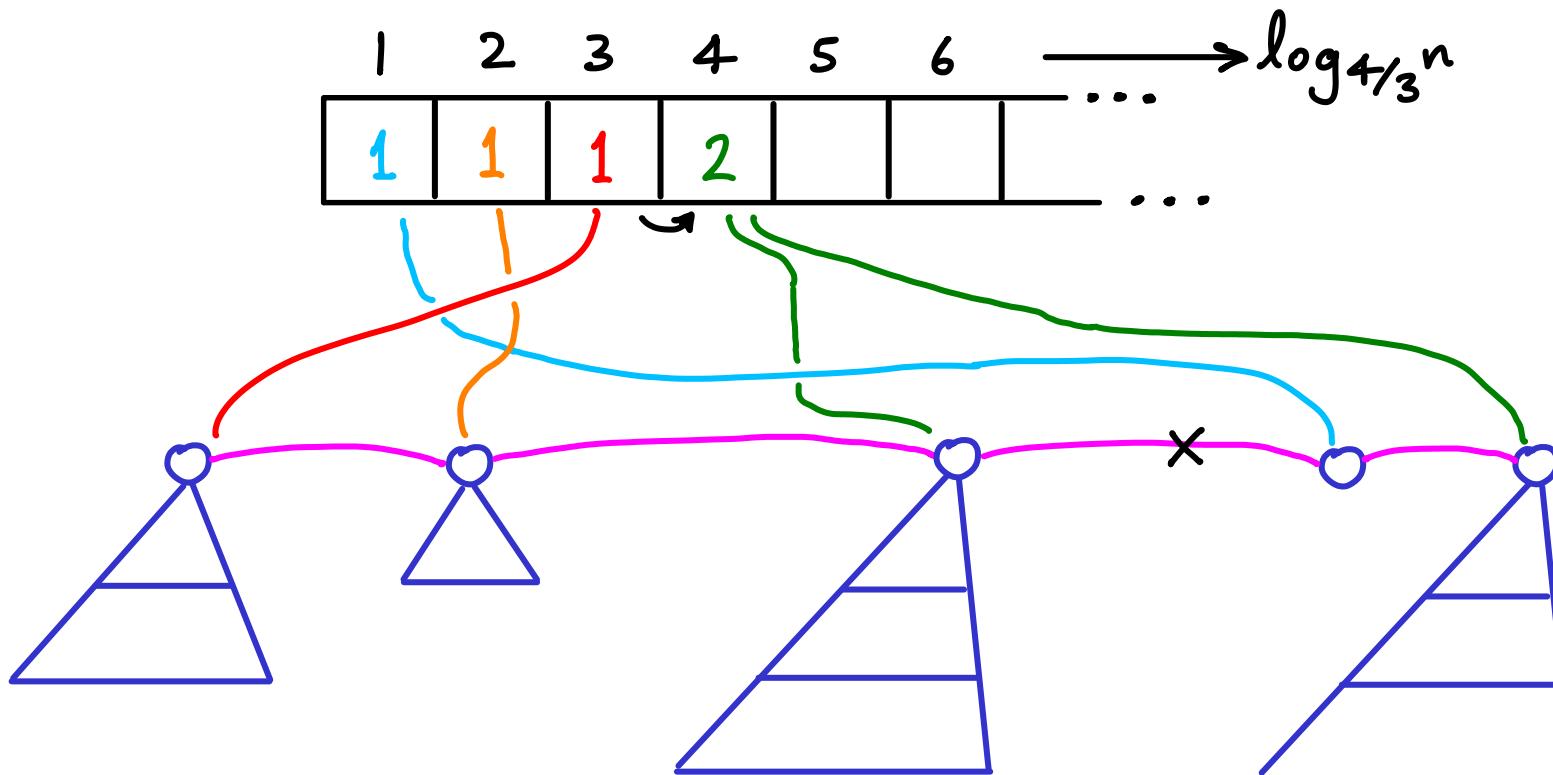
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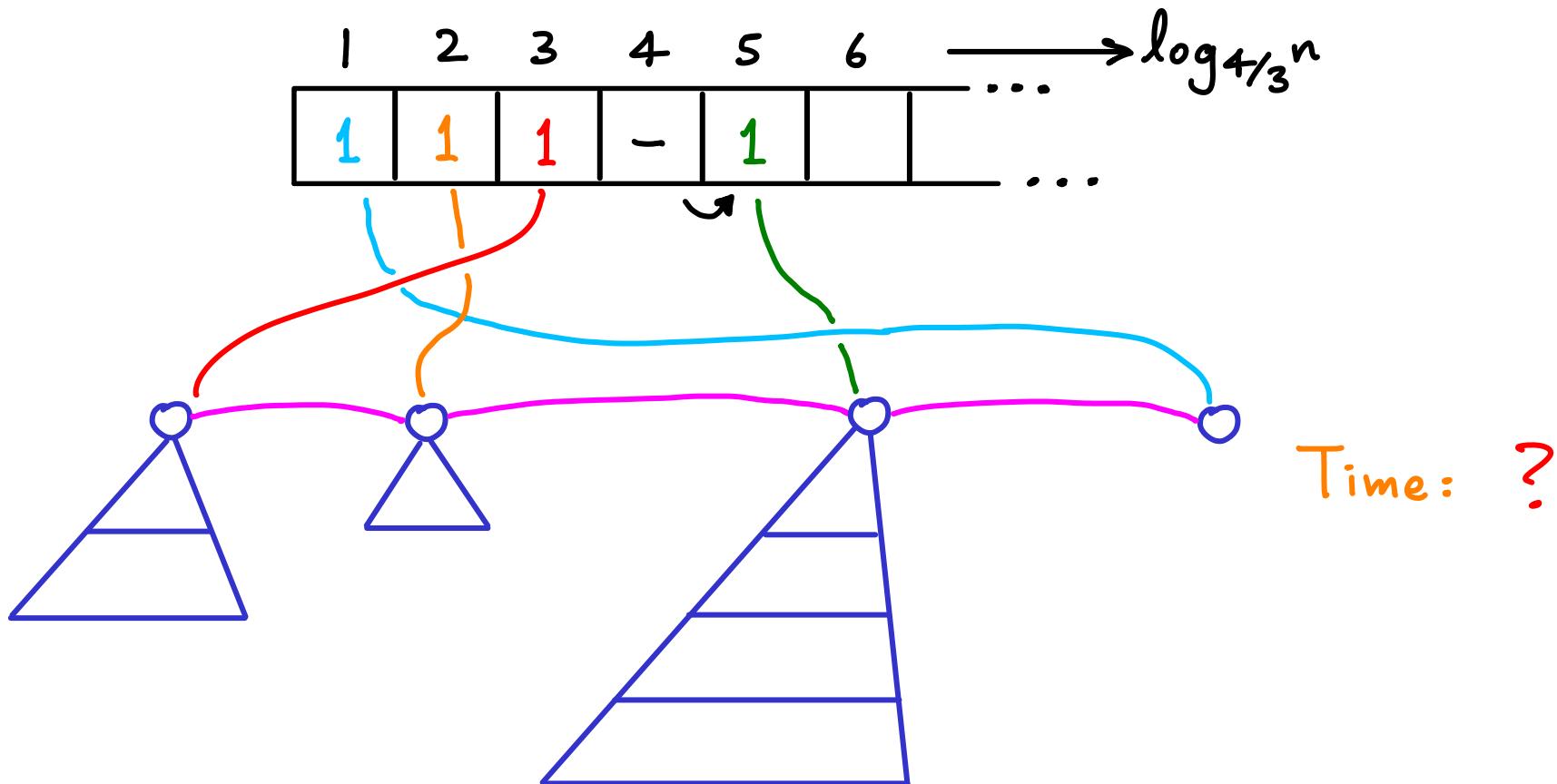
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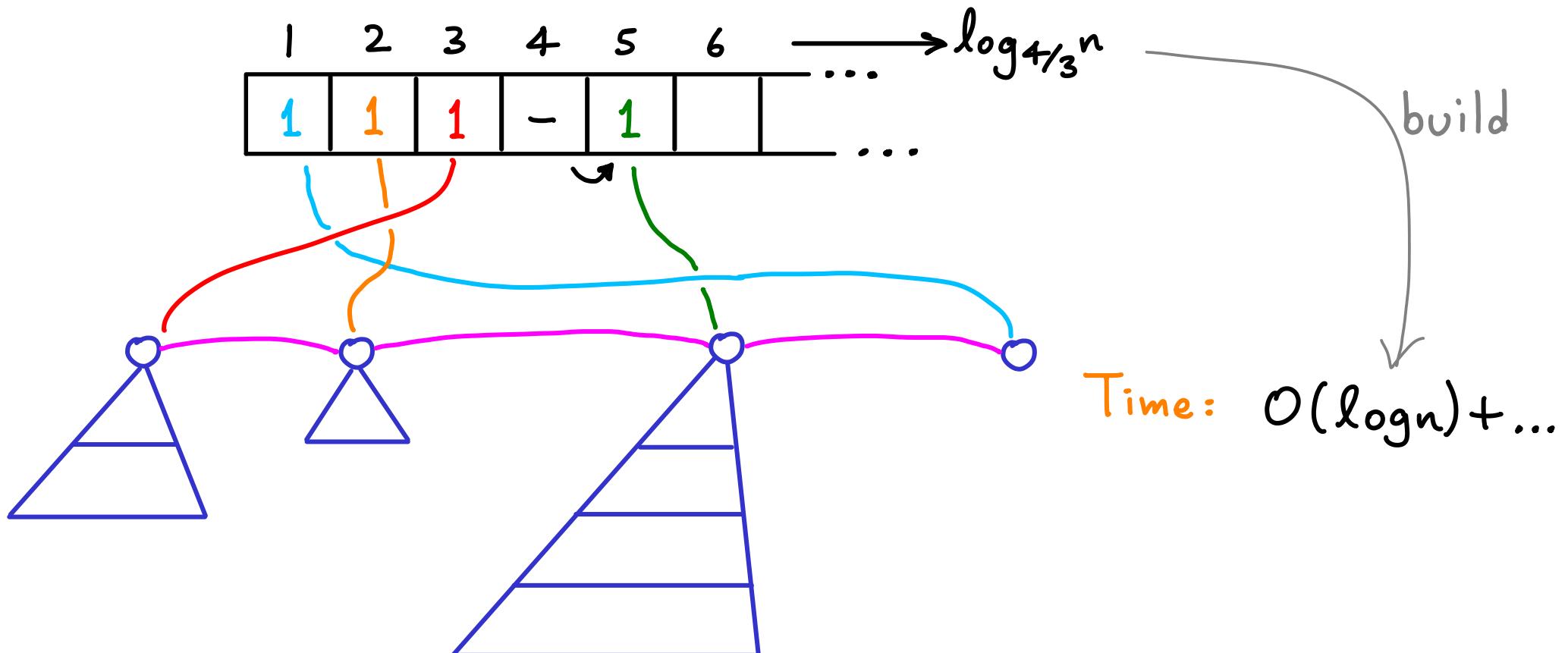
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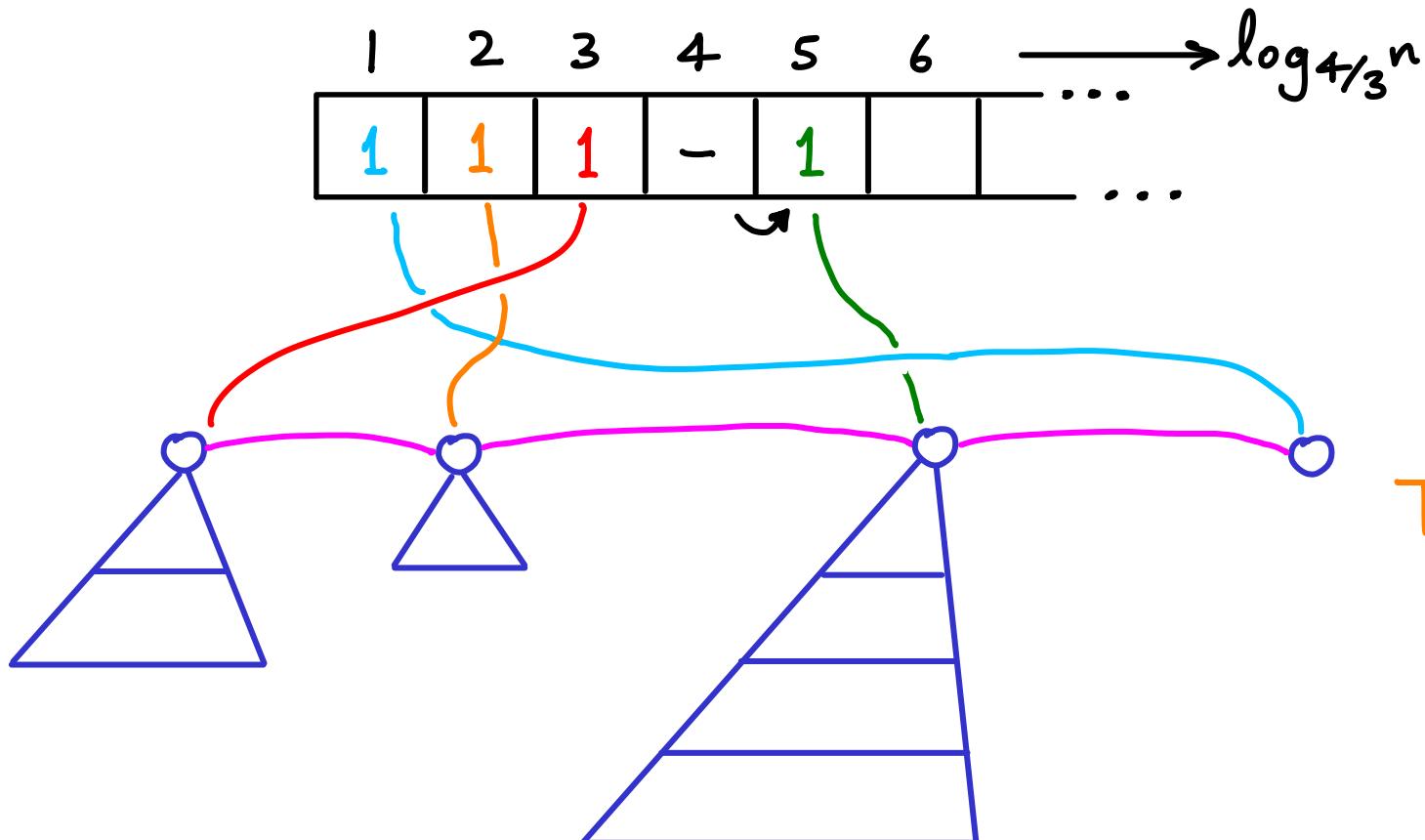
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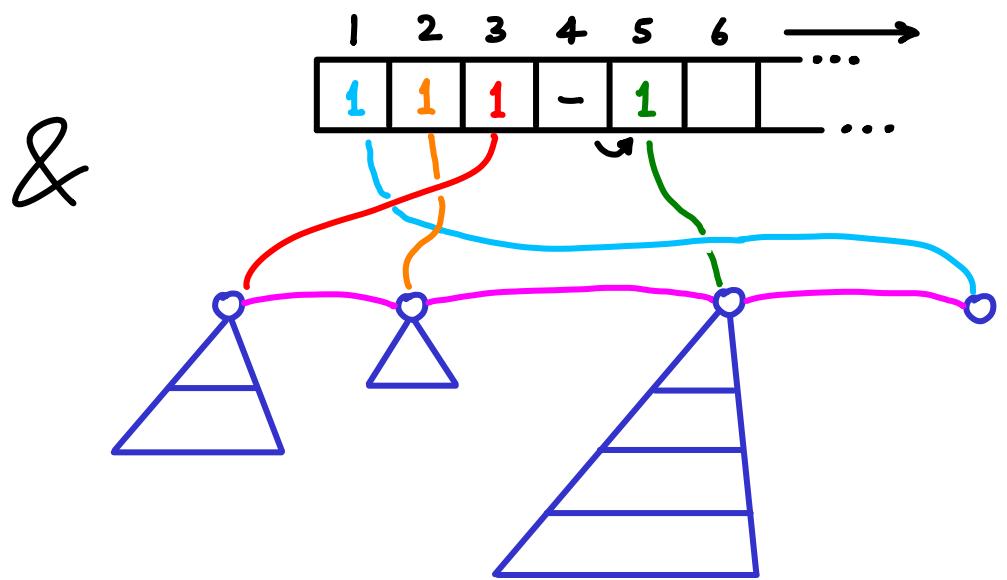
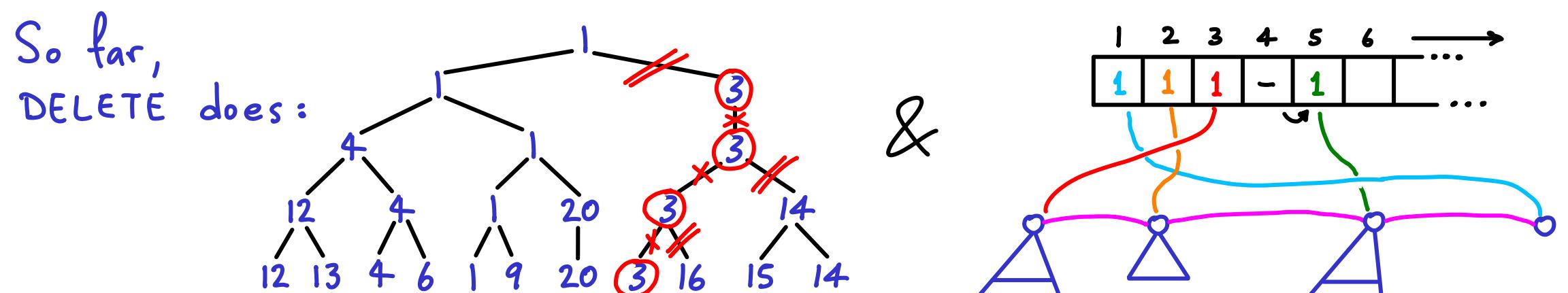
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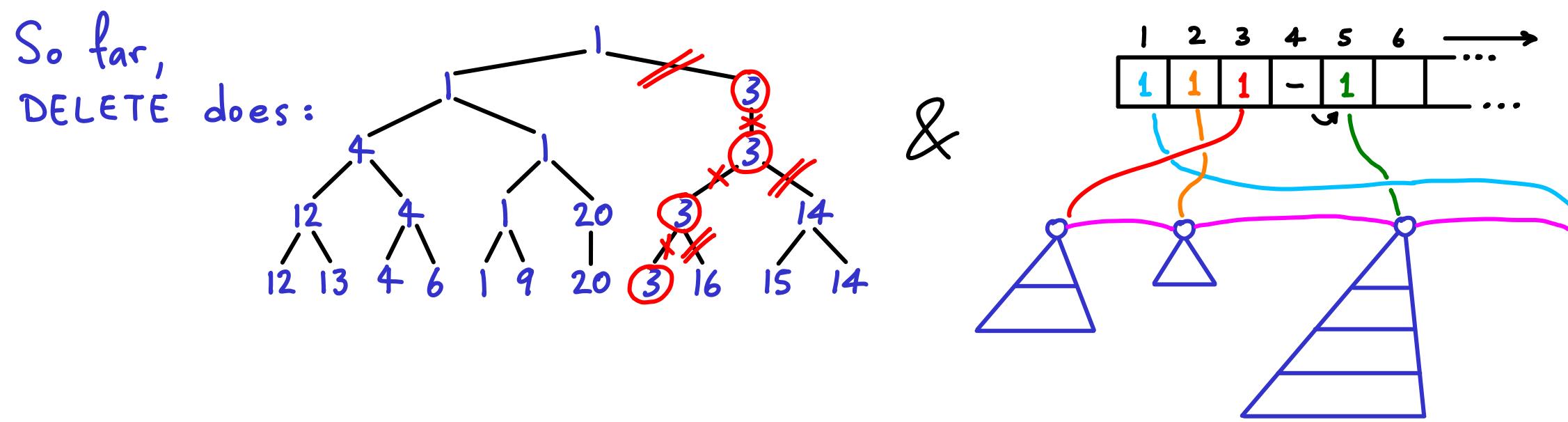
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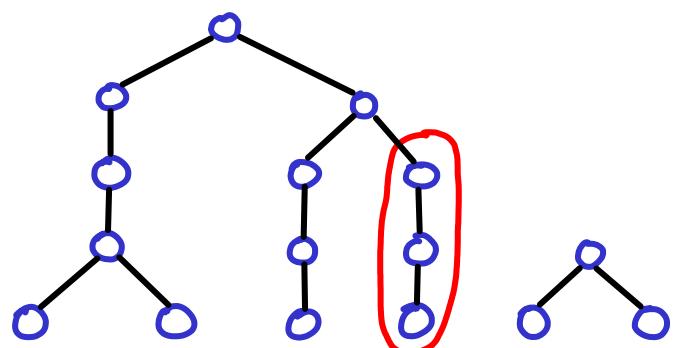
Time: $O(\log n) +$
+ $O(\# \text{trees}) = O(n)$

(each step reduces #trees)

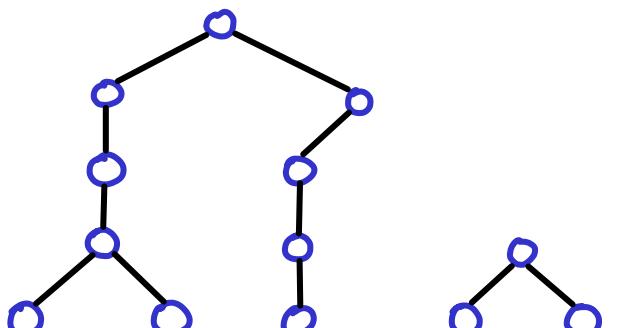




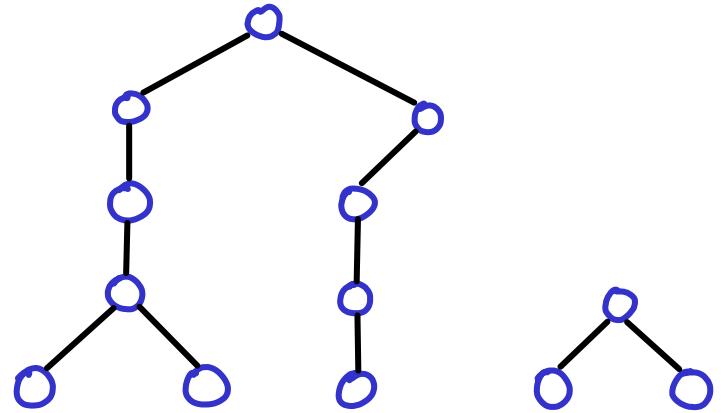
But DELETE can cause an α violation



$2/1$ ✓
 $3/2$ ✓
 $4/3$ ✓
 $6/4$ ✓



$2/1$ ✓
 $2/2$ ✗
 $3/2$ ✓
 $5/3$ ✓



$2/1 \checkmark$

$2/2 \times$

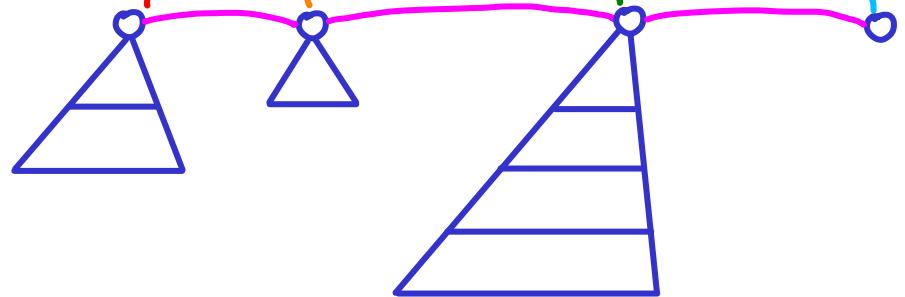
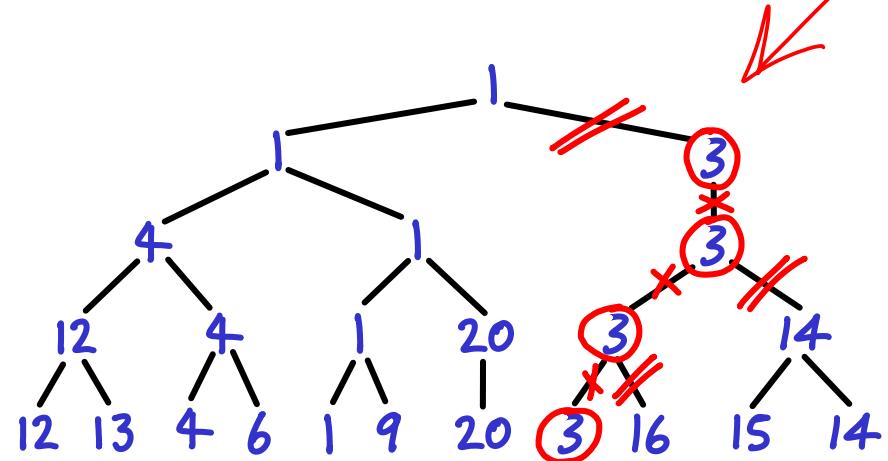
$3/2 \checkmark$

$5/3 \checkmark$

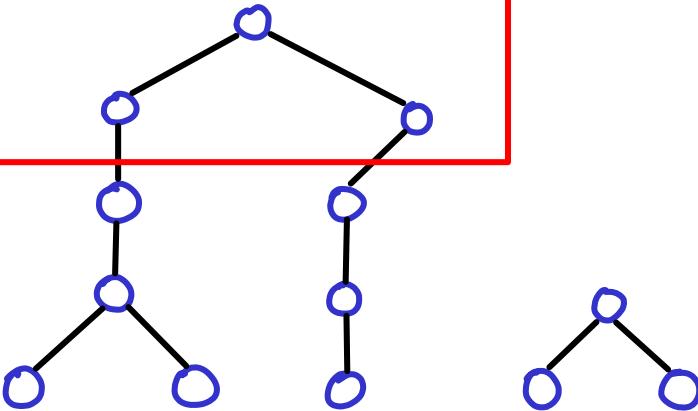
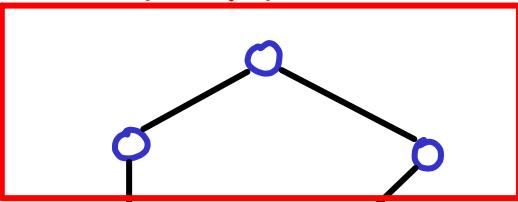
Detect lowest α -violation
while walking up during deletion.

& when incrementing α_i

1	2	3	4	5	6	...
1	1	1	-	1		...



QUAKE!



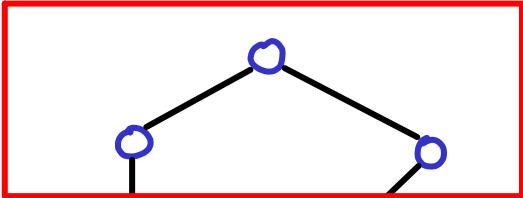
2/1 ✓

2/2 ✗

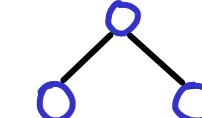
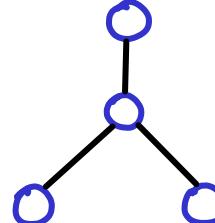
3/2 ✓

5/3 ✓

QUAKE!



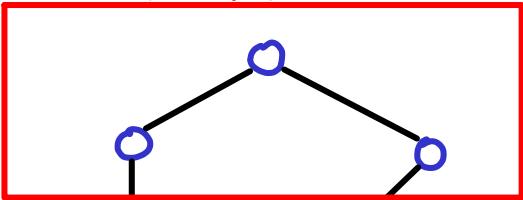
2/1 ✓
2/2 ✗
3/2 ✓
5/3 ✓



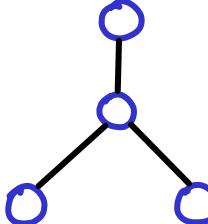
3/2 ✓
5/3 ✓

QUAKE = Remove all nodes above lowest α -violation
↳ in all trees

QUAKE!



2/1 ✓
2/2 ✗
3/2 ✓
5/3 ✓

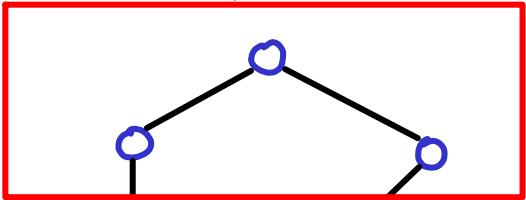


3/2 ✓
5/3 ✓

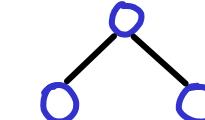
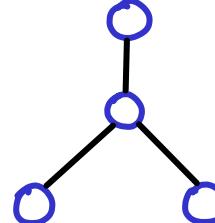
QUAKE = Remove all nodes above lowest α -violation (level v)
↳ in all trees

$$\hookrightarrow \text{Cost} = O\left(\sum_{i=v}^{\text{top}} n_i\right)$$

QUAKE!



2/1 ✓
2/2 ✗
3/2 ✓
5/3 ✓



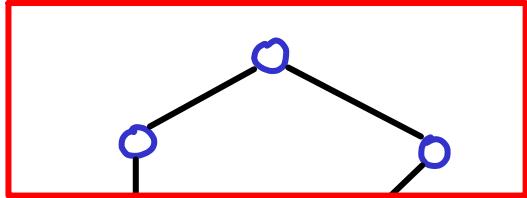
3/2 ✓
5/3 ✓

QUAKE = Remove all nodes above lowest α -violation (level v)
↳ in all trees

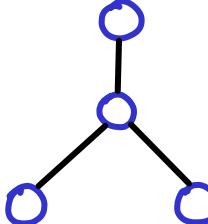
$$\hookrightarrow \text{Cost} = O\left(\sum_{i=v}^{\text{top}} n_i\right) = O(n)$$

but we will amortize

QUAKE!



2/1 ✓
2/2 ✗
3/2 ✓
5/3 ✓



3/2 ✓
5/3 ✓

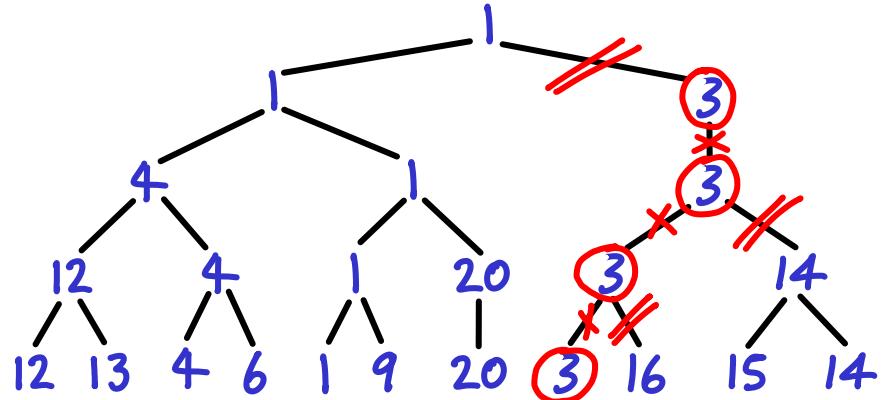
QUAKE = Remove all nodes above lowest α -violation (level v)
↳ in all trees

$$\hookrightarrow \text{Cost} = O\left(\sum_{i=v}^{\text{top}} n_i\right) = O(n)$$

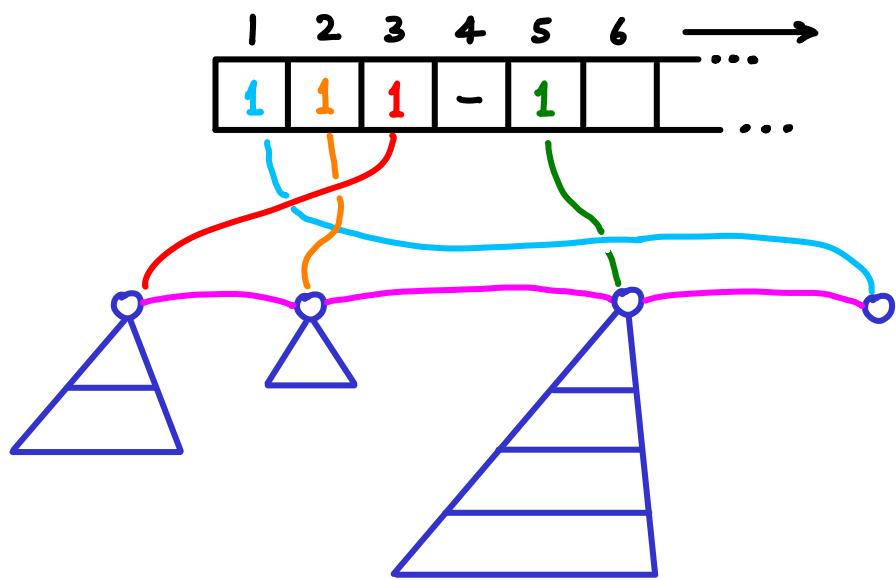
but we will amortize

↪ Now α is OK ↪ but we have more trees ↪ → bad for next DELETE

DELETE does:

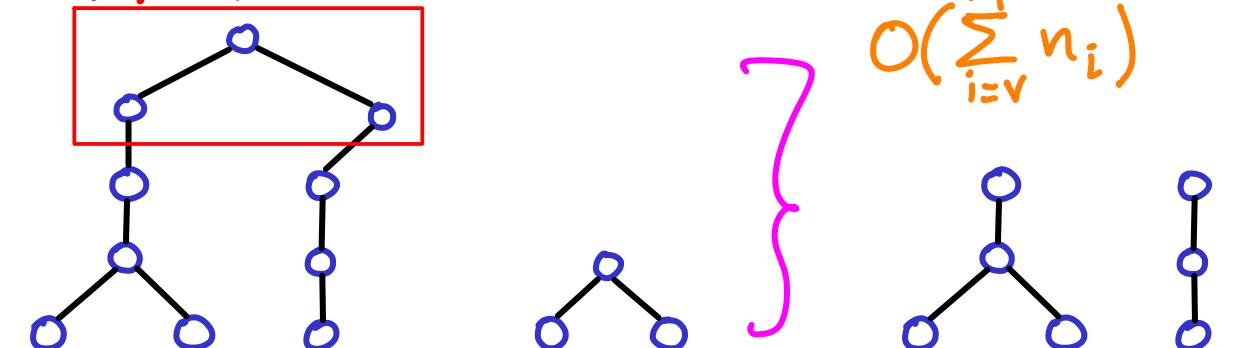


(1) $O(\log n)$ CUTS

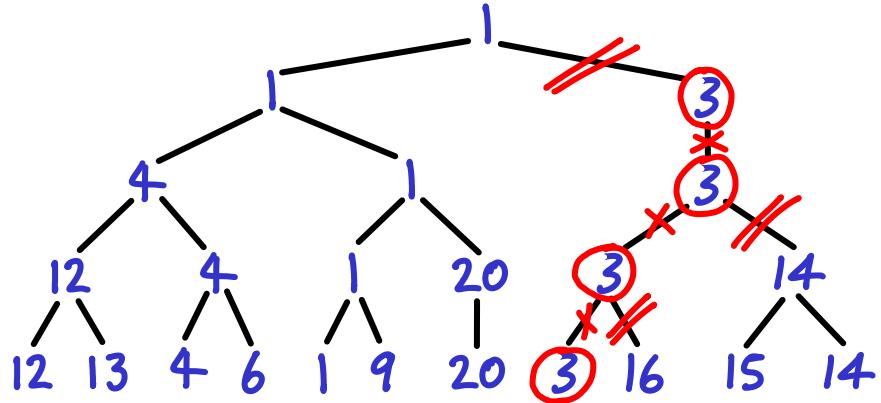


(2) $O(\# \text{trees})$ LINKS
+ $O(\log n)$ work

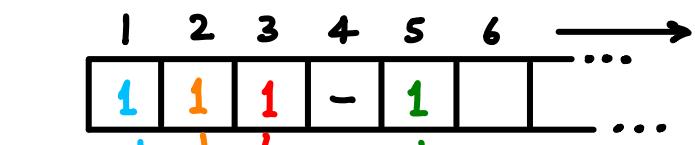
(3) QUAKE



DELETE does:

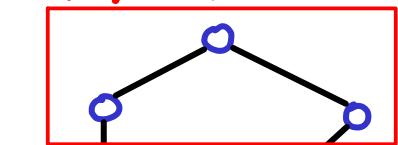


(1) $O(\log n)$ CUTS

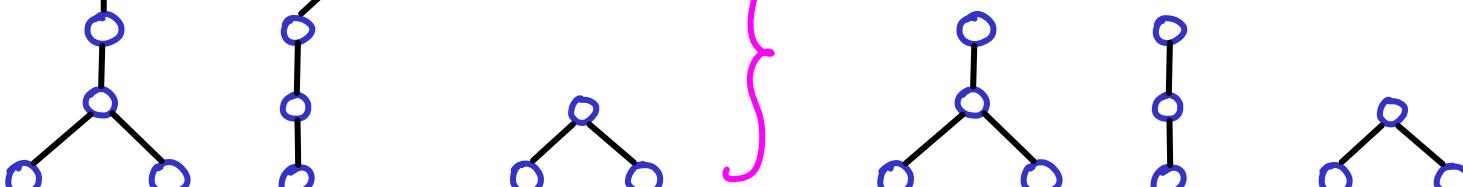


(2) $O(\# \text{trees})$ LINKS

(3) QUAKE

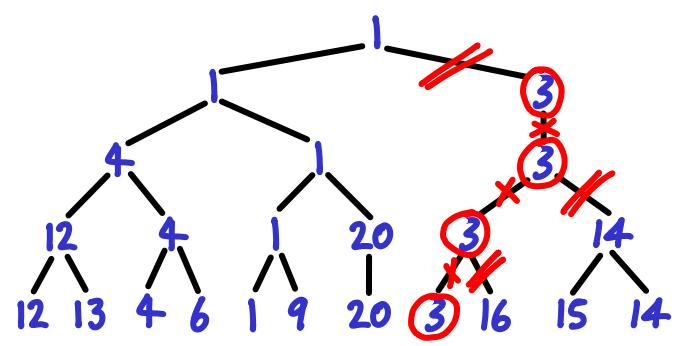


$$O\left(\sum_{i=v}^{\text{top}} n_i\right)$$

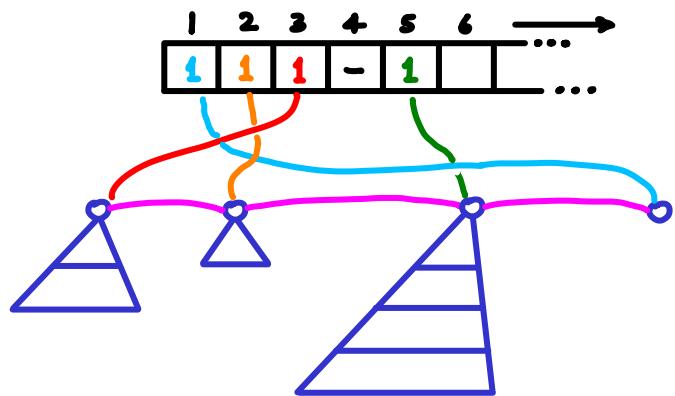


AMORTIZE
need to deal with:

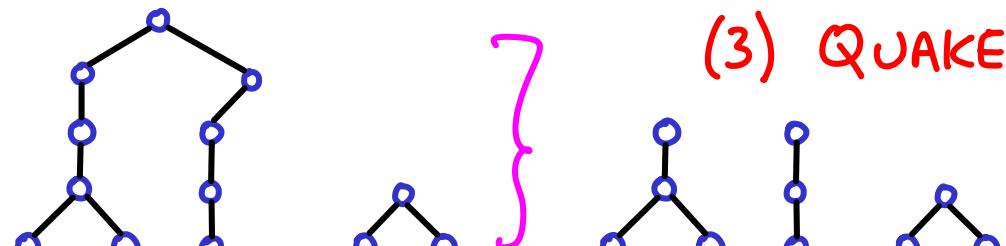
↪ #trees
↪ $\sum n_i$



(1) CUT



(2) LINK



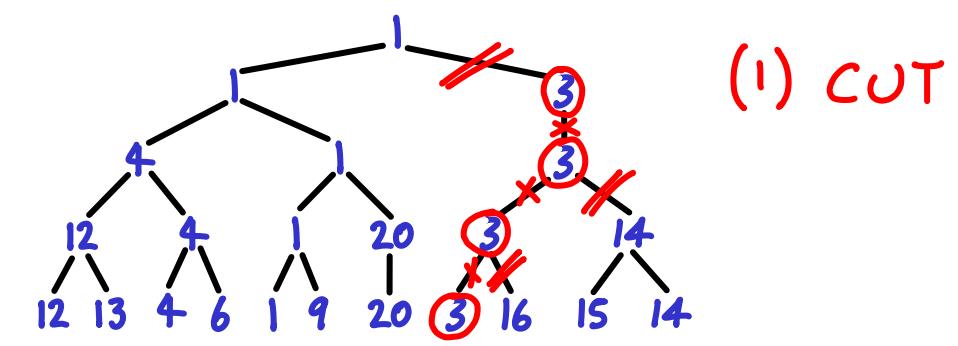
(3) QUAKE

AMORTIZE

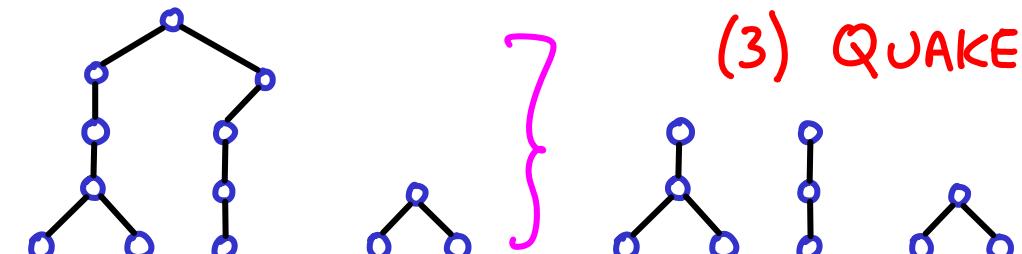
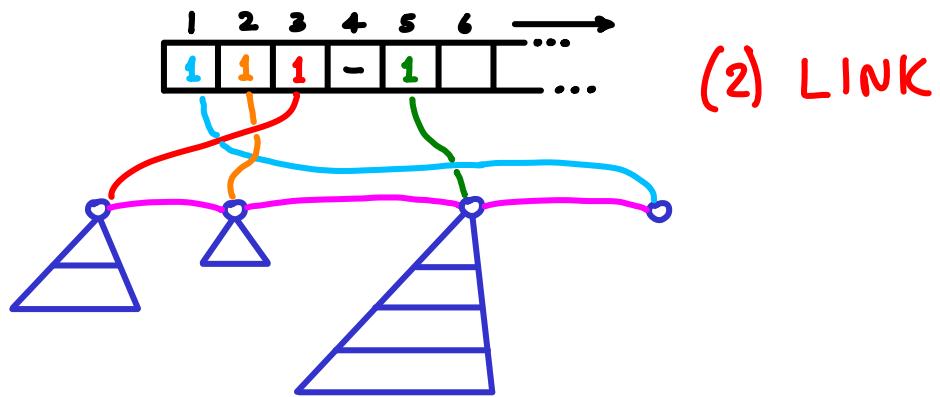
$\phi = N$?

$N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$

try to offset this



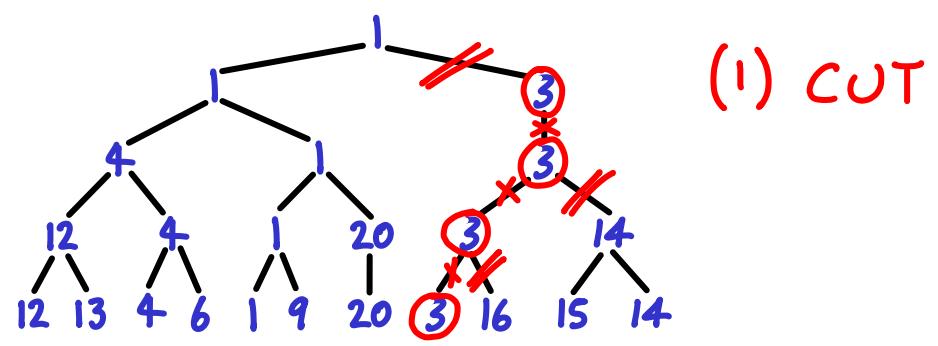
AMORTIZE $\Phi = N ?$
 $N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$



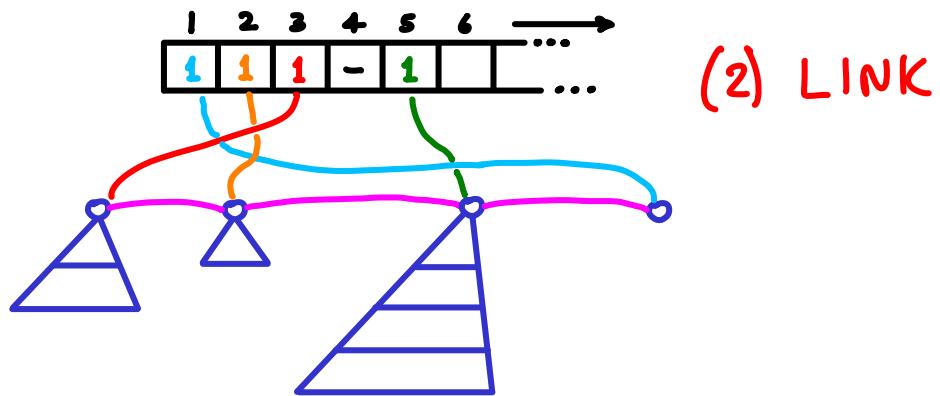
$$\Delta\Phi = -\sum_{i=v}^{\text{top}} n_i$$

$$\hat{c} = c + \Delta\Phi = 0$$





AMORTIZE $\Phi = N ?$
 $N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$



$$\Delta\Phi = ?$$

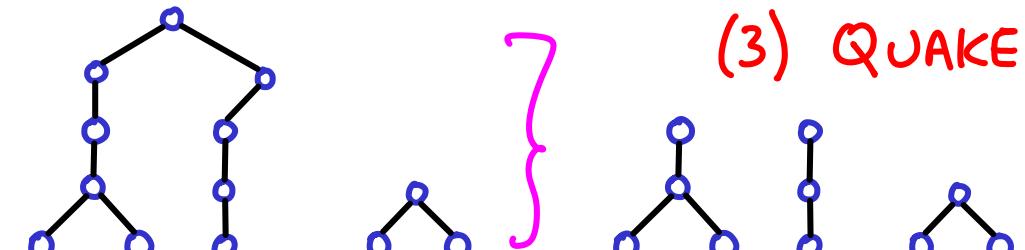
$$c = O(\#\text{trees}) + O(\log n)$$

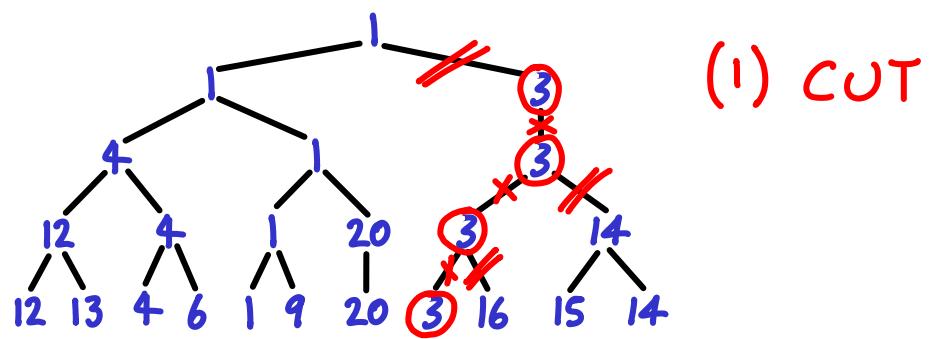
$$\Delta\Phi = -\sum_{i=v}^{\text{top}} n_i$$

$$\hat{c} = c + \Delta\Phi = 0$$

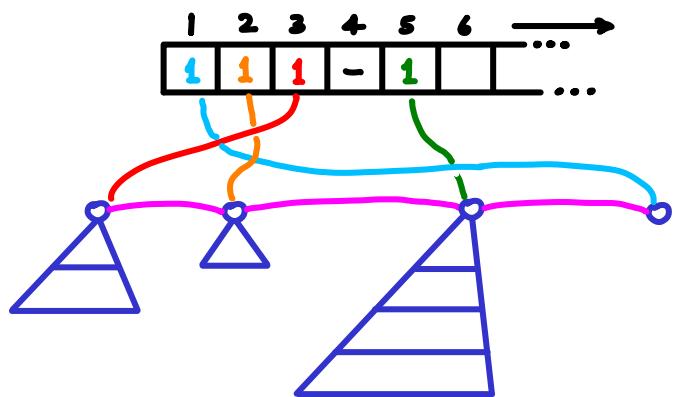


]

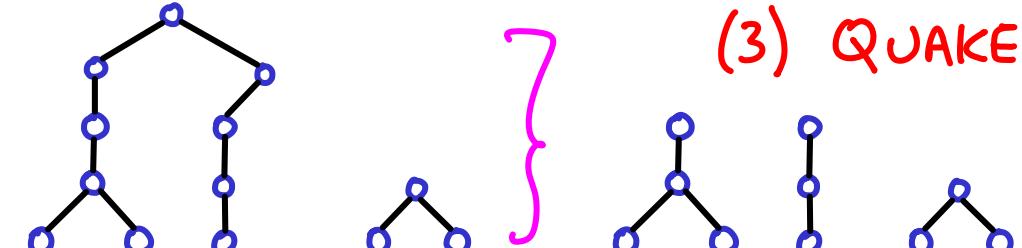




(1) CUT



(2) LINK



(3) QUAKE

AMORTIZE

$N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$

$\Phi = N ?$

$$\Delta\Phi \geq 0 \approx$$

$$c = O(\#\text{trees}) + O(\log n)$$

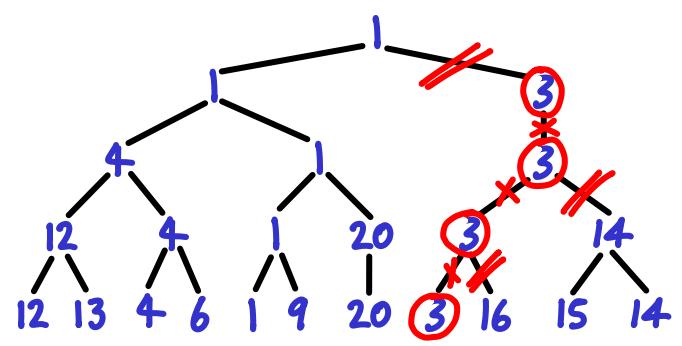
Actually,
 $\Delta\Phi = \Delta N \leq \#\text{trees}$

Each LINK
 creates one node

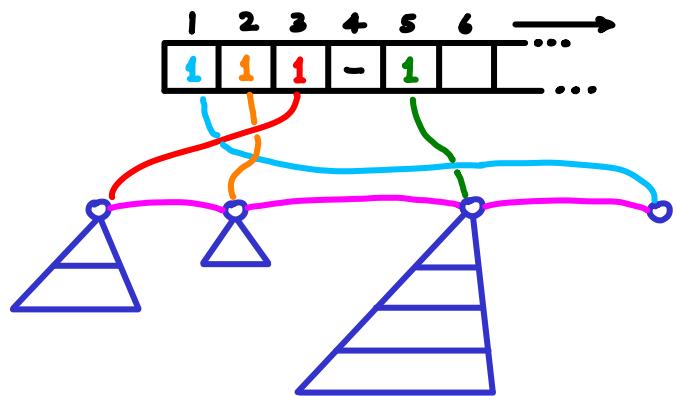
$$\Delta\Phi = -\sum_{i=v}^{\text{top}} n_i$$

$$\hat{c} = c + \Delta\Phi = 0$$

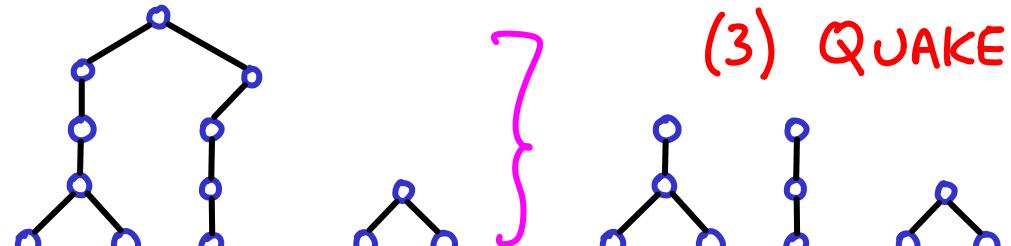




(1) CUT



(2) LINK



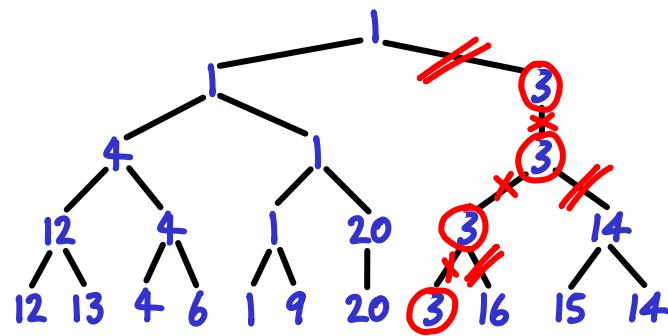
(3) QUAKE

AMORTIZE

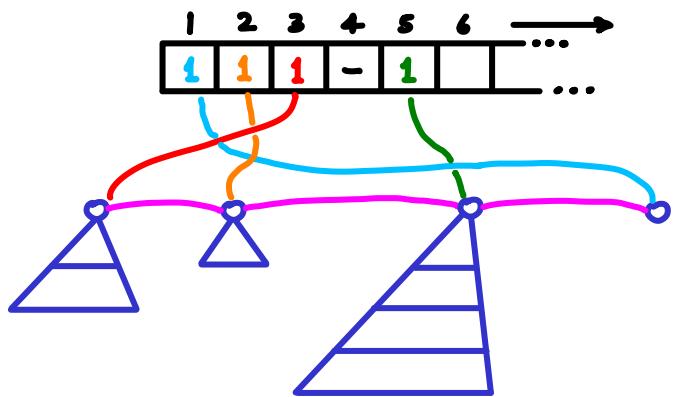
$$\Phi = N + T ?$$

$N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$

$T = \# \text{trees}$



(1) CUT



(2) LINK

AMORTIZE

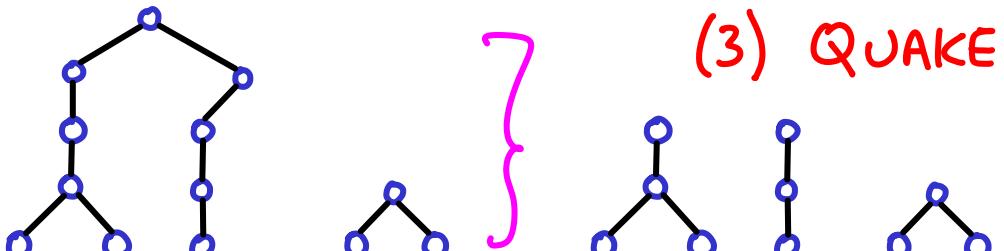
$N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$

$$\Phi = N + T ?$$

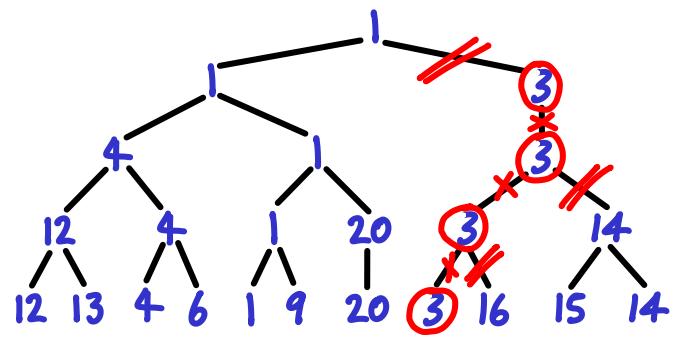
$T = \# \text{trees}$

$$c_j = O(T_{j-1}) + O(\log n)$$

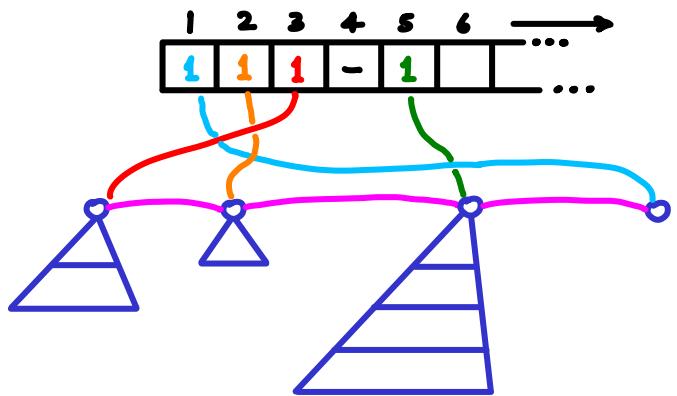
j=iteration #
(operation)



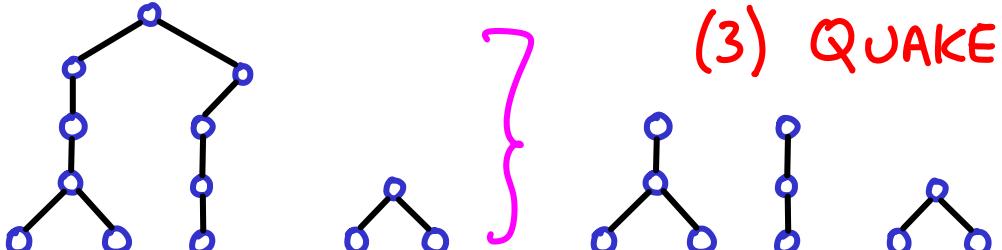
(3) QUAKE



(1) CUT



(2) LINK



(3) QUAKE

AMORTIZE

$\Phi = N + T$?
 $N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$

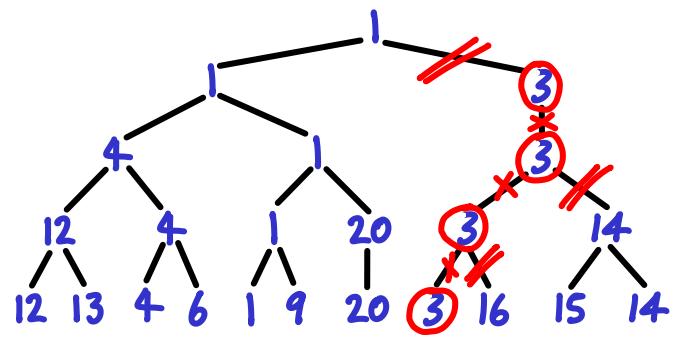
$T = \# \text{trees}$

$$\Delta\Phi_j \leq \overbrace{T_{j-1}}^{\Delta N} + \overbrace{(\log n - T_{j-1})}^{\Delta T}$$

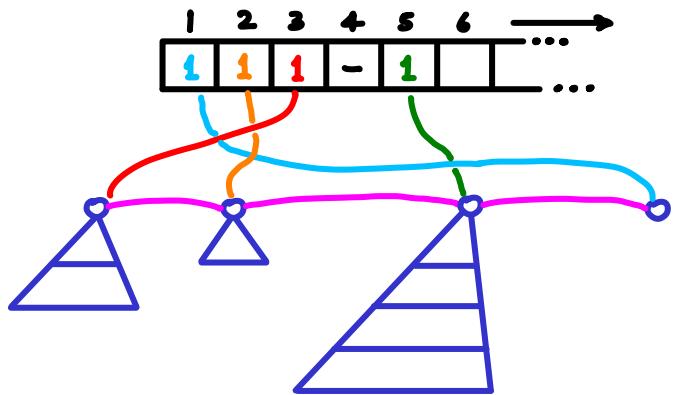
⋮

$$c_j = O(T_{j-1}) + O(\log n)$$

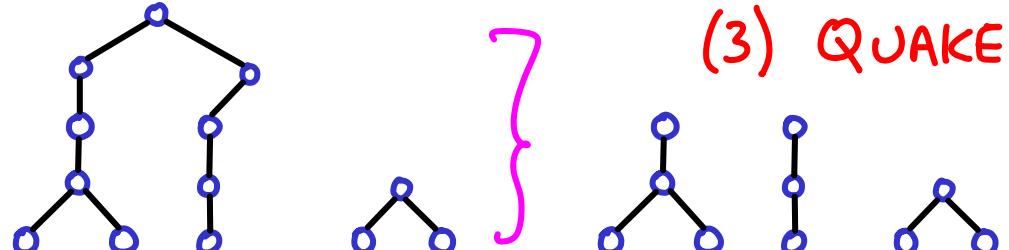
j = iteration #



(1) CUT



(2) LINK



AMORTIZE

$\Phi = N + T ?$

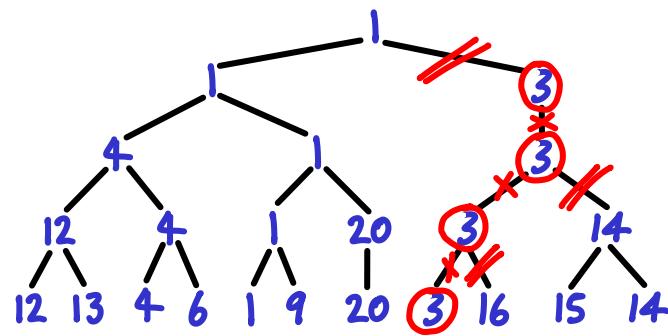
$N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$

$T = \# \text{trees multiplied by some constant, } c$

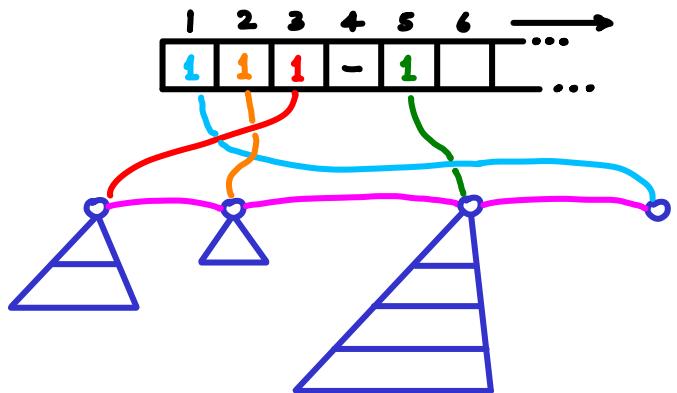
$$\Delta\Phi_j \leq \overbrace{T_{j-1}}^{\Delta N} + c(\log n - T_{j-1}) \overbrace{\Delta T}$$

$$c_j = O(T_{j-1}) + O(\log n)$$

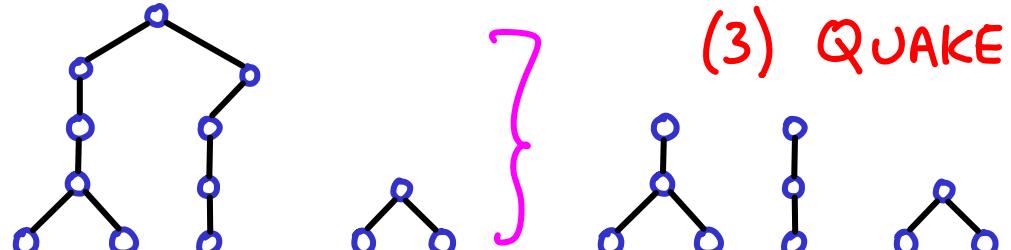
j = iteration #



(1) CUT



(2) LINK



(3) QUAKE

AMORTIZE

$\Phi = N + T ?$

$N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$

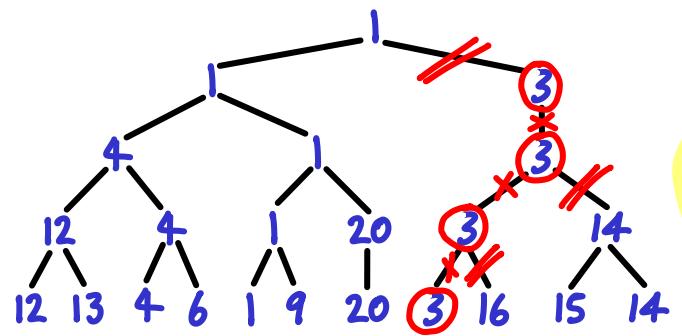
$T = \# \text{trees multiplied by some constant, } c$

$$\Delta\Phi_j \leq \overbrace{T_{j-1}}^{\Delta N} + c(\log n - T_{j-1}) \overbrace{\Delta T}$$

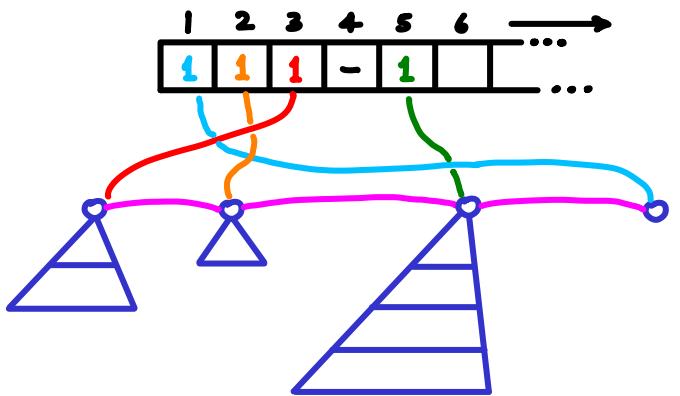
$$c_j = O(T_{j-1}) + O(\log n)$$

$$\hat{c}_j = O(\log n) \quad \checkmark$$

j = iteration #



(1) CUT
 $\Delta T = O(\log n)$
 $\Delta N < 0$



(2) LINK

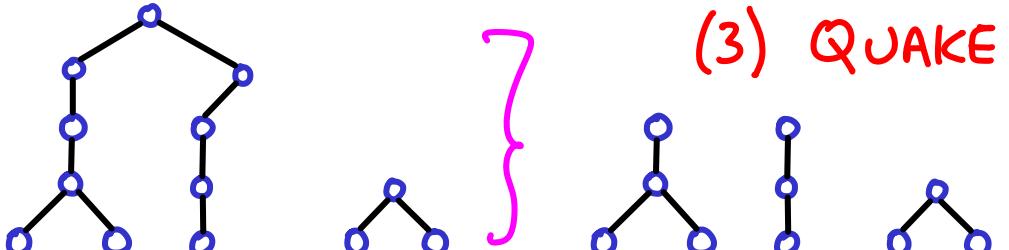
AMORTIZE $\Phi = N + T ?$
 $N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$
 $T = \# \text{trees multiplied by some constant, } c$

$$\Delta \Phi_j \leq \overbrace{T_{j-1}}^{\Delta N} + c(\log n - T_{j-1}) \overbrace{\log n}^{\Delta T}$$

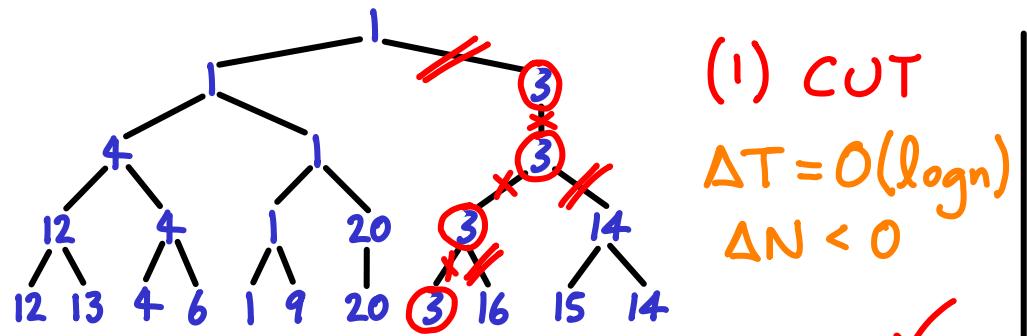
$$c_j = O(T_{j-1}) + O(\log n)$$

$$\hat{c}_j = O(\log n) \quad \checkmark$$

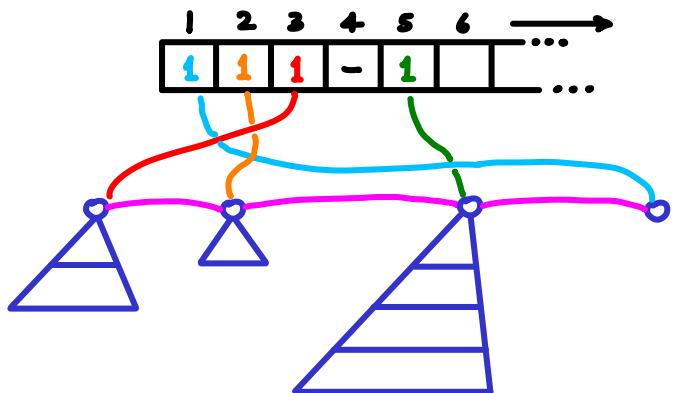
j = iteration #



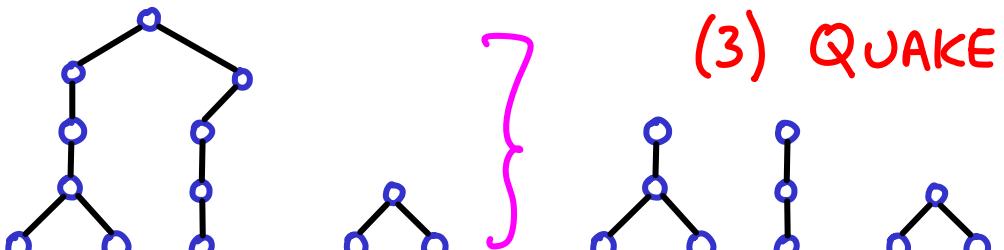
(3) QUAKE



(1) CUT
 $\Delta T = O(\log n)$
 $\Delta N < 0$



(2) LINK



(3) QUAKE

AMORTIZE $\Phi = N + T ?$
 $N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$
 $T = \# \text{trees multiplied by some constant, } c$

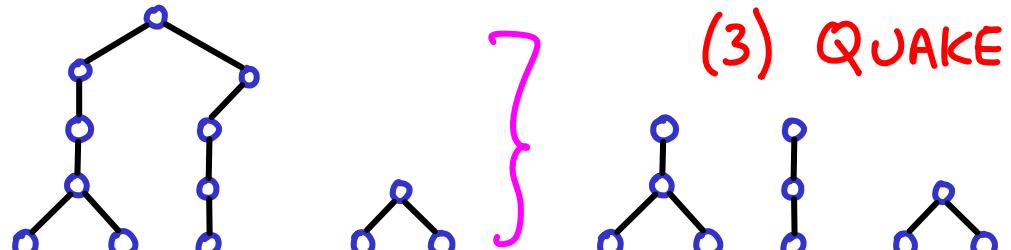
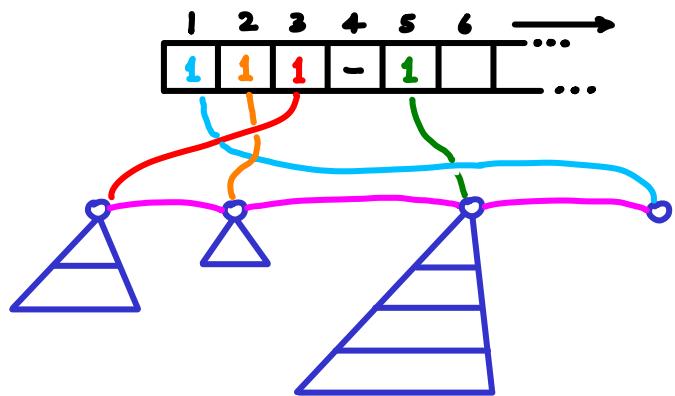
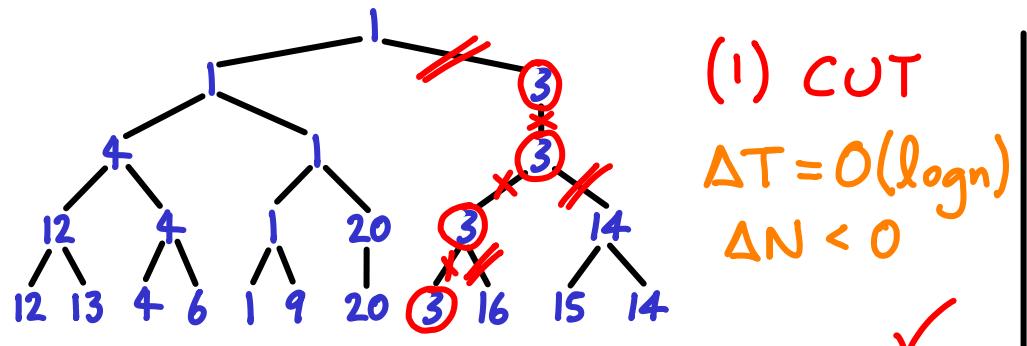
$$\Delta \Phi_j \leq \overbrace{T_{j-1}}^{\Delta N} + \overbrace{c(\log n - T_{j-1})}^{\Delta T}$$

$$c_j = O(T_{j-1}) + O(\log n)$$

$$\hat{c}_j = O(\log n) \quad \checkmark$$

j = iteration #

$$\Delta \Phi = -\sum_{i=v}^{\text{top}} n_i + c \cdot \Delta T = ? \quad i = \text{level \#}$$



AMORTIZE $\Phi = N + T ?$
 $N = \# \text{nodes in Quake heap} \neq n (\# \text{keys})$
 $T = \# \text{trees multiplied by some constant, } c$

$$\Delta \Phi_j \leq \overbrace{T_{j-1}}^{\Delta N} + c(\log n - T_{j-1}) \overbrace{\Delta T}$$

$$c_j = O(T_{j-1}) + O(\log n)$$

$$\hat{c}_j = O(\log n) \quad \checkmark$$

j = iteration #

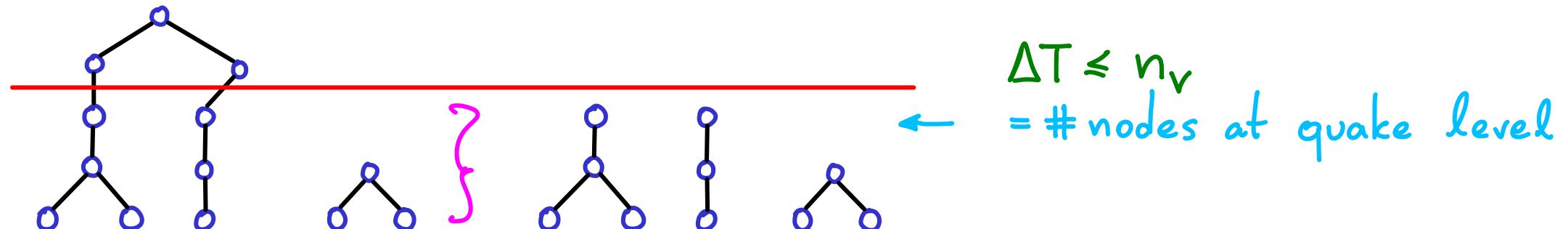
$$\Delta \Phi = -\sum_{i=v}^{\text{top}} n_i + c \cdot \Delta T = ? \quad i = \text{level \#}$$

$$\hat{c} = c + \Delta \Phi = \sum_{i=v}^{\text{top}} n_i - \sum_{i=v}^{\text{top}} n_i + c \cdot \Delta T = ?$$

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT

T
times c

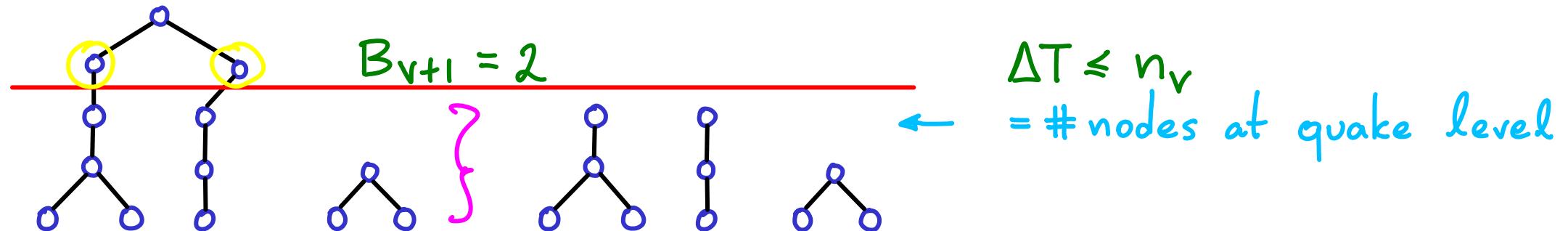
QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



$$n_v = n_3 = 2$$

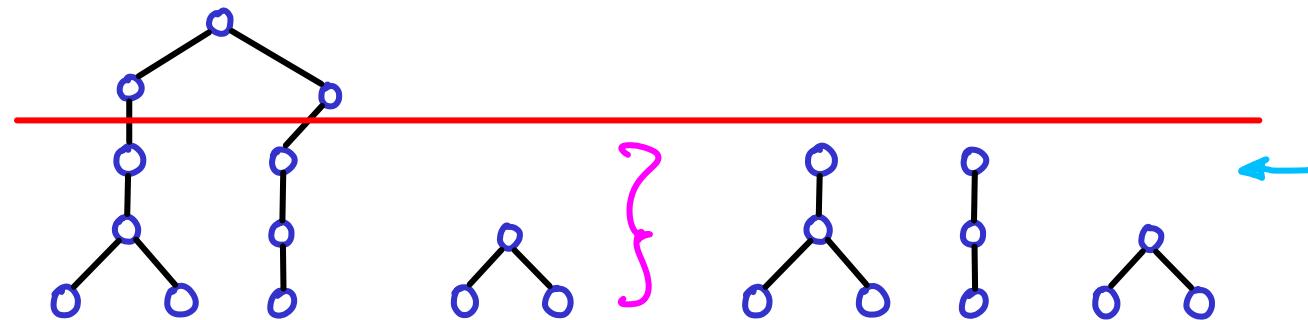
$$\Delta T = 1$$

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



B_{v+1} = # nodes at level $v+1$ with only 1 child

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



$$\Delta T \leq n_v$$

= # nodes at quake level

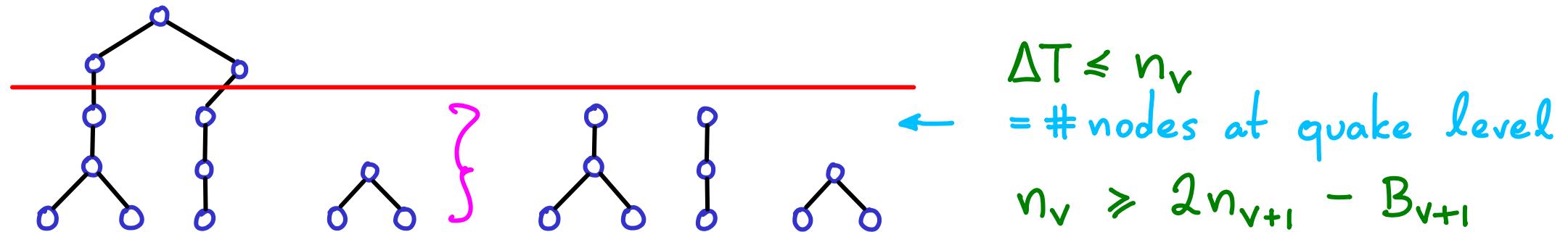
$$n_v \geq 2n_{v+1} - B_{v+1}$$

B_{v+1} = # nodes at level $v+1$ with only 1 child



Equal if every node in n_v has a parent

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



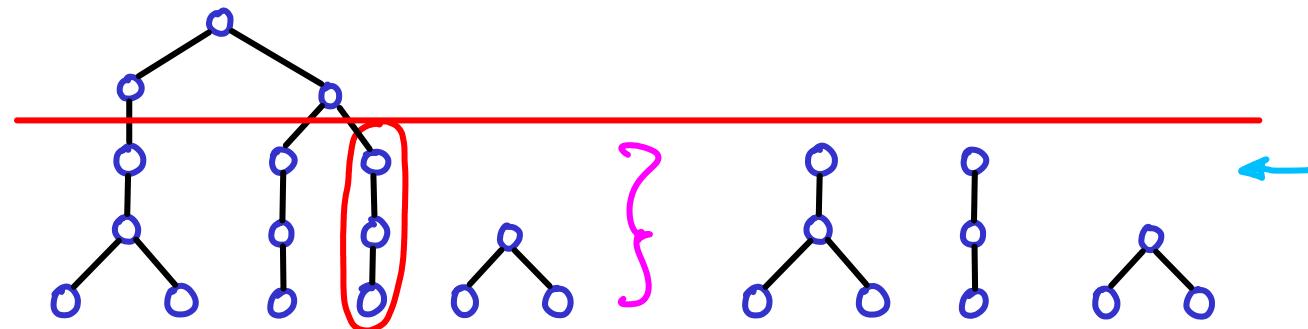
$$\Delta T \leq n_v$$

= # nodes at quake level

$$n_v \geq 2n_{v+1} - B_{v+1}$$

$$B_{v+1} = \# \text{nodes at level } v+1 \text{ with only 1 child} \geq 2n_{v+1} - n_v$$

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



$$\Delta T \leq n_v$$

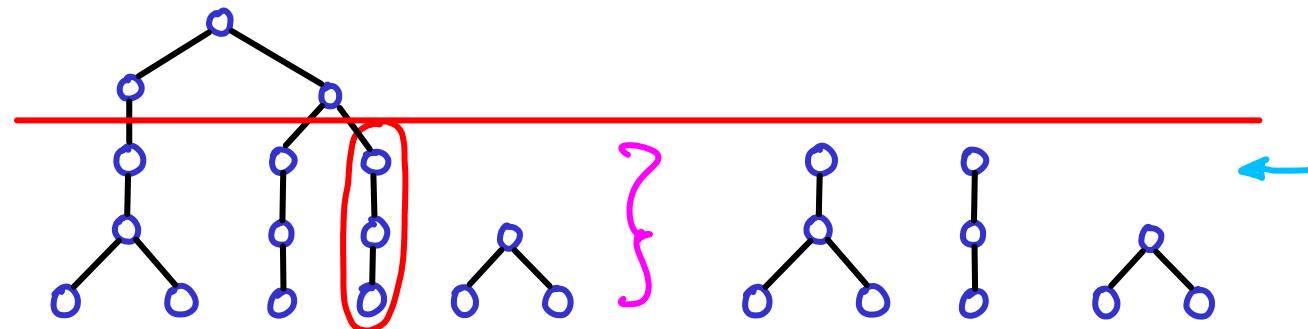
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violation $\Rightarrow \frac{n_{v+1}}{n_v} > \frac{3}{4}$

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



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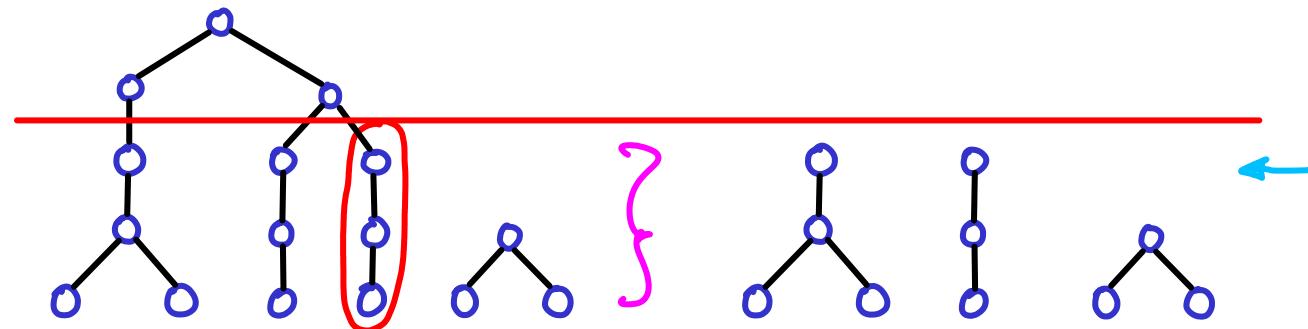
= # nodes at quake level

$$n_v \geq 2n_{v+1} - B_{v+1}$$

$$B_{v+1} = \# \text{nodes at level } v+1 \text{ with only 1 child} \geq 2\underline{n_{v+1}} - n_v > 2 \cdot \frac{3}{4} n_v - n_v$$

violation $\Rightarrow \frac{n_{v+1}}{n_v} > \frac{3}{4}$

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



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= # nodes at quake level

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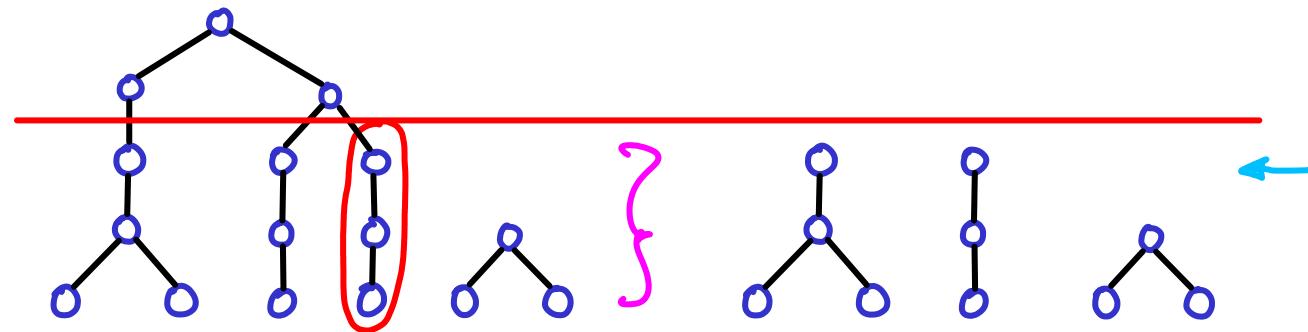
$B_{v+1} = \# \text{nodes at level } v+1 \text{ with only 1 child} \geq 2n_{v+1} - n_v > 2 \cdot \frac{3}{4} n_v - n_v$

$$B_{v+1} > \frac{1}{2} n_v$$



violation $\Rightarrow \frac{n_{v+1}}{n_v} > \frac{3}{4}$

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



$$\Delta T \leq n_v$$

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$$B_{v+1} > \frac{1}{2} n_v$$

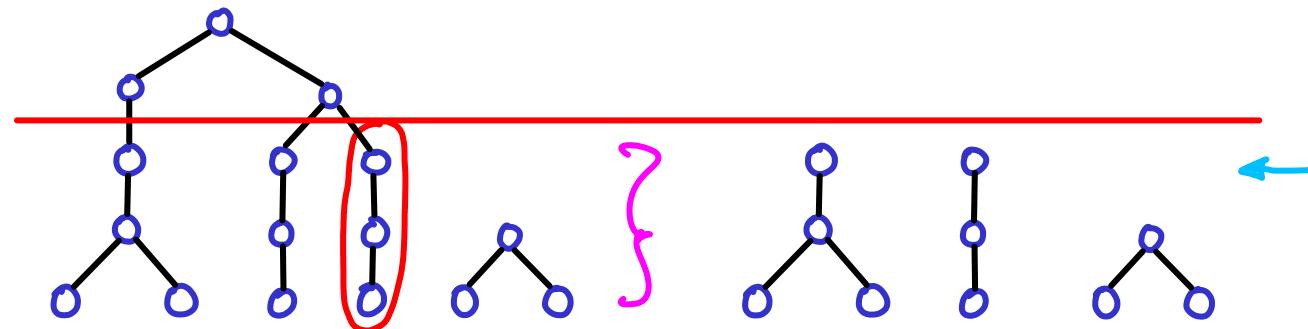


violation $\Rightarrow \frac{n_{v+1}}{n_v} > \frac{3}{4}$

With the quake, # B -nodes goes down by at least B_{v+1}

Any node with only 1 child, in all levels

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



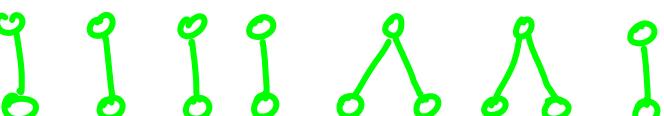
$$\Delta T \leq n_v$$

= # nodes at quake level

$$n_v \geq 2n_{v+1} - B_{v+1}$$

$$B_{v+1} = \# \text{nodes at level } v+1 \text{ with only 1 child} \geq 2n_{v+1} - n_v > 2 \cdot \frac{3}{4} n_v - n_v$$

$$B_{v+1} > \frac{1}{2} n_v$$

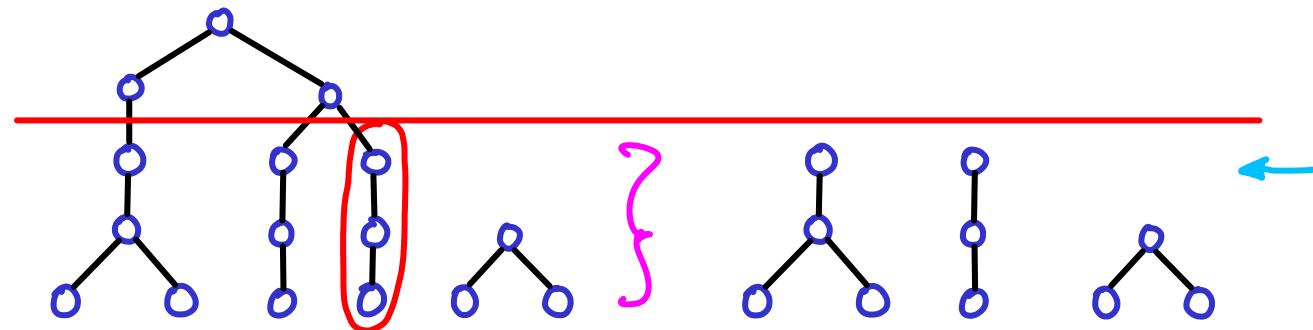


$$\text{violation} \Rightarrow \frac{n_{v+1}}{n_v} > \frac{3}{4}$$

With the quake, #B-nodes goes down by at least B_{v+1}

$$\Delta B \leq -B_{v+1}$$

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



$$\Delta T \leq n_v$$

= # nodes at quake level

$$n_v \geq 2n_{v+1} - B_{v+1}$$

$$B_{v+1} = \# \text{nodes at level } v+1 \text{ with only 1 child} \geq 2n_{v+1} - n_v > 2 \cdot \frac{3}{4} n_v - n_v$$

$$B_{v+1} > \frac{1}{2} n_v$$

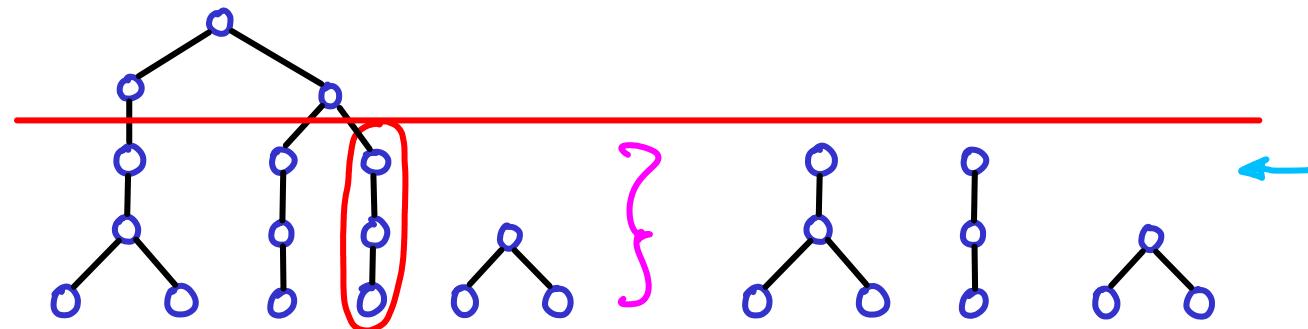


violation $\Rightarrow \frac{n_{v+1}}{n_v} > \frac{3}{4}$

With the quake, #B-nodes goes down by at least B_{v+1}

$$\Delta B \leq -B_{v+1} < -\frac{1}{2} n_v$$

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



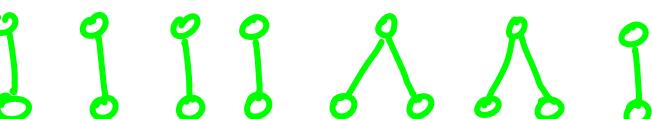
$$\Delta T \leq n_v$$

= # nodes at quake level

$$n_v \geq 2n_{v+1} - B_{v+1}$$

$$B_{v+1} = \# \text{nodes at level } v+1 \text{ with only 1 child} \geq 2n_{v+1} - n_v > 2 \cdot \frac{3}{4} n_v - n_v$$

$$B_{v+1} > \frac{1}{2} n_v$$

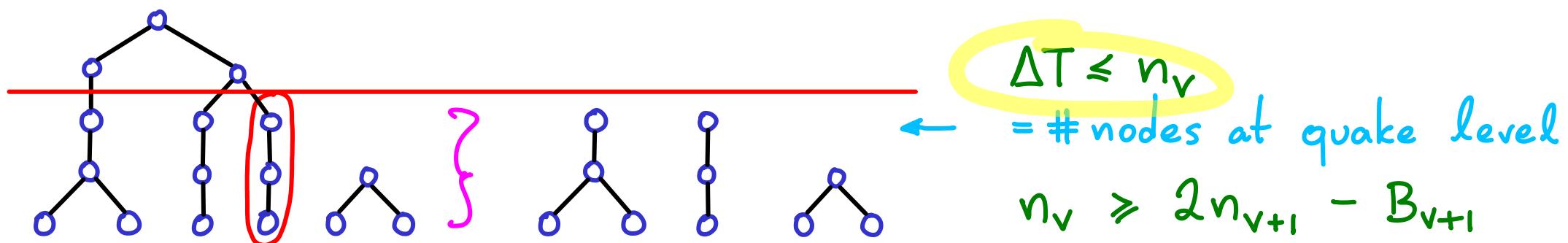


violation $\Rightarrow \frac{n_{v+1}}{n_v} > \frac{3}{4}$

With the quake, #B-nodes goes down by at least B_{v+1}

$$2\Delta B \leq -2B_{v+1} < -\frac{1}{2} n_v$$

QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



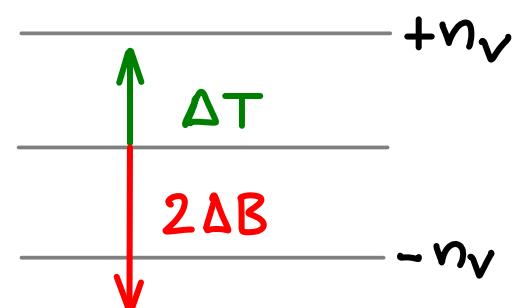
$$B_{v+1} = \# \text{nodes at level } v+1 \text{ with only 1 child} \geq 2n_{v+1} - n_v > 2 \cdot \frac{3}{4} n_v - n_v$$

$$B_{v+1} > \frac{1}{2} n_v$$

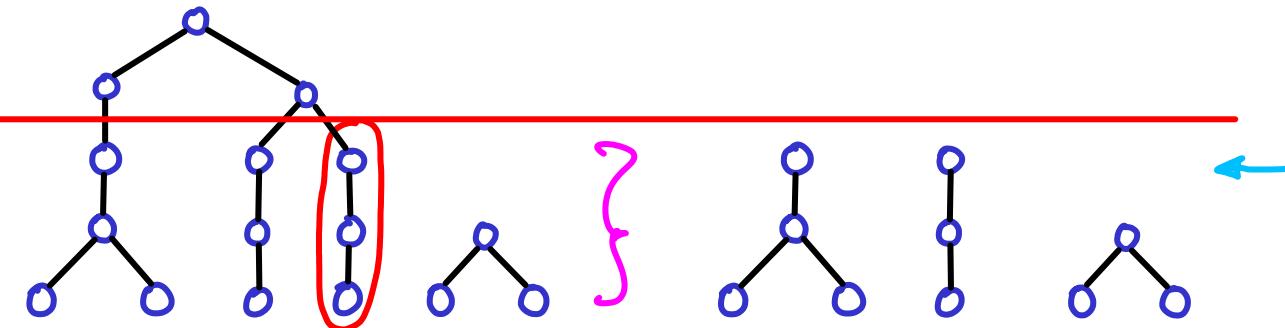
violation $\Rightarrow \frac{n_{v+1}}{n_v} > \frac{3}{4}$

With the quake, #B-nodes goes down by at least B_{v+1}

$$2 \overbrace{\Delta B}^{\Delta B \leq -2B_{v+1}} < -\frac{1}{2} n_v \Rightarrow \underline{\Delta T + 2\Delta B < 0}$$



QUAKE : $\Phi = N + T$ doesn't work: We're stuck with ΔT



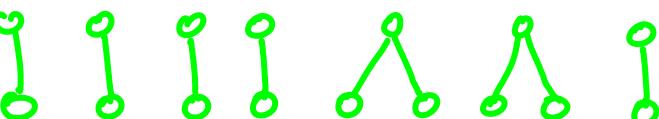
$$\Delta T \leq n_v$$

= # nodes at quake level

$$n_v \geq 2n_{v+1} - B_{v+1}$$

$$B_{v+1} = \# \text{nodes at level } v+1 \text{ with only 1 child} \geq 2n_{v+1} - n_v > 2 \cdot \frac{3}{4} n_v - n_v$$

$$B_{v+1} > \frac{1}{2} n_v$$

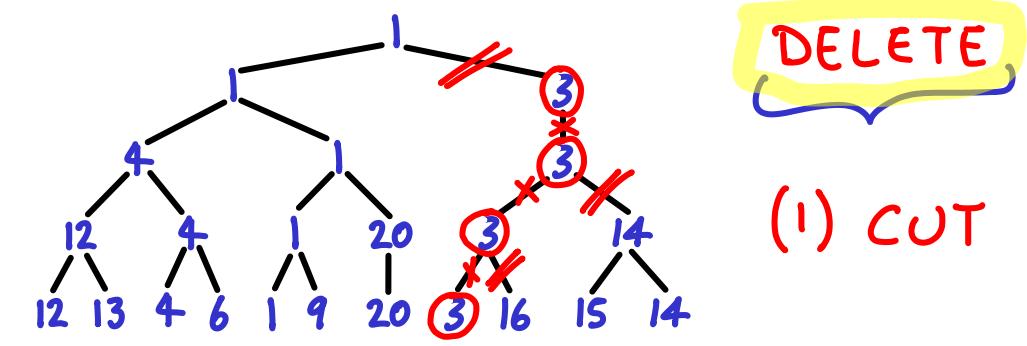


$$\boxed{\text{violation} \Rightarrow \frac{n_{v+1}}{n_v} > \frac{3}{4}}$$

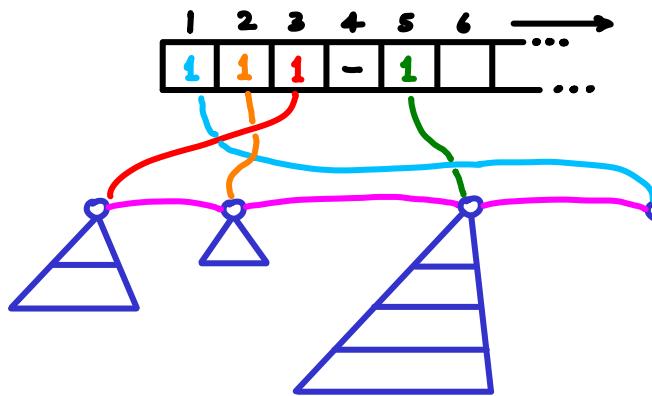
With the quake, #B-nodes goes down by at least B_{v+1}

$$2\Delta B \leq -2B_{v+1} < -\frac{1}{2}n_v \Rightarrow \Delta T + 2\Delta B < 0 \Rightarrow \text{Try } \Phi = N + T + 2B$$

Whatever ΔT is, when it is "expensive" ΔB changes by ~just as much, negatively



(1) CUT



(3) QUAKE

AMORTIZE

$$\Phi = N + c \cdot T + c \cdot 2B$$

$$c = O(\log n)$$

$$\Delta \Phi \leq 0 + O(\log n) + \underline{2c}$$

$$\hat{c} = O(\log n)$$

$$c = O(T_{i-1}) + O(\log n)$$

$$\Delta \Phi \leq T_{i-1} + c(\log n - T_{i-1}) + \underline{0}$$

$$\hat{c} = O(\log n)$$

$$c = \sum_{i=v}^{\text{top}} n_i \quad (\text{actually } O(\Sigma) : \text{easy to handle})$$

$$2\Delta B < -\Delta T$$

$$\Delta \Phi \leq -\sum_{i=0}^v n_i + c \Delta T - c \Delta T$$

REPORT MIN :

C

$$\Delta\phi = \Delta N + \Delta T + 2\Delta B$$

ignore C.
It's just a detail.

INSERT :

O(1)

O(1)

DECREASE KEY :

O(1)

CUT above highest clone

UNION: be lazy :

O(1)

C

$$\Delta\Phi = \Delta N + \Delta T + 2\Delta B$$

REPORT MIN :

O(1)

O

INSERT :

O(1)

DECREASE KEY :

O(1)

CUT above highest clone

UNION: be lazy :

O(1)

C

$$\Delta\Phi = \Delta N + \Delta T + 2\Delta B$$

REPORT MIN :

O(1)

O

INSERT :

O(1)

+1 +1 +0

DECREASE KEY :

O(1)

CUT above highest clone

UNION: be lazy :

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C

$$\Delta\Phi = \Delta N + \Delta T + 2\Delta B$$

REPORT MIN :

O(1)

O

INSERT :

O(1)

+1 +1 +0

DECREASE KEY :

O(1)

O +1 +2

CUT above highest clone

UNION: be lazy :

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$$\Delta\Phi = \Delta N + \Delta T + 2\Delta B$$

REPORT MIN :

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+1 +1 +0

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O(1)

O



C

$$\Delta\Phi = \Delta N + \Delta T + 2\Delta B$$

REPORT MIN:

O(1)

O

INSERT:

O(1)

+1 +1 +0

DECREASE KEY:

O(1)

O +1 +2

CUT above highest clone

UNION: be lazy:

O(1)

O

No longer have one list of n_i

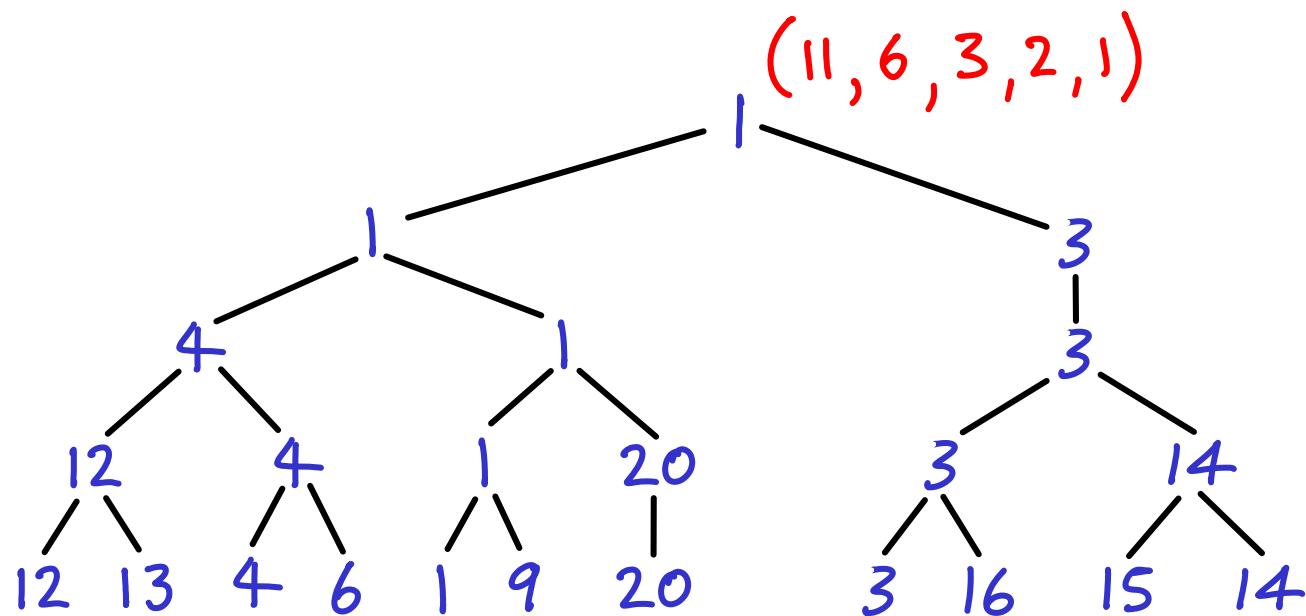
□?

Having multiple lists of level counts is a problem.
It can slow down detection of alpha-violations.

Next we show one way of merging all the lists during DELETE.
(This is not in Chan's paper)

Suppose we have one tournament tree, X.

At the root we store a linked list of n_i

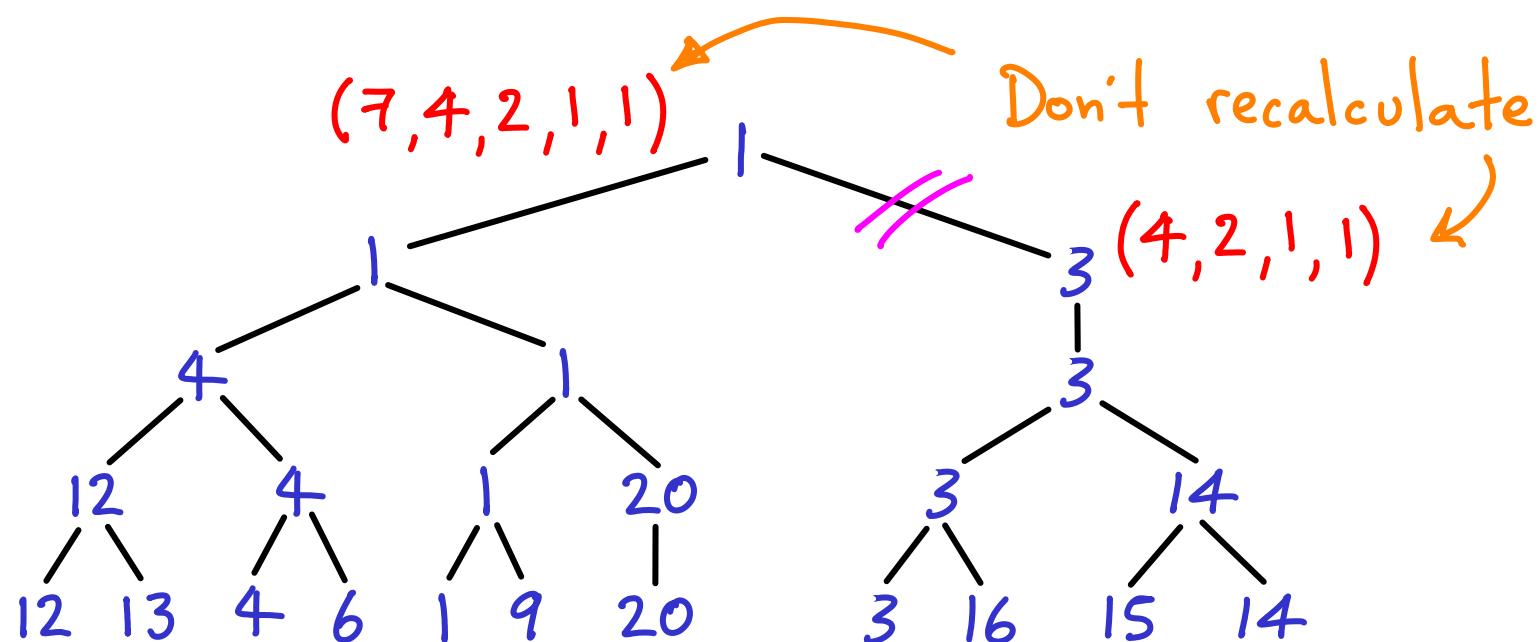


Suppose we have one tournament tree, X.

At the root we store a linked list of n_i

If we CUT anywhere, let X keep its list,

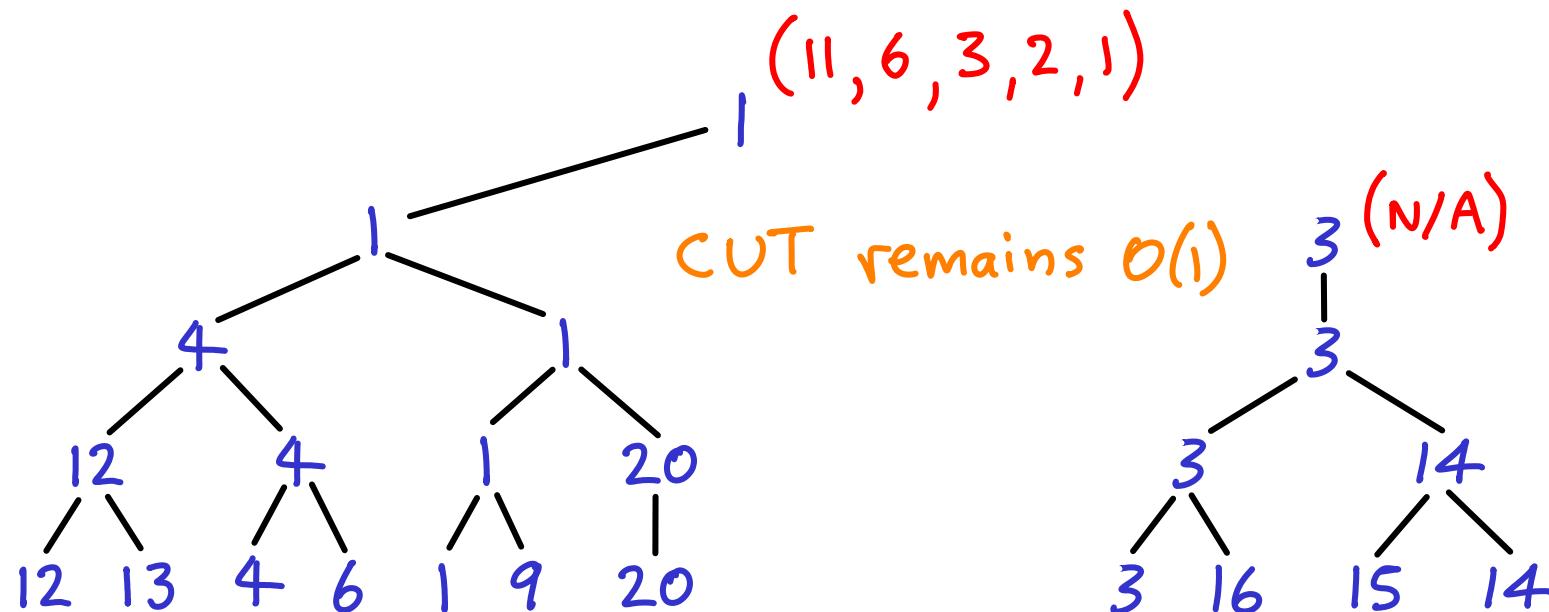
to keep representing the cut subtree.



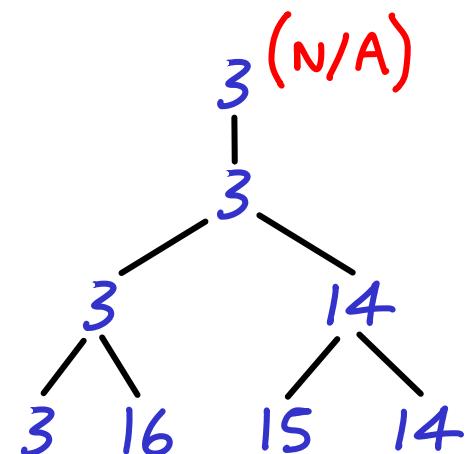
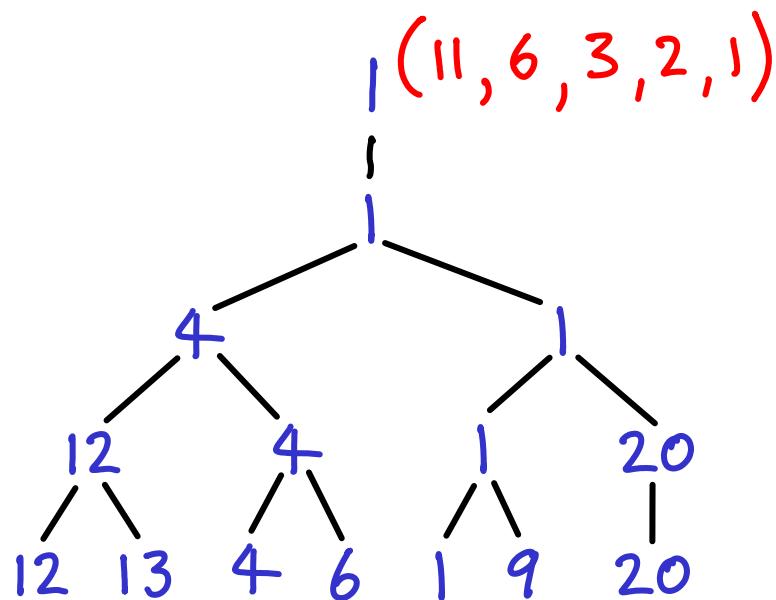
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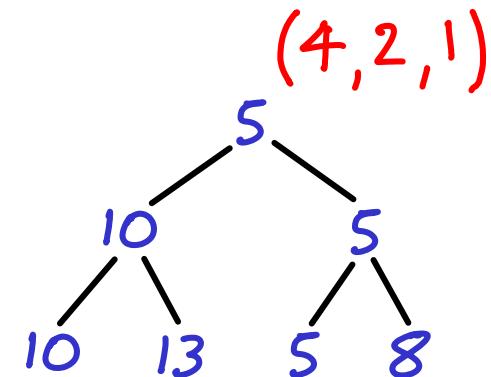
If we CUT anywhere, let X keep its list,
to keep representing the cut subtree.



So by cutting or by UNION (or INSERT) we could have multiple lists.

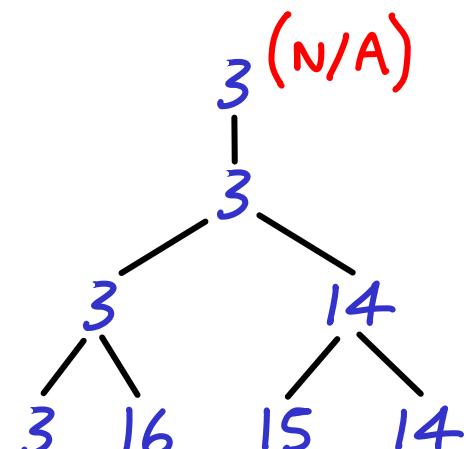
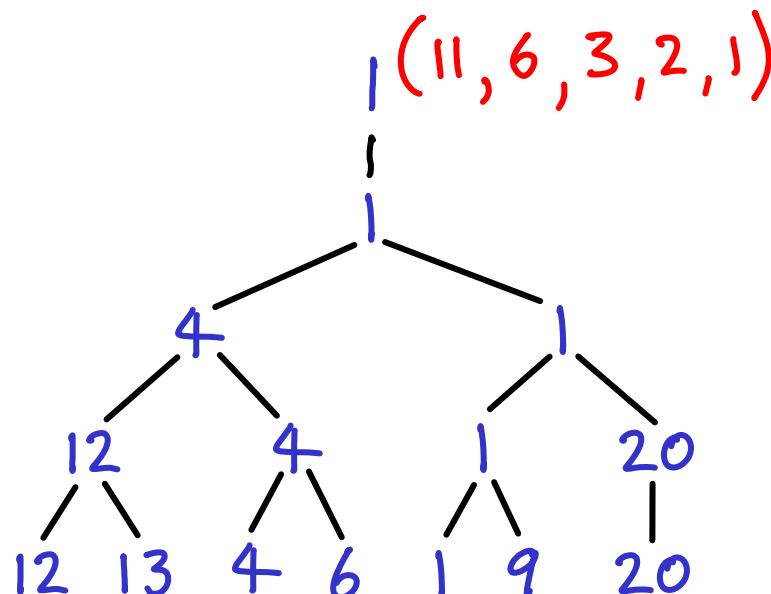


UNION

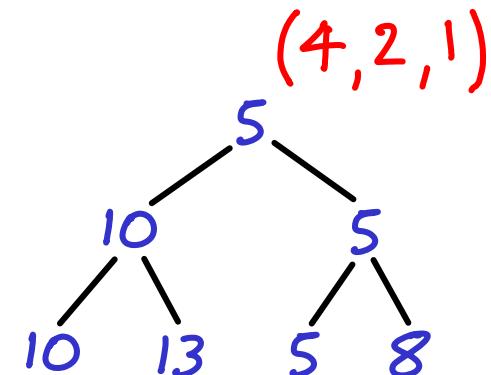


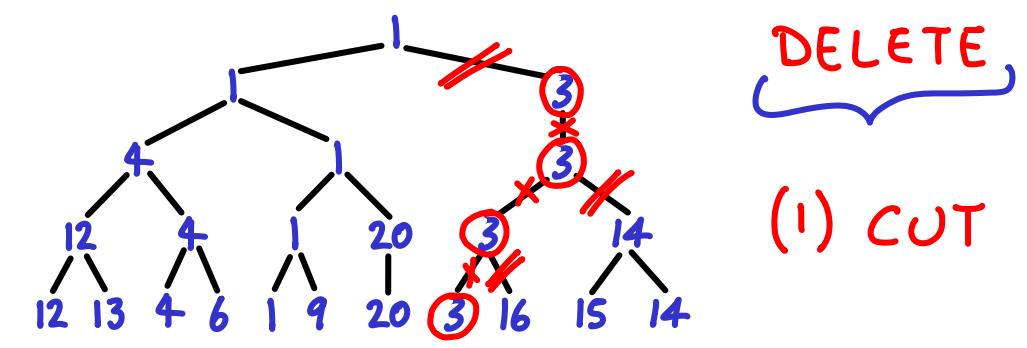
So by cutting or by UNION (or INSERT) we could have multiple lists.

We only care when we need to check for α -violation: DELETE



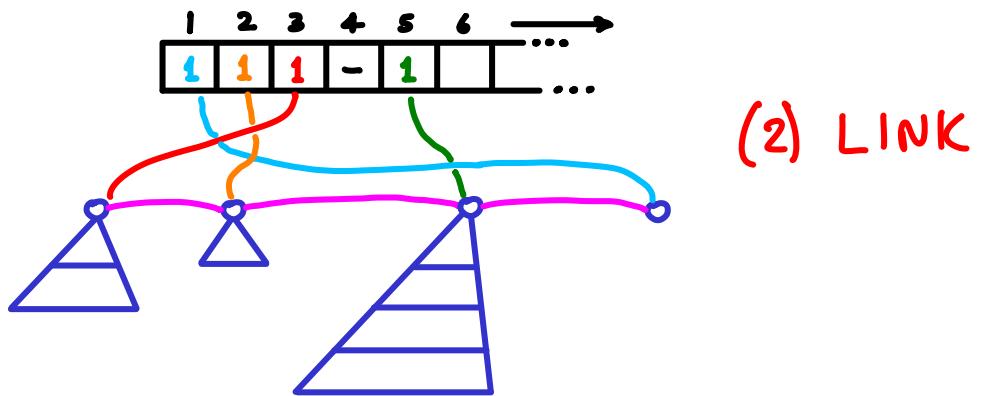
UNION



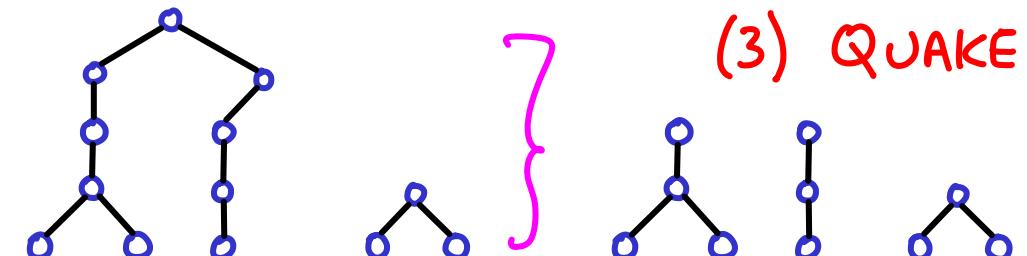


DELETE

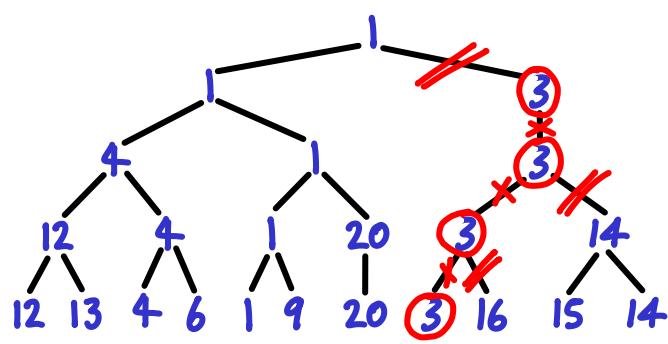
(1) CUT



(2) LINK

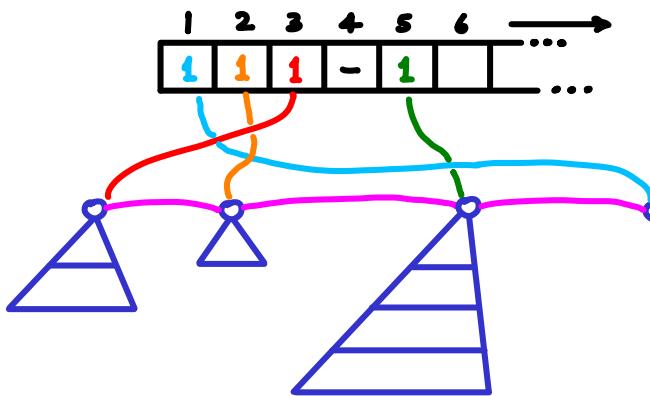


(3) QUAKE

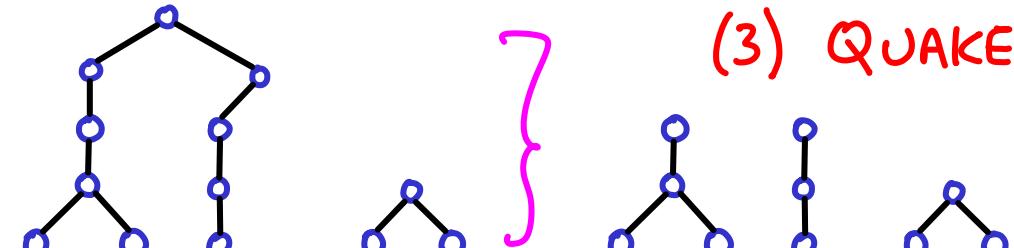


DELETE
(1) CUT

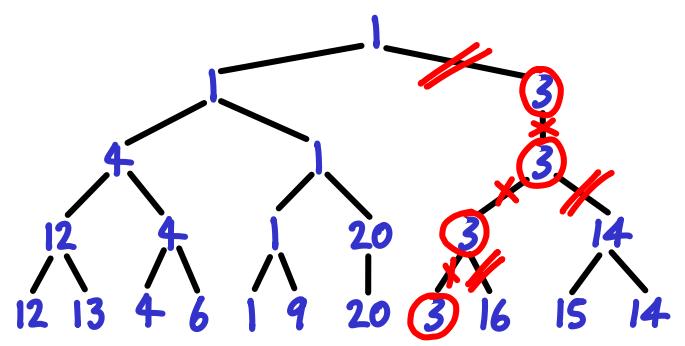
} Keep track of how many levels lost
one node. (store one level number)
No effect on time. Still $O(\log n)$



(2) LINK

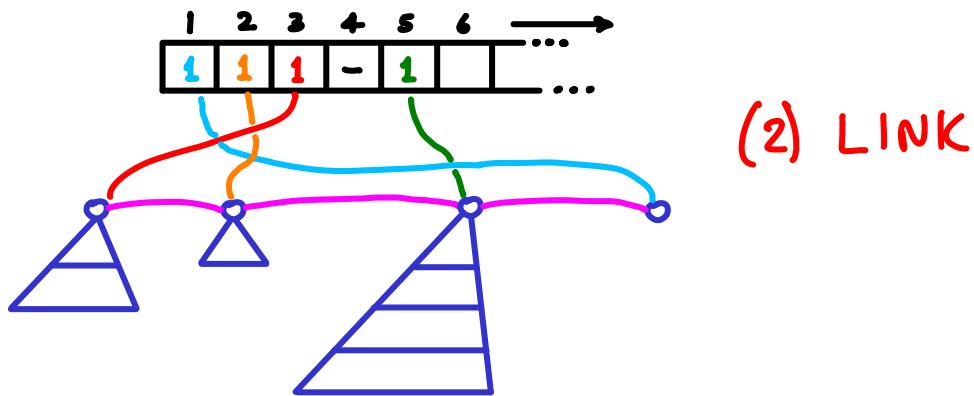


(3) QUAKE

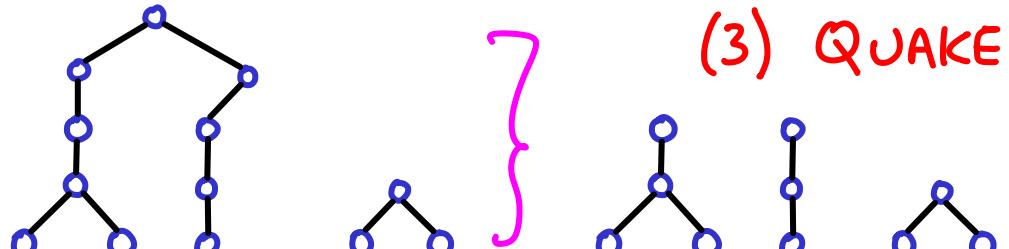


DELETE
(1) CUT

Keep track of how many levels lost one node. (store one level number)
 No effect on time. Still $O(\log n)$

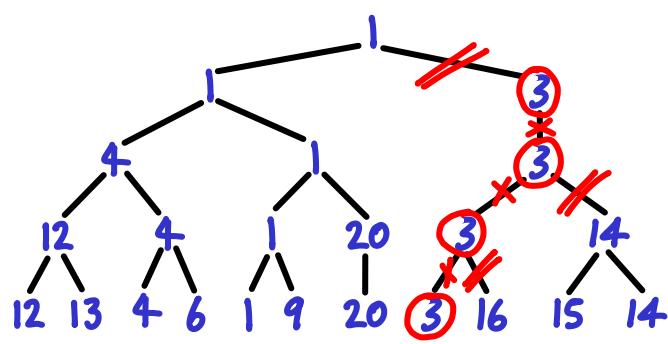


(2) LINK



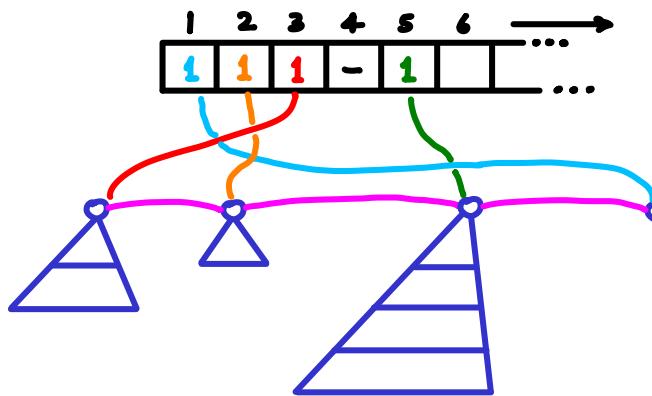
(3) QUAKE

As before
 (Delete parts of lists corresponding to Quaked levels: cheap)



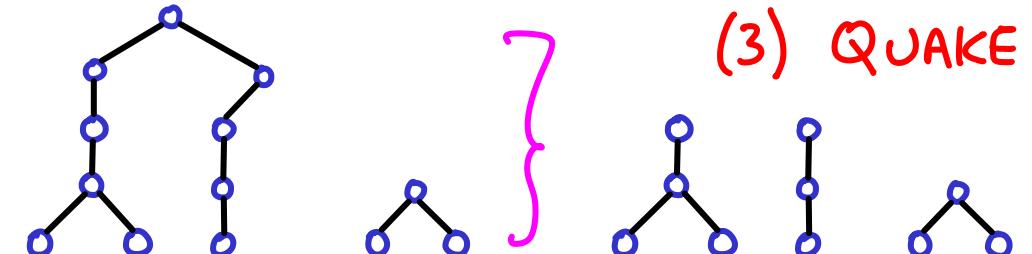
DELETE
(1) CUT

} Keep track of how many levels lost
one node. (store one level number)
No effect on time. Still $O(\log n)$



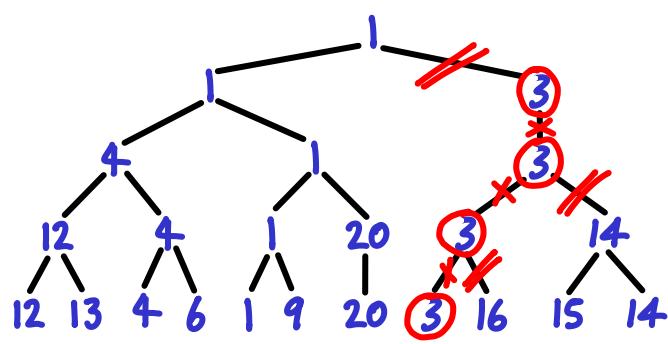
(2) LINK

} For every LINK, merge lists
if applicable.



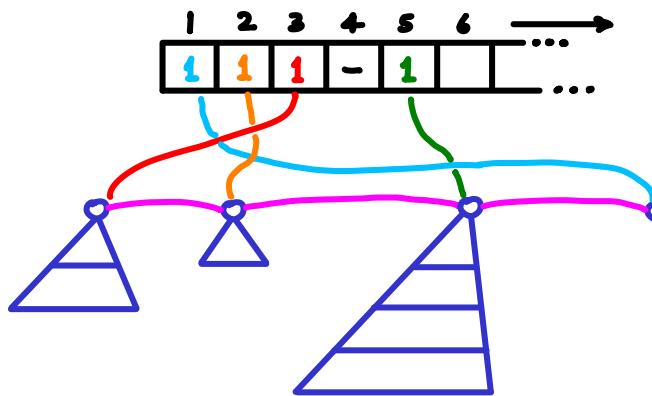
(3) QUAKE

} As before



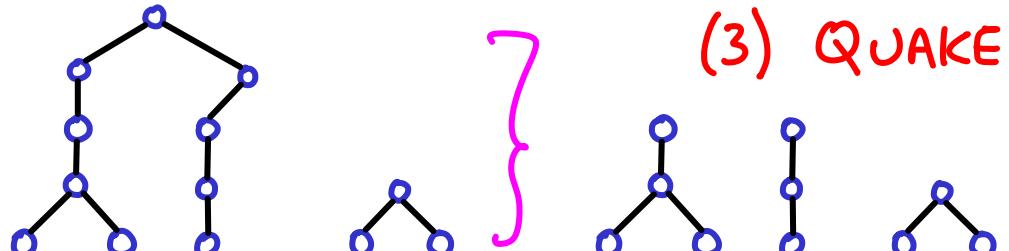
DELETE
(1) CUT

} Keep track of how many levels lost one node. (store one level number)
 No effect on time. Still $O(\log n)$



(2) LINK

} For every LINK, merge lists if applicable.
 Then merge $O(\log n)$ remaining lists.

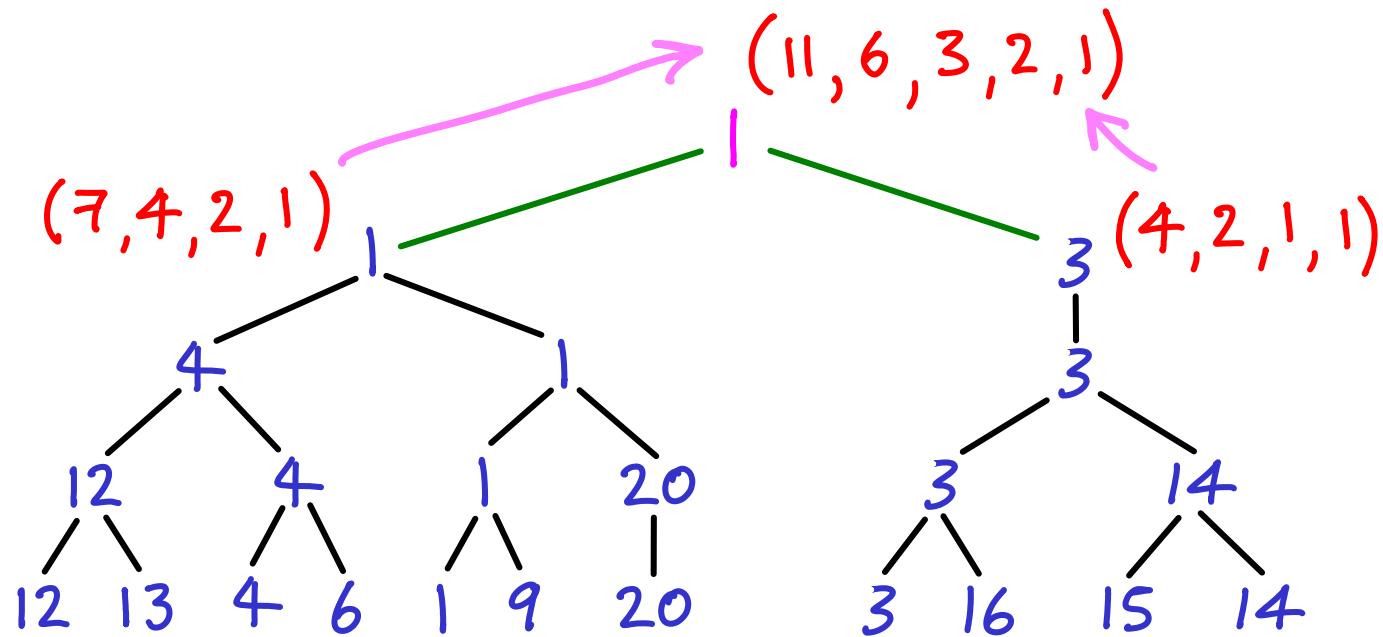


(3) QUAKE

} As before

LINK cost \sim height of new node.

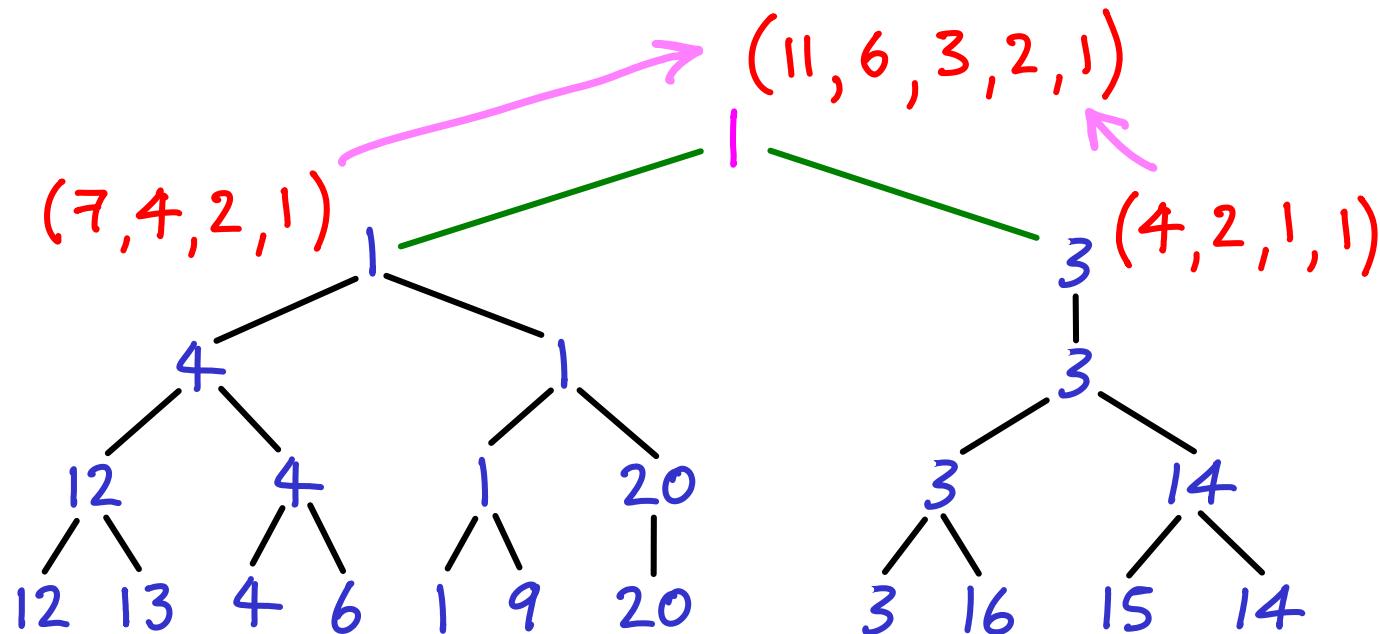
LINK \longleftrightarrow create new node



LINK cost \sim height of new node.

LINK \longleftrightarrow create new node

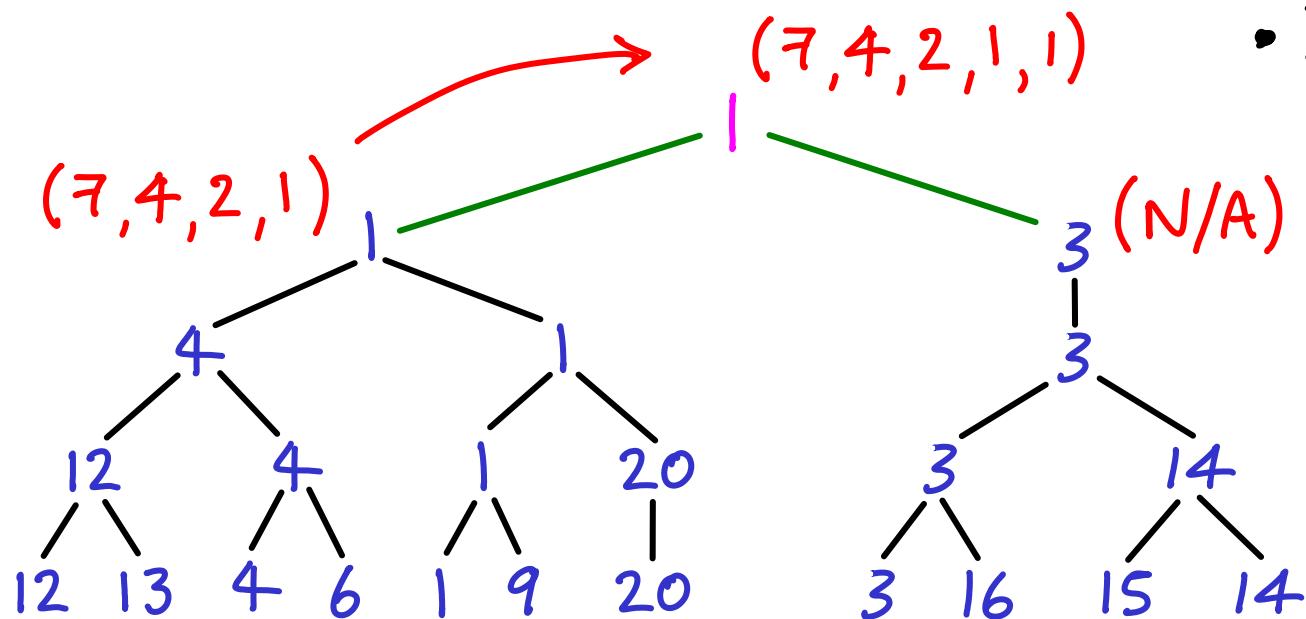
↳ Total cost of all LINK operations = $\sum_{\text{all } x} \text{height}(x)$ = $O(n)$
like binary heap build



LINK cost \sim height of new node.

LINK \longleftrightarrow create new node

↳ Total cost of all LINK operations = $\sum_{\text{all } x} \text{height}(x) = O(n)$
like binary heap build

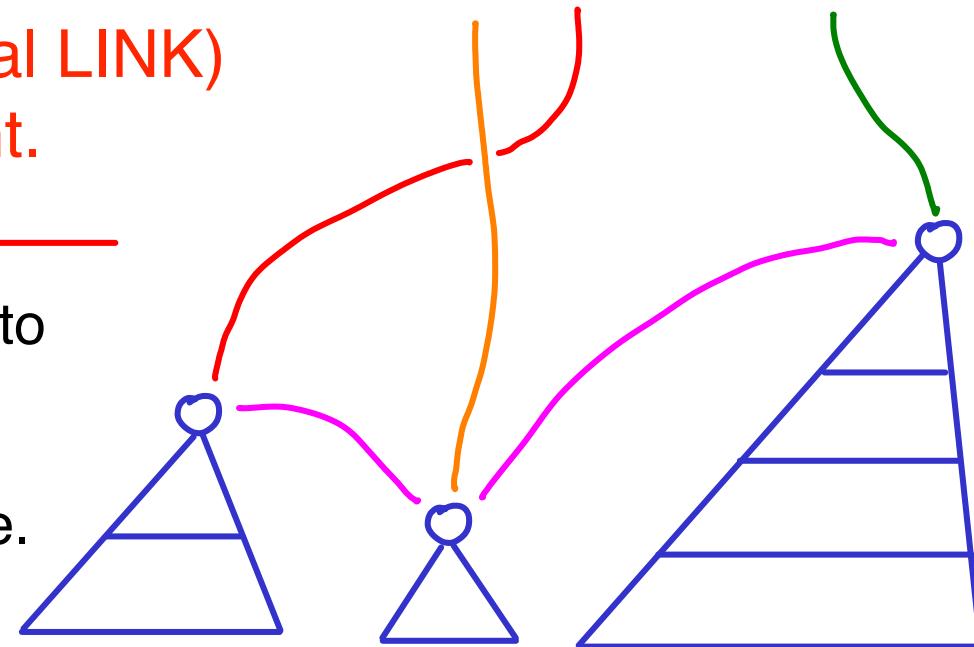


- In fact if one tree has no list then no merge, just append 1.
- If neither has a list, +1 in a temp array for the new root.

When we are left with < log trees,
merge their lists as well,
from smallest to largest. (No actual LINK)
Each root can still pay for its height.

At the end of DELETE, we still have up to
log trees, but now all but one of them
will have “N/A” as a count list, so in the
future they will not contribute to a merge.

1	2	3	4	5	6	...
	1	1	-	1		...



The result is that we now have one count list.

We maintain the invariant:
over all operations of a Quake heap, every node pays for its height, at most.

Summary of merging the count lists during DELETE:

In step 1 of DELETE: Record level, L, of topmost deleted node.

In step 2: Merge count lists during LINK. Also store certain increments in an array of size $\log n$, for new nodes that were generated without actual merging of lists.

In step 3: Delete parts of lists in Quaked levels.

This could affect L: it could be updated (reduced) to the highest surviving level.

Finally merge lists of trees with distinct heights, to get one list.

Then merge this with the array of step 2, and decrement every count L and all levels below.

Can vary α and implement in other ways }
(see paper) project ?

Exercise: Analyze Quake heap with accounting method.