

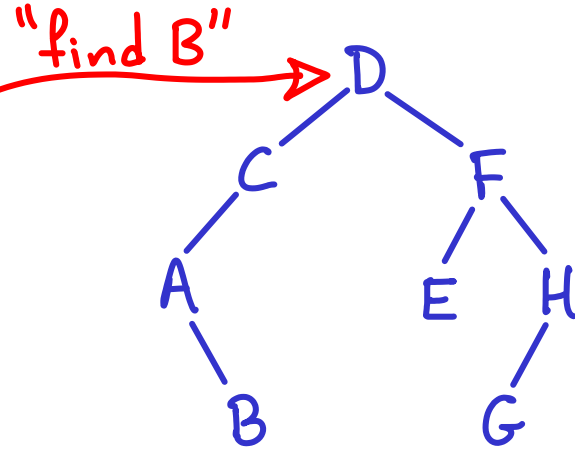
# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS) AND BST OPTIMALITY

# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

Model:

- every operation starts at the root

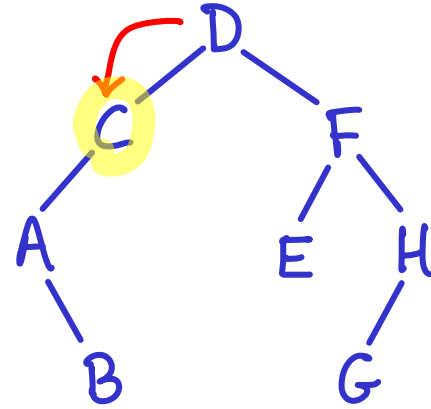


# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

Model:

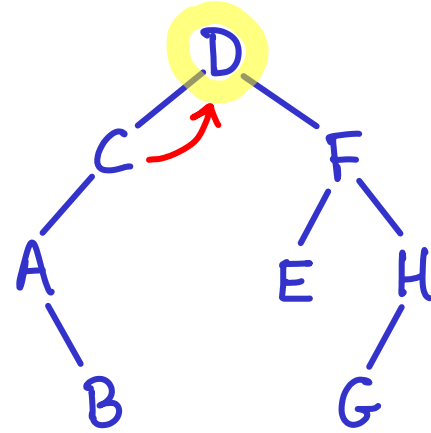
- every operation starts at the root
- at each step we may move between parent  $\leftrightarrow$  children



# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS) AND BST OPTIMALITY

Model:

- every operation starts at the root
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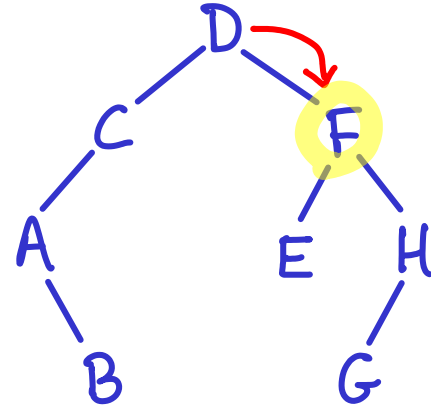


# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

Model:

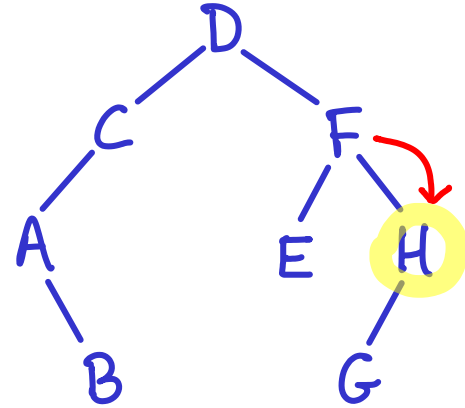
- every operation starts at the root
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Model:

- every operation starts at the root
- at each step we may move between parent  $\leftrightarrow$  children

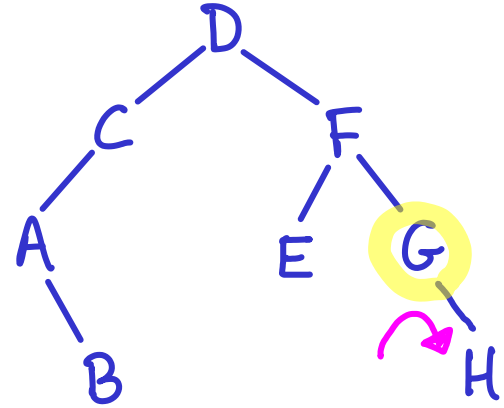


# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

Model:

- every operation starts at the root
- at each step we may
  - move between parent  $\leftrightarrow$  children
  - perform a rotation at current position

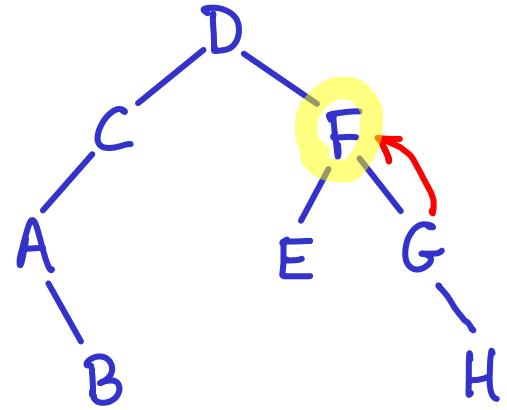


# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

Model:

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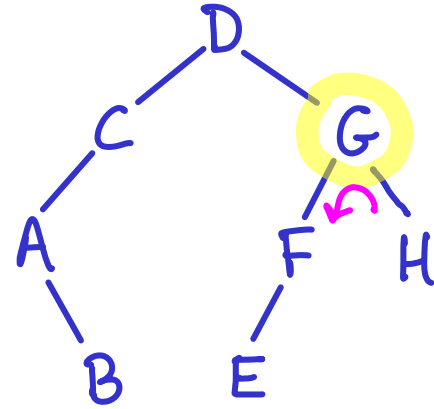


# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

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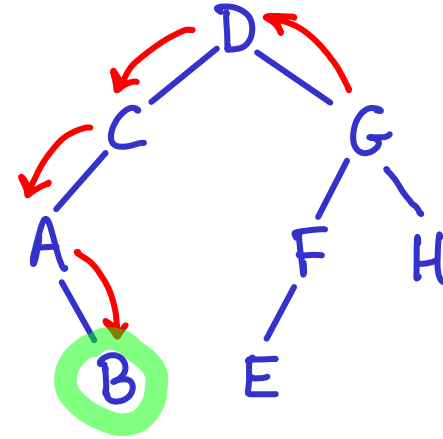


# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

Model:

- every operation starts at the root
- at each step we may
  - move between parent  $\leftrightarrow$  children
  - perform a rotation at current position
- at some point during operation we must access (find/insert/delete) given target

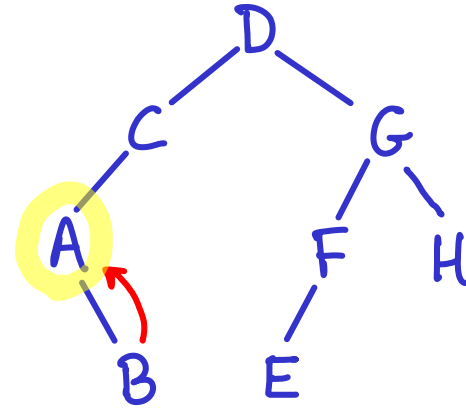


# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

Model:

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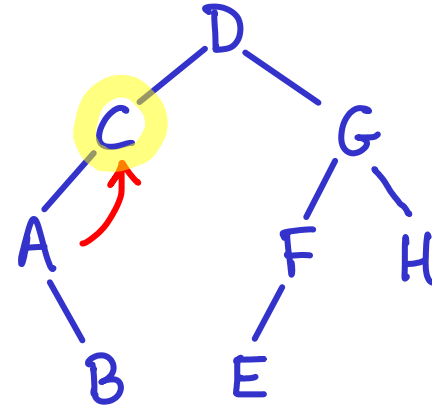


# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

Model:

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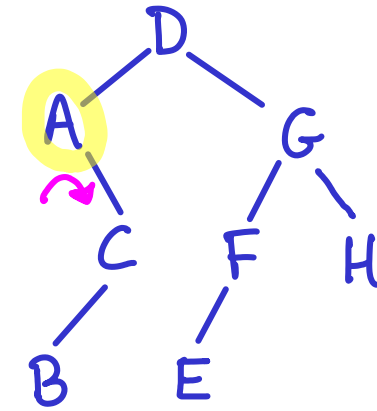


# GEOMETRY OF BINARY SEARCH TREES (& ALGORITHMS)

## AND BST OPTIMALITY

Model:

- every operation starts at the root
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  - move between parent  $\leftrightarrow$  children
  - perform a rotation at current position
- at some point during operation we must access (find/insert/delete) given target



Finished  
operation

Task: sequence of operations on  $n$  keys (one at a time)

$t_1$ : insert(3)

$t_2$ : insert(5)

$t_3$ : insert(1)

$t_4$ : insert( $n$ )

$t_5$ : insert(4)

$t_6$ : search(5)

$t_7$ : delete(5)

Task: sequence of operations on  $n$  keys (one at a time)

$t_1$ : insert(3)

$t_2$ : insert(5)

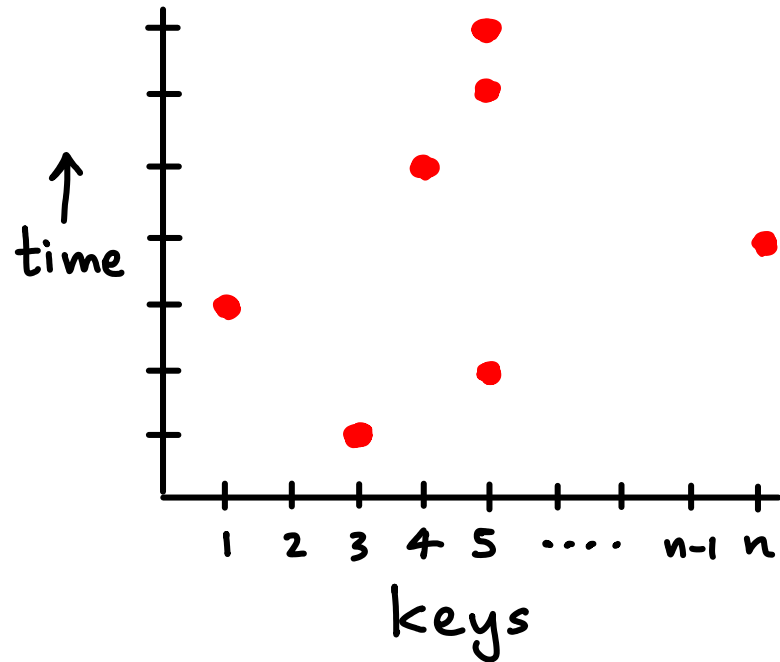
$t_3$ : insert(1)

$t_4$ : insert( $n$ )

$t_5$ : insert(4)

$t_6$ : search(5)

$t_7$ : delete(5)



Task: sequence of operations on  $n$  keys (one at a time)

$t_1$ : insert(3) ●

$t_2$ : insert(5)

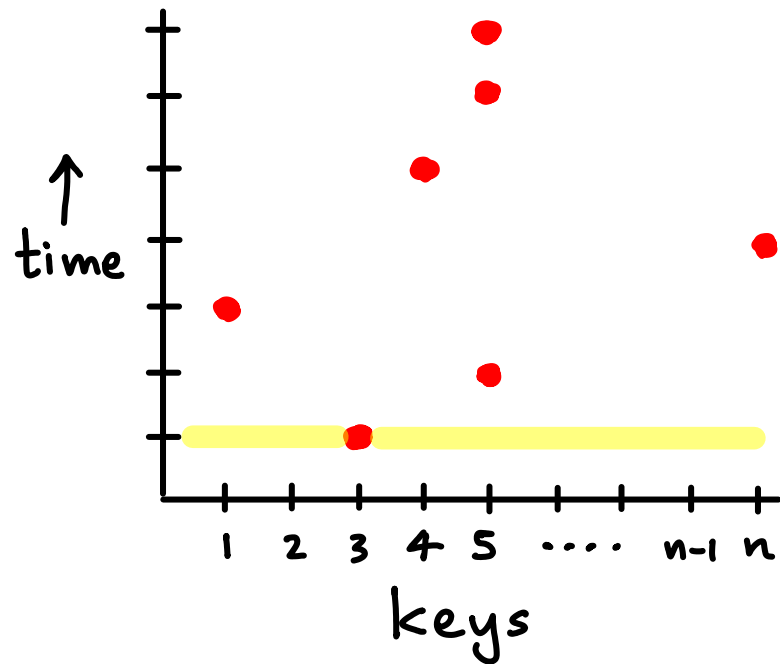
$t_3$ : insert(1)

$t_4$ : insert( $n$ )

$t_5$ : insert(4)

$t_6$ : search(5)

$t_7$ : delete(5)





Task: sequence of operations on  $n$  keys (one at a time)

$t_1$ : insert(3)

$t_2$ : insert(5)

$t_3$ : insert(1)

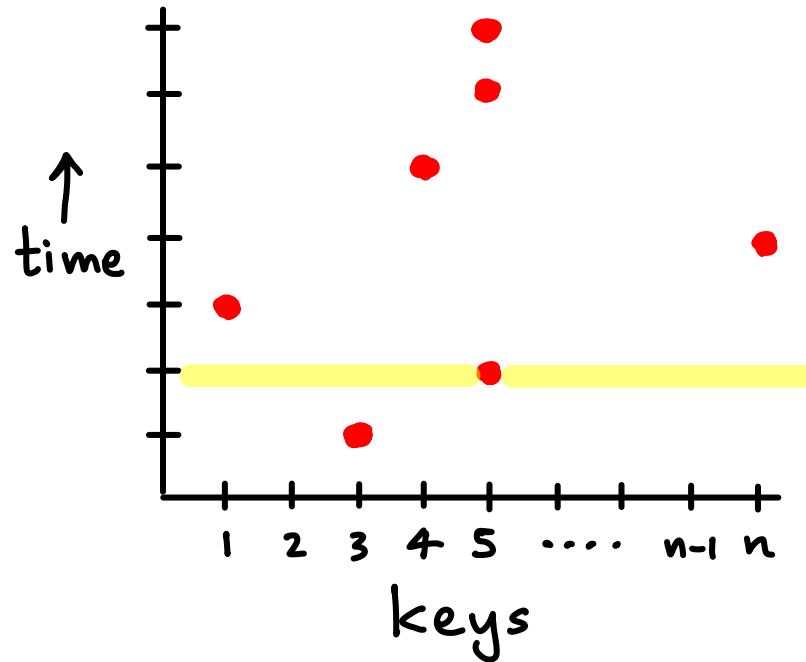
$t_4$ : insert( $n$ )

$t_5$ : insert(4)

$t_6$ : search(5)

$t_7$ : delete(5)

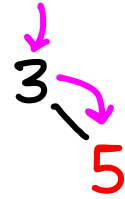
3



Task: sequence of operations on  $n$  keys (one at a time)

$t_1$ : insert(3)

$t_2$ : insert(5) ● Must access 3 first



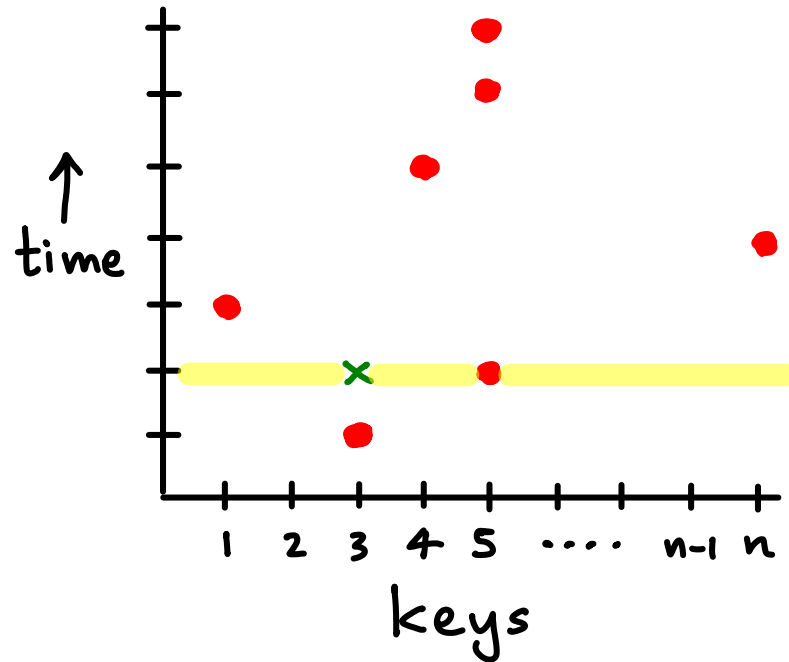
$t_3$ : insert(1)

$t_4$ : insert( $n$ )

$t_5$ : insert(4)

$t_6$ : search(5)

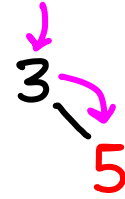
$t_7$ : delete(5)



Task: sequence of operations on  $n$  keys (one at a time)

$t_1$ : insert(3)

$t_2$ : insert(5) ● Must access 3 first



3-5 could rotate

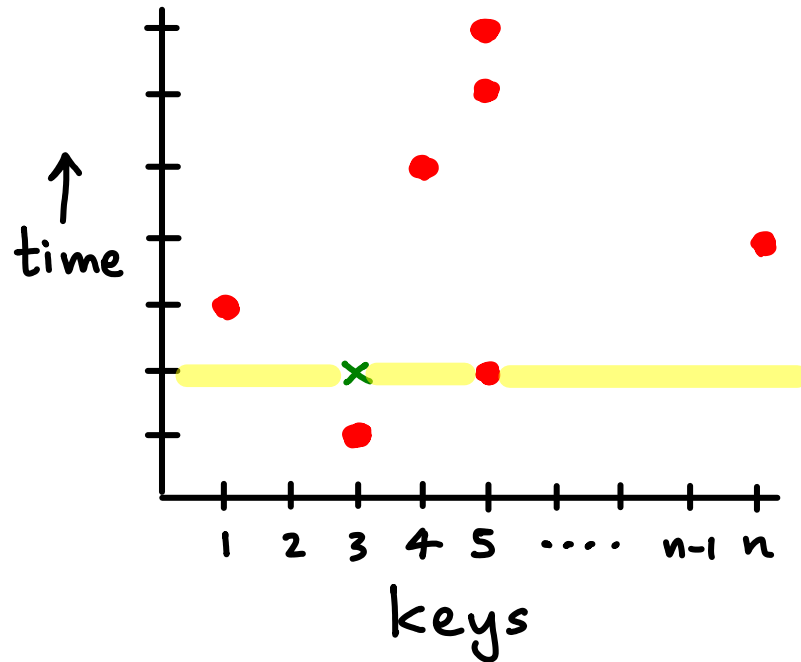
$t_3$ : insert(1)

$t_4$ : insert( $n$ )

$t_5$ : insert(4)

$t_6$ : search(5)

$t_7$ : delete(5)



Task: sequence of operations on  $n$  keys (one at a time)

$t_1$ : insert(3)

$t_2$ : insert(5) Must access 3 first

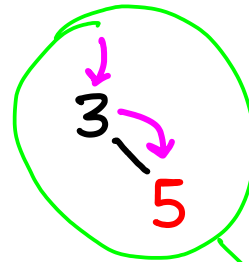
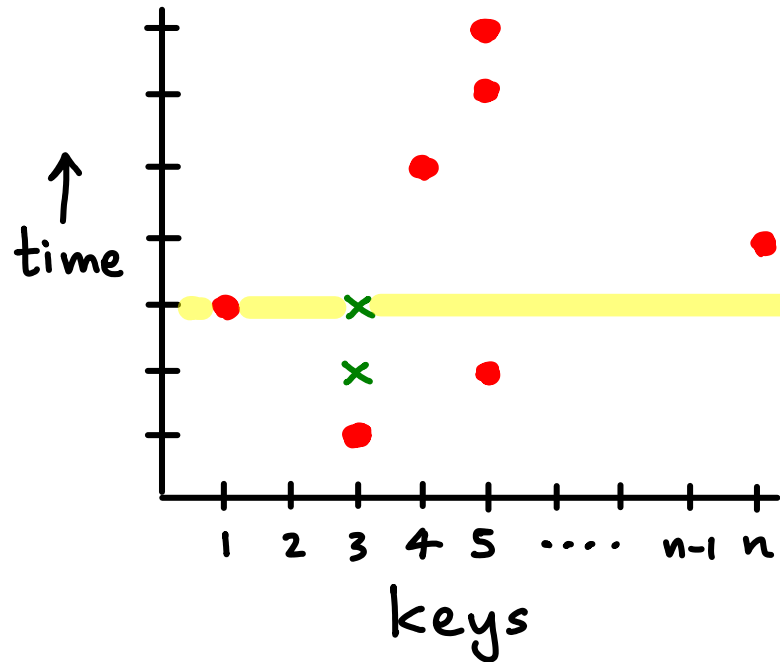
$t_3$ : insert(1) Must access 3 first

$t_4$ : insert( $n$ )

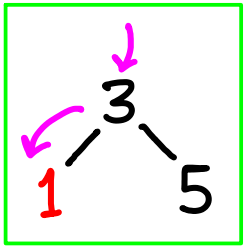
$t_5$ : insert(4)

$t_6$ : search(5)

$t_7$ : delete(5)



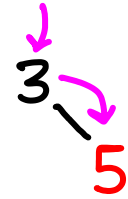
3-5 could rotate



Task: sequence of operations on  $n$  keys (one at a time)

$t_1$ : insert(3)

$t_2$ : insert(5) Must access 3 first



$3-5$  could rotate

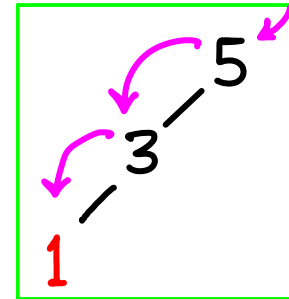
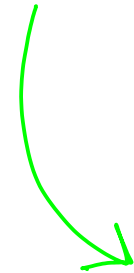
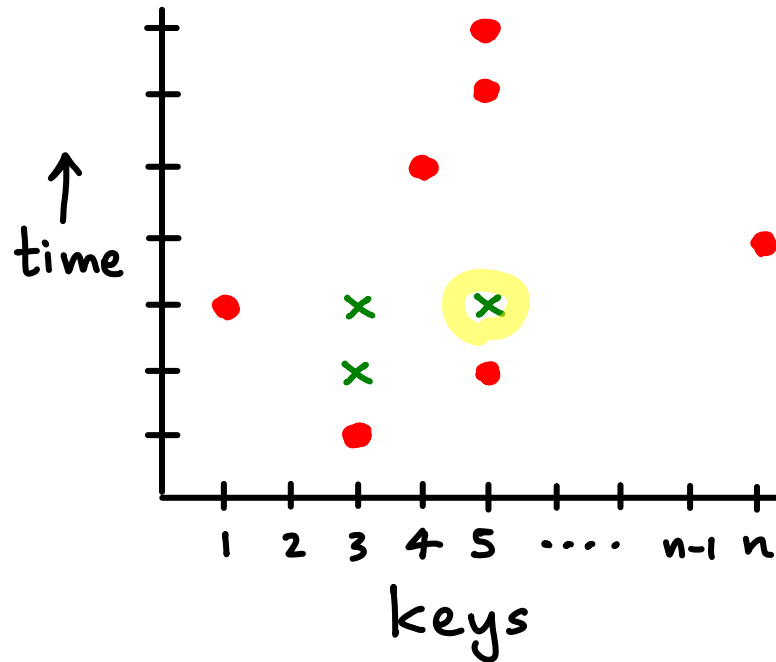
$t_3$ : insert(1) Must access 3 or 5 first (actually, if 5 then also 3)

$t_4$ : insert( $n$ )

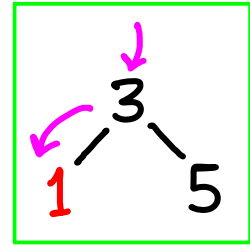
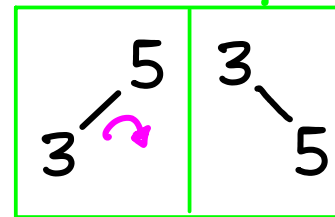
$t_5$ : insert(4)

$t_6$ : search(5)

$t_7$ : delete(5)



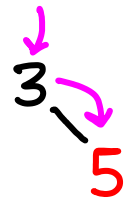
or



Task: sequence of operations on  $n$  keys (one at a time)

$t_1$ : insert(3)

$t_2$ : insert(5)      Must access 3 first



$3-5$  could rotate

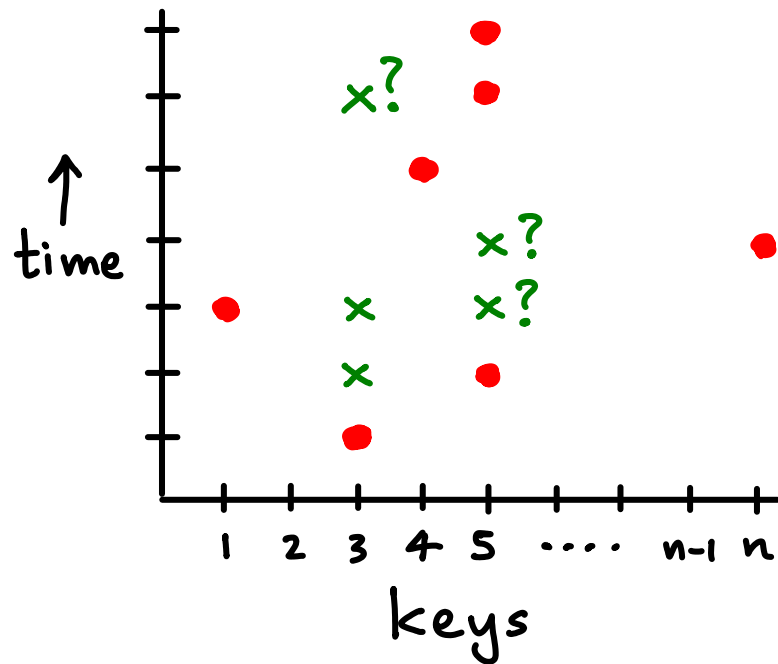
$t_3$ : insert(1)      Must access 3 or 5 first (actually, if 5 then also 3)

$t_4$ : insert( $n$ )

$t_5$ : insert(4)

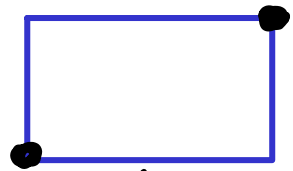
$t_6$ : search(5)

$t_7$ : delete(5)



Besides the required ops there are other keys that we may need to go through

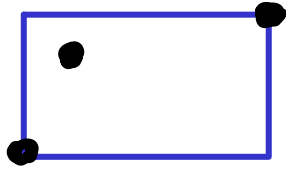
Theorem: the set of key accesses (over all ops) corresponds to a diagram where no two points form opposite corners of a closed rectangular region that is empty of other points



not OK



OK

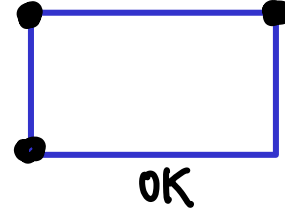
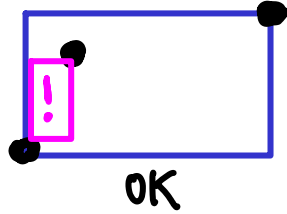
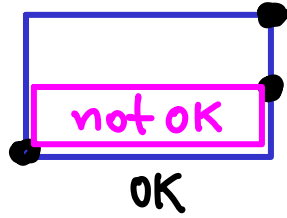
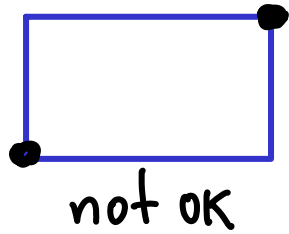


OK



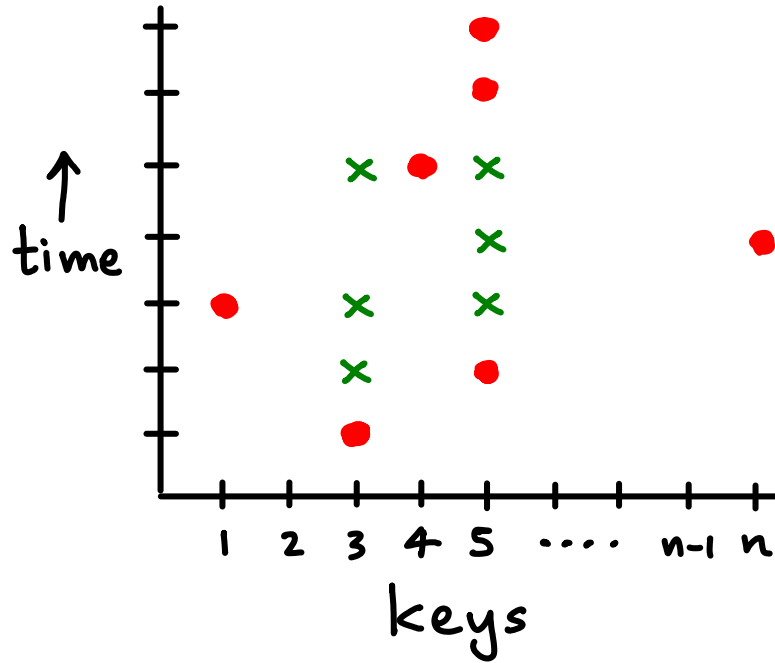
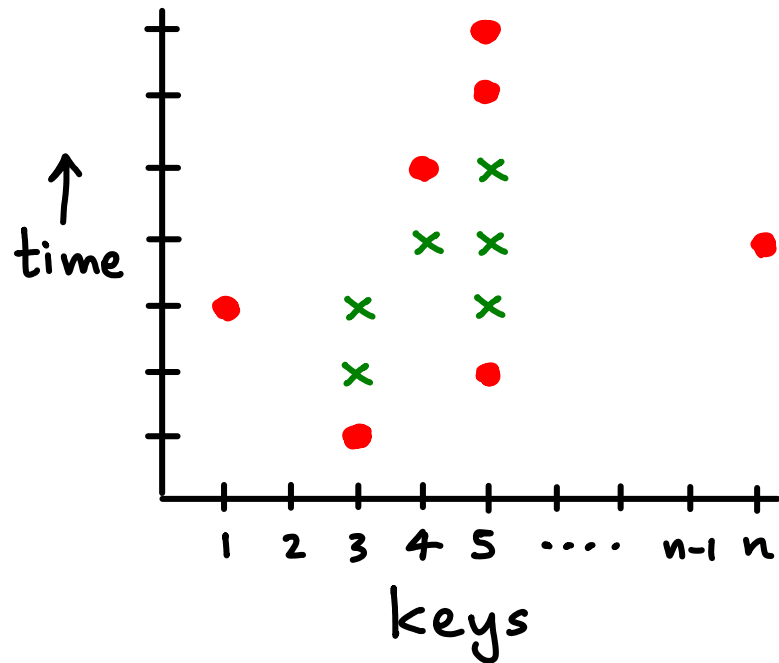
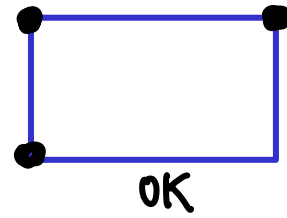
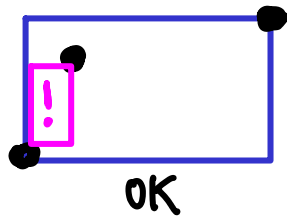
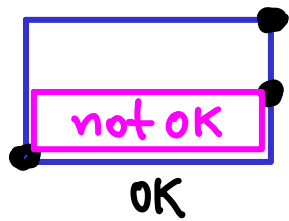
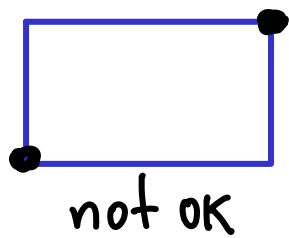
OK

Theorem: the set of key accesses (over all ops) corresponds to a diagram where no two points form opposite corners of a closed rectangular region that is empty of other points

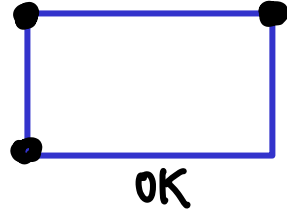
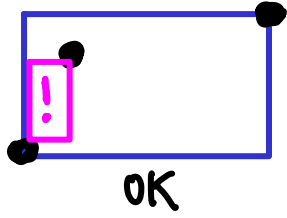
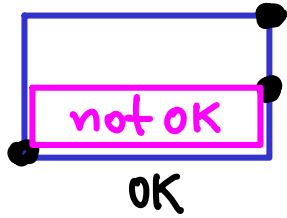
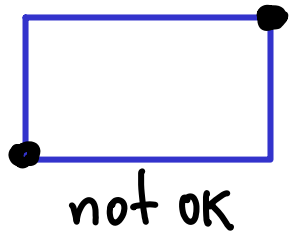




Theorem: the set of key accesses (over all ops) corresponds to a diagram where no two points form opposite corners of a closed rectangular region that is empty of other points



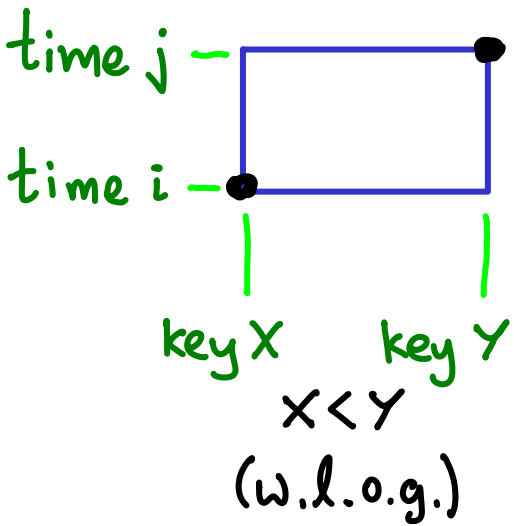
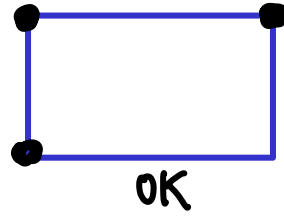
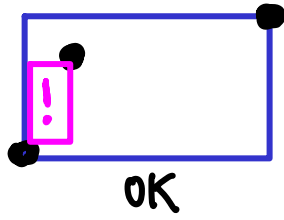
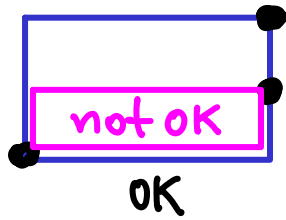
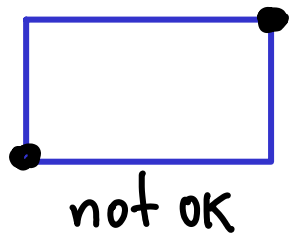
Theorem: the set of key accesses (over all ops) corresponds to a diagram where no two points form opposite corners of a closed rectangular region that is empty of other points



PROOF

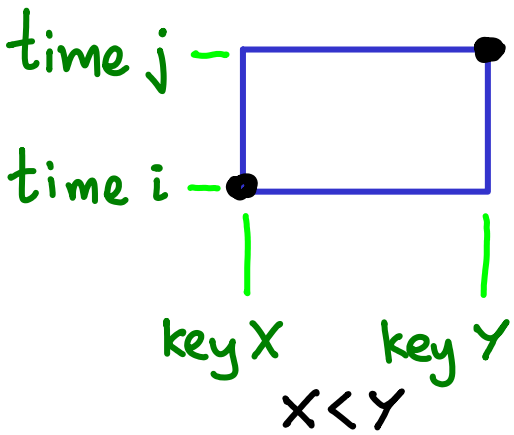
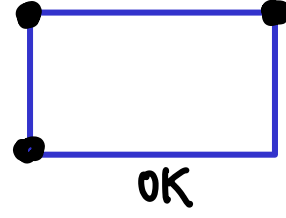
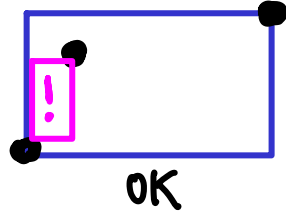
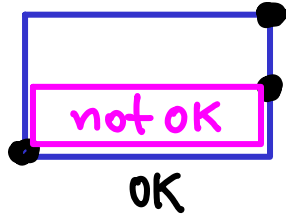
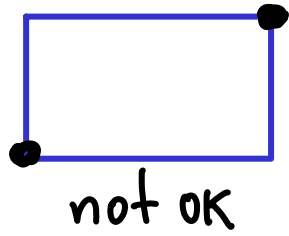
(suppose all ops = search)

Theorem: the set of key accesses (over all ops) corresponds to a diagram where no two points form opposite corners of a closed rectangular region that is empty of other points



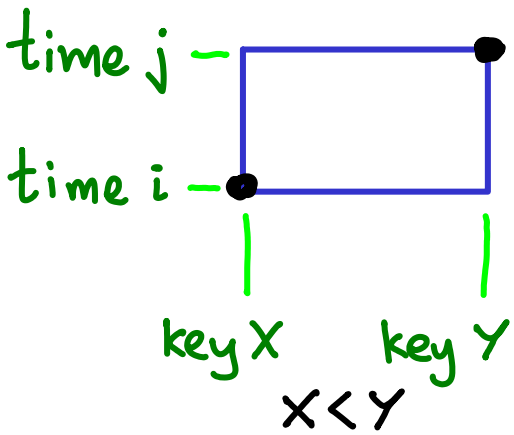
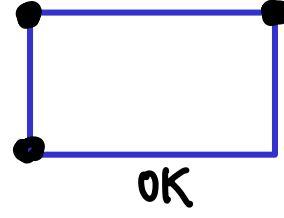
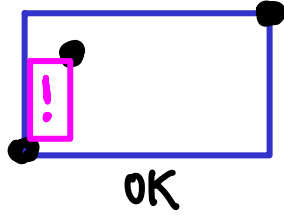
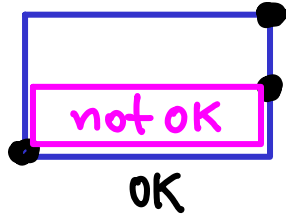
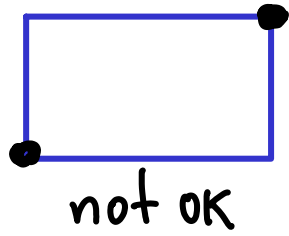
can this happen?

Theorem: the set of key accesses (over all ops) corresponds to a diagram where no two points form opposite corners of a closed rectangular region that is empty of other points



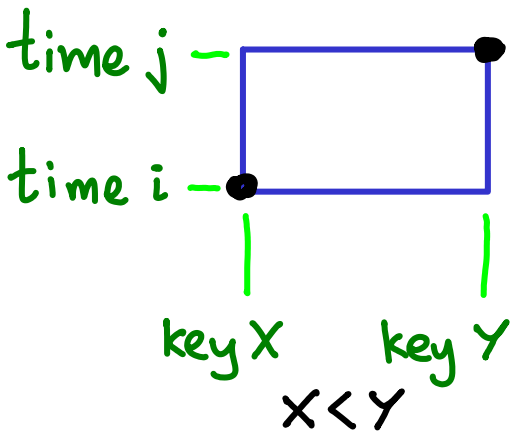
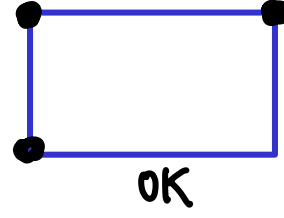
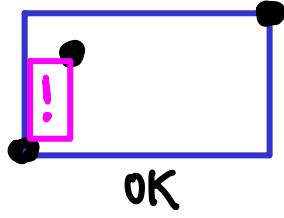
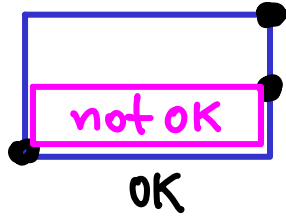
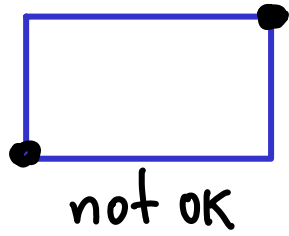
$LCA_i(x, y) = \text{lowest common ancestor at time } i$

Theorem: the set of key accesses (over all ops) corresponds to a diagram where no two points form opposite corners of a closed rectangular region that is empty of other points



$LCA_i(x, y)$  = lowest common ancestor at time  $i$   
 if  $LCA_i(x, y) \neq x$  then ?

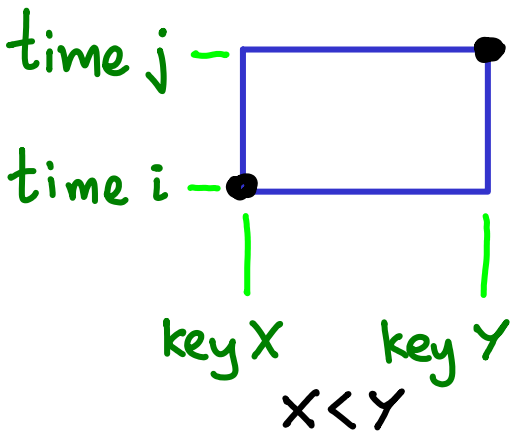
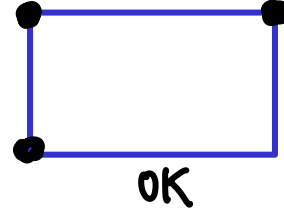
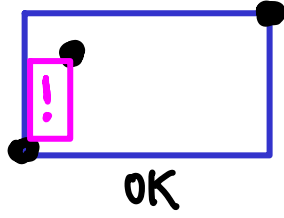
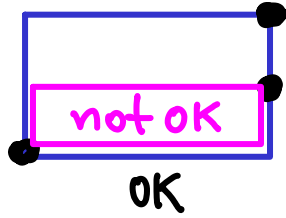
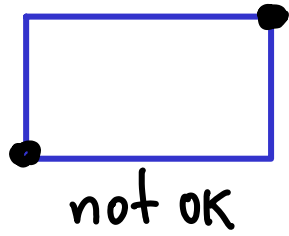
Theorem: the set of key accesses (over all ops) corresponds to a diagram where no two points form opposite corners of a closed rectangular region that is empty of other points



$LCA_i(x, y)$  = lowest common ancestor at time  $i$   
 if  $LCA_i(x, y) \neq x$  then: at time  $i$ , to access  $x$ ...

?

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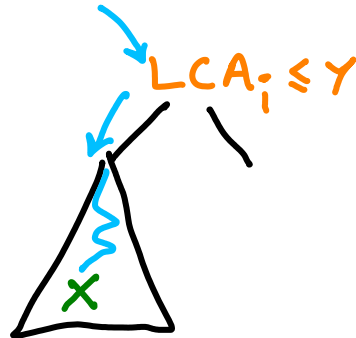


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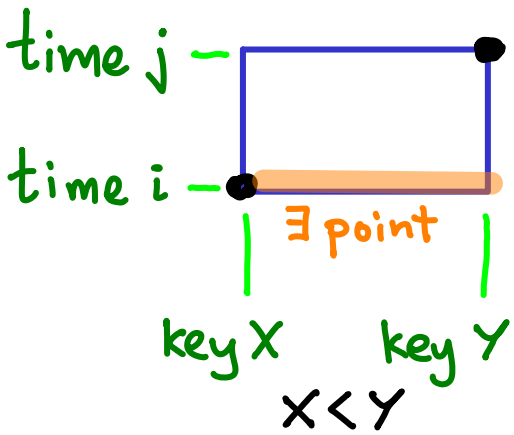
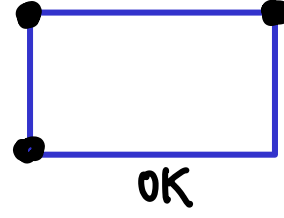
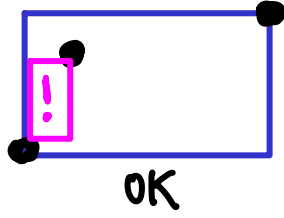
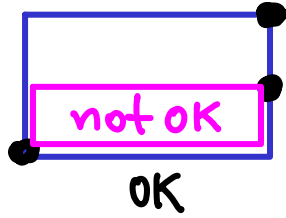
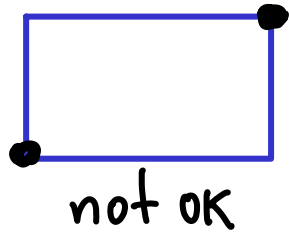
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So? ←



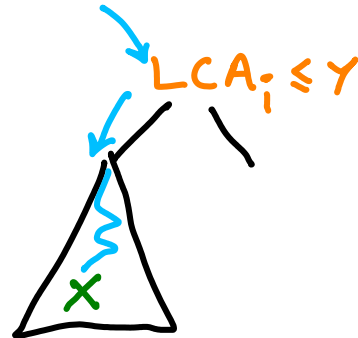
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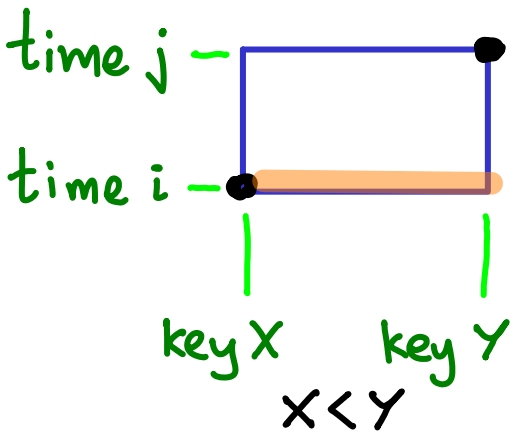
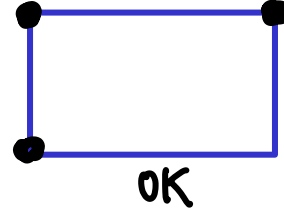
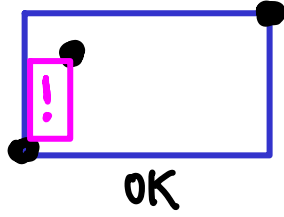
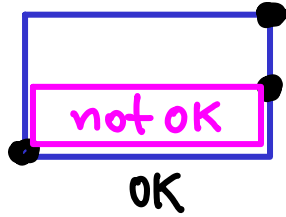
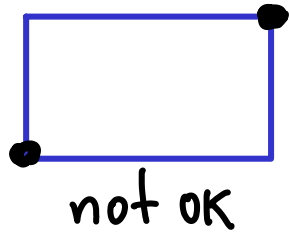
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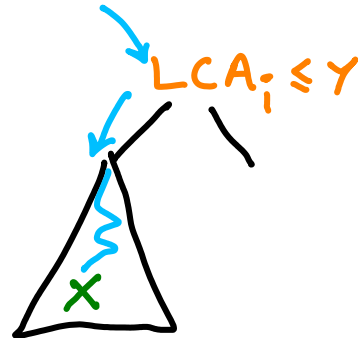
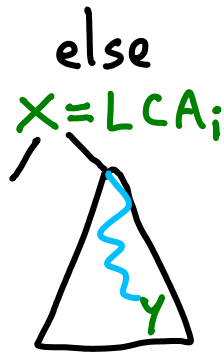


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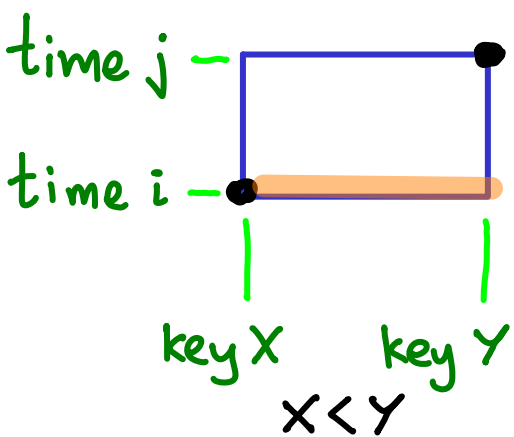
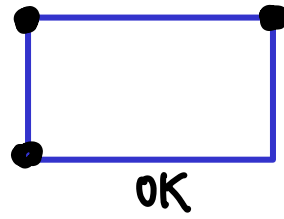
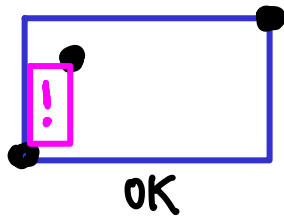
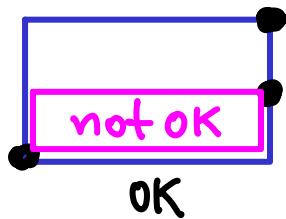
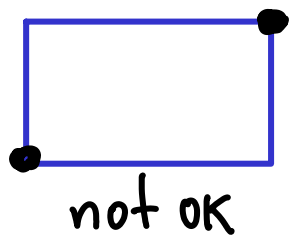


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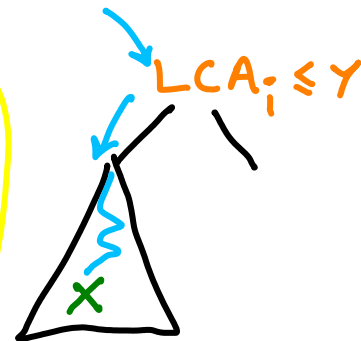
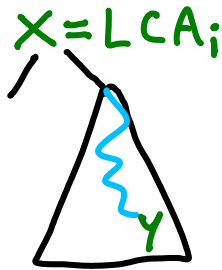
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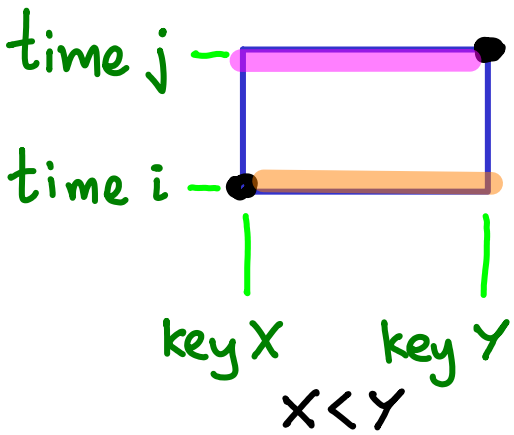
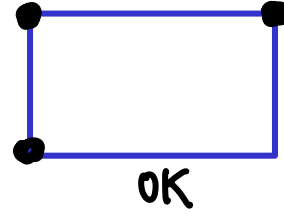
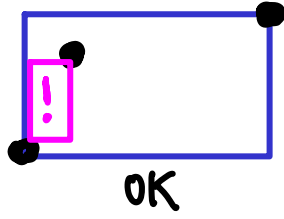
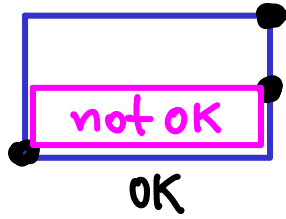
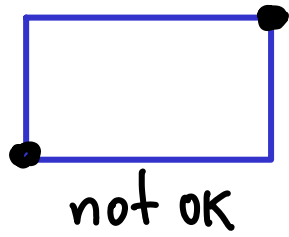
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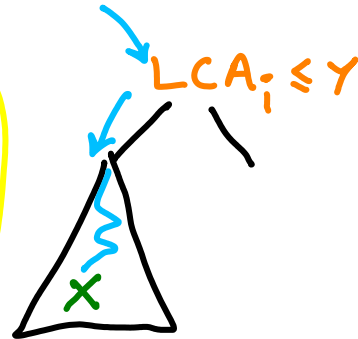
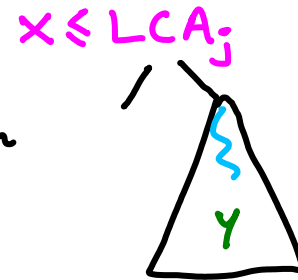
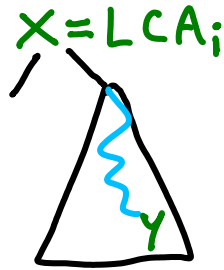
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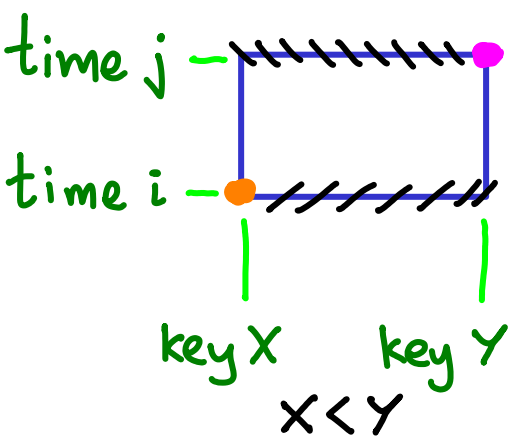
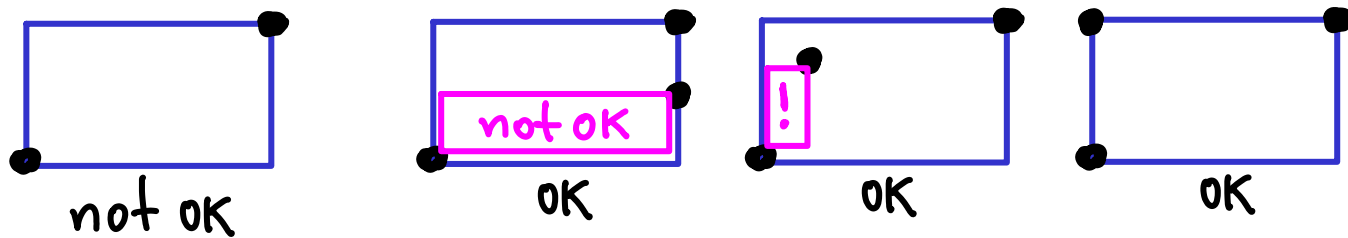
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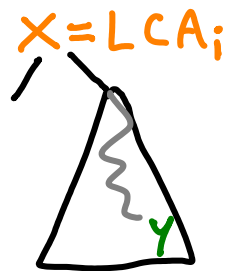


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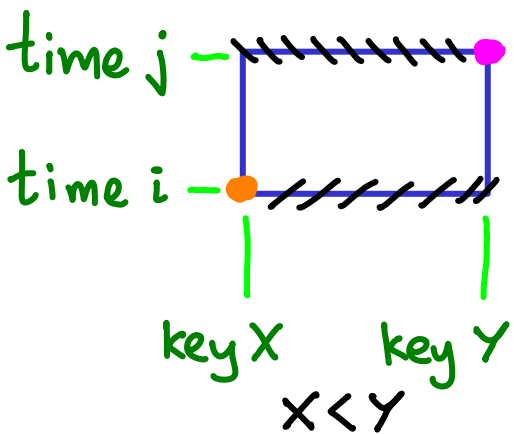
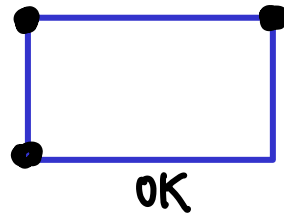
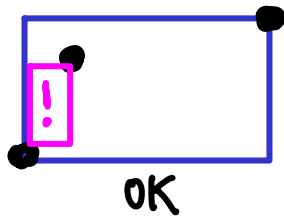
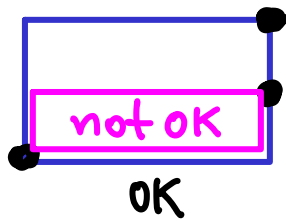
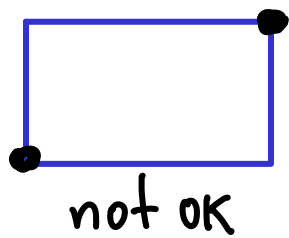


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So far the only hope of contradicting the theorem is



Theorem: the set of key accesses (over all ops) corresponds to a diagram where no two points form opposite corners of a closed rectangular region that is empty of other points



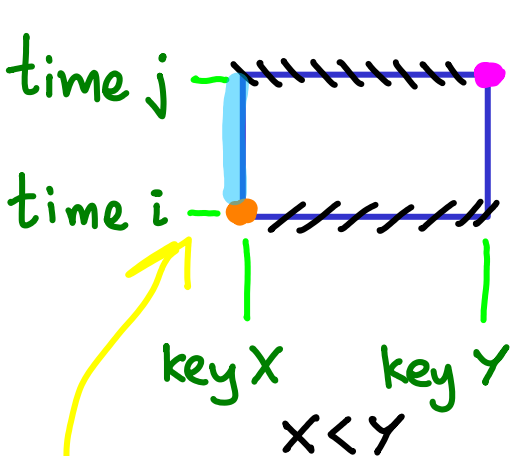
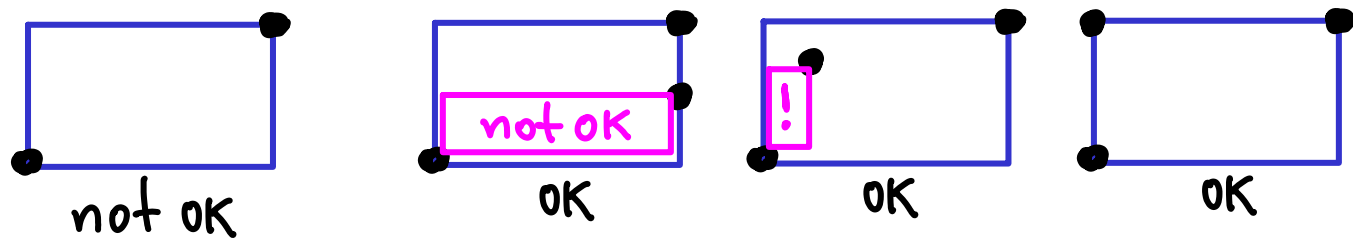
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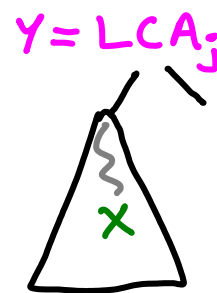
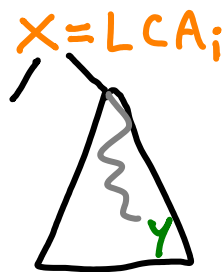
but then some time  $t$  ( $i < t \leq j$ ) we must rotate  $x$

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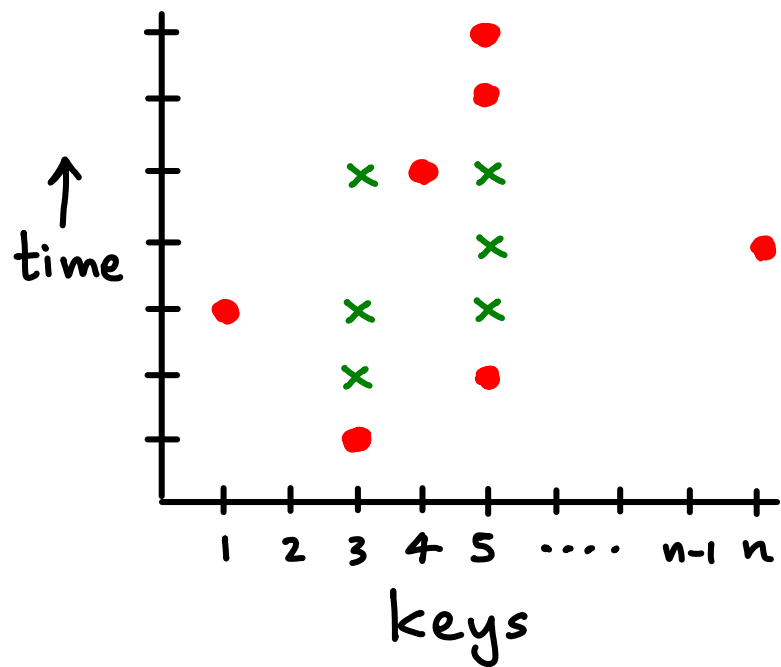
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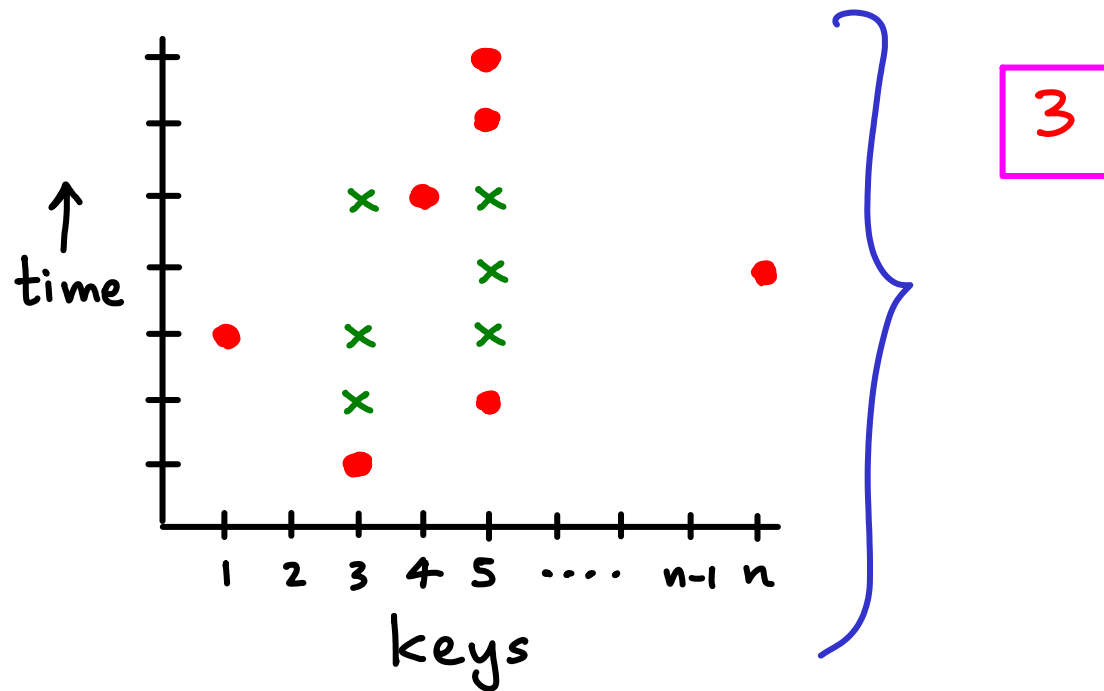
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Theorem: any diagram where no two points form opposite corners of a closed rectangular region that is empty of other points corresponds to the set of key accesses for some BST algorithm  
(reverse)

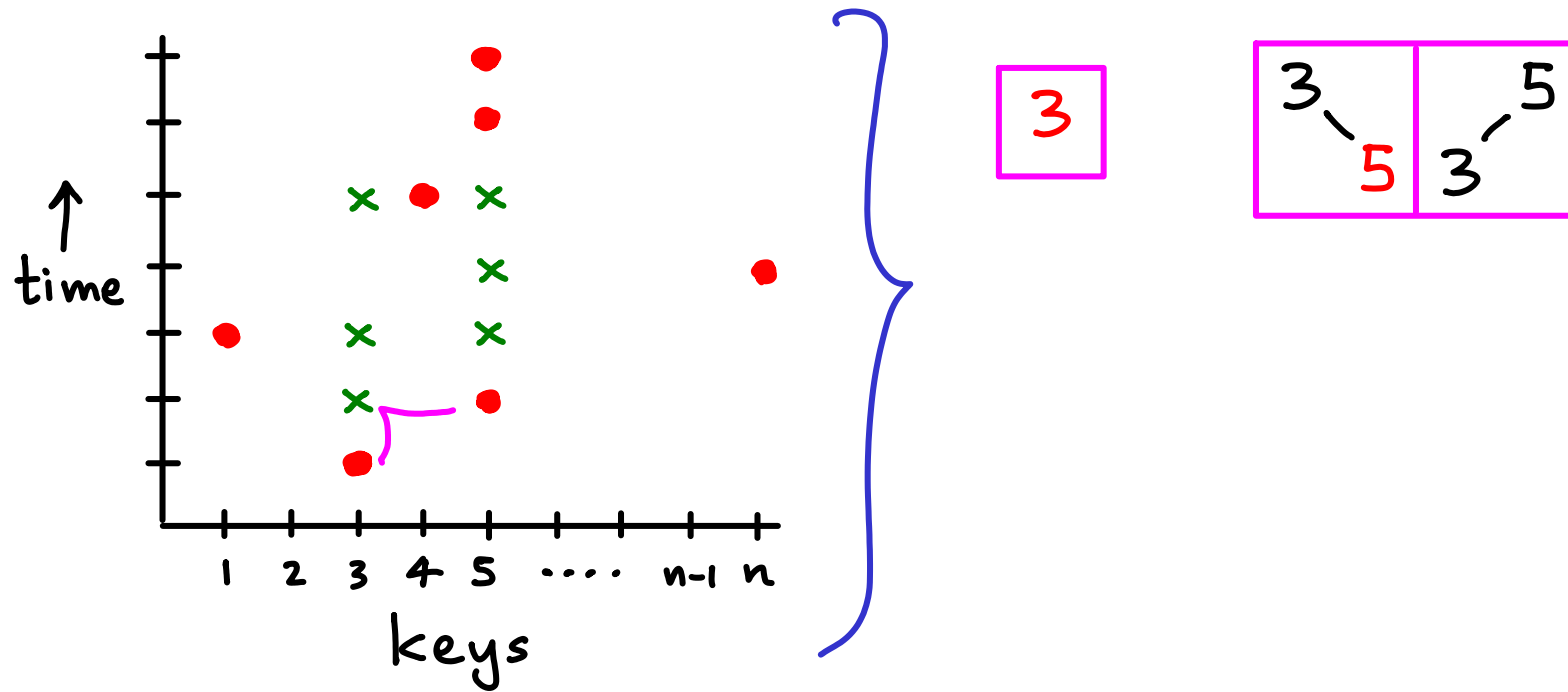


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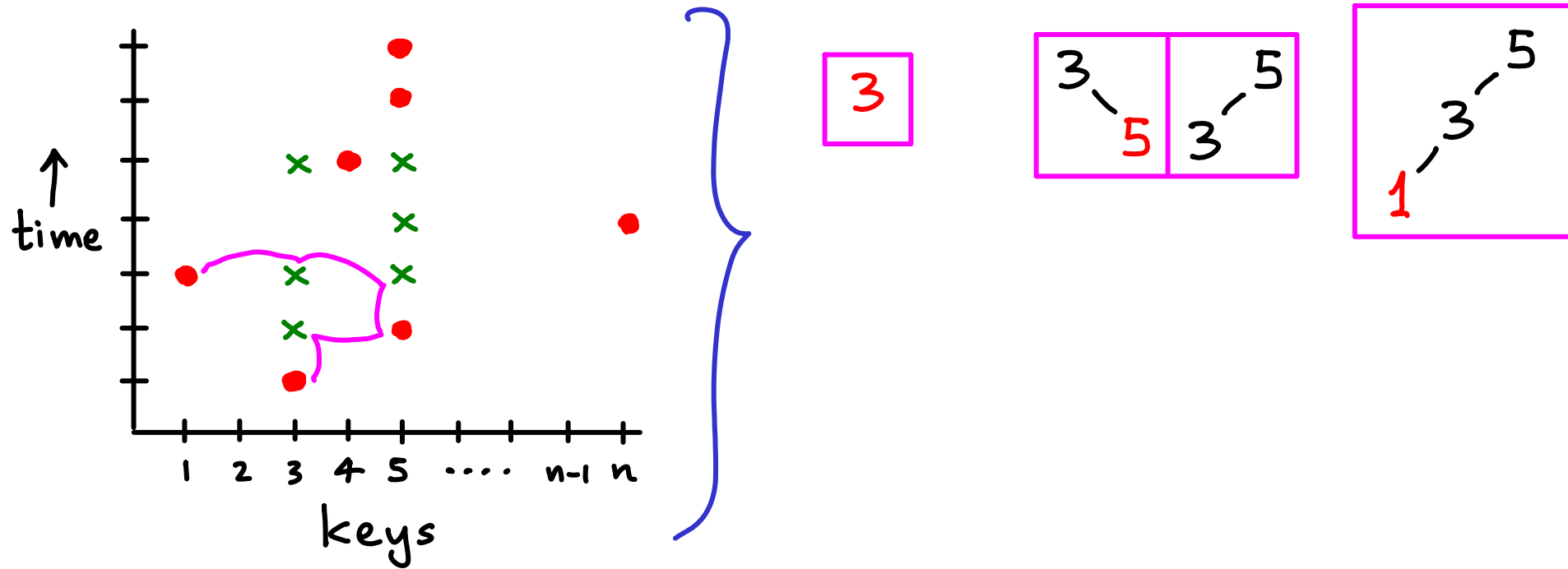




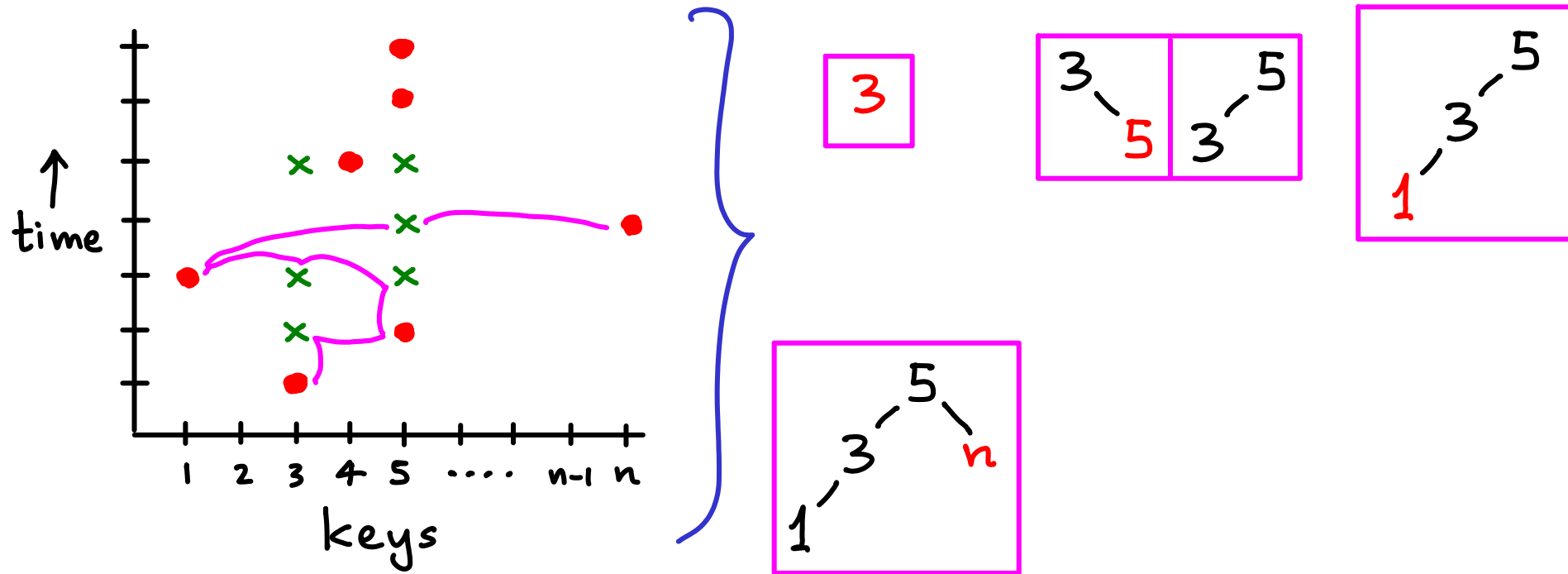
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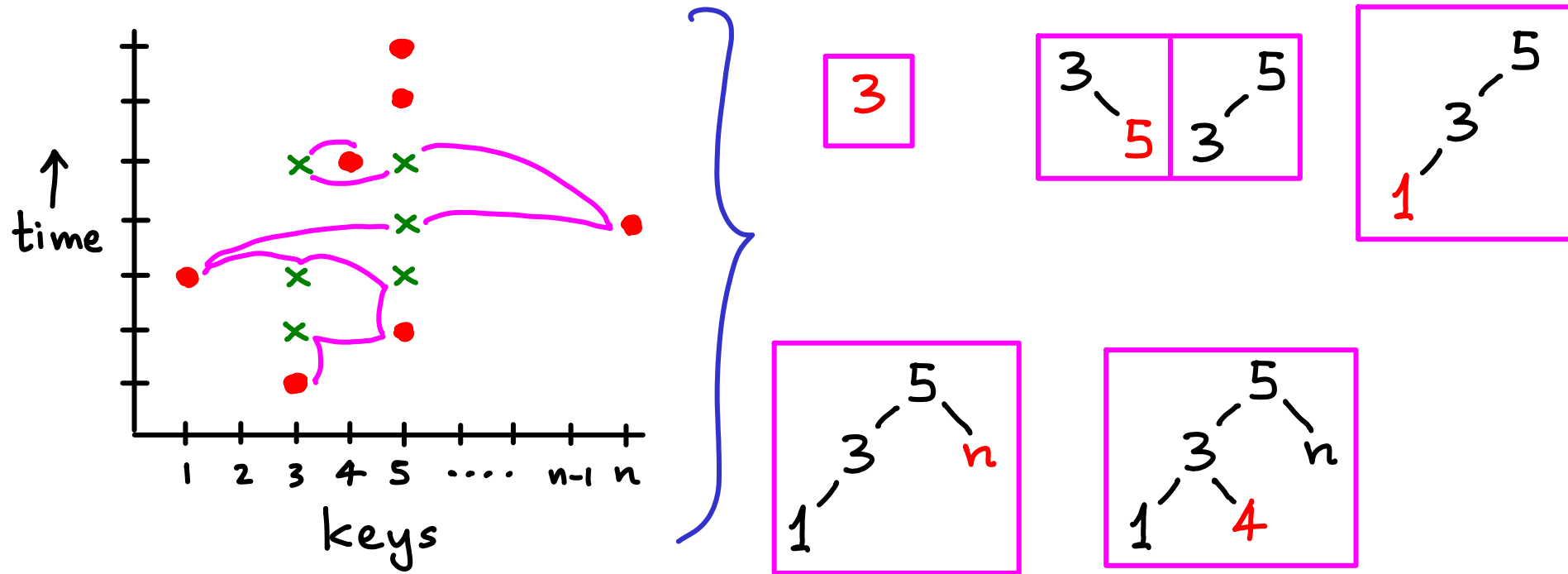
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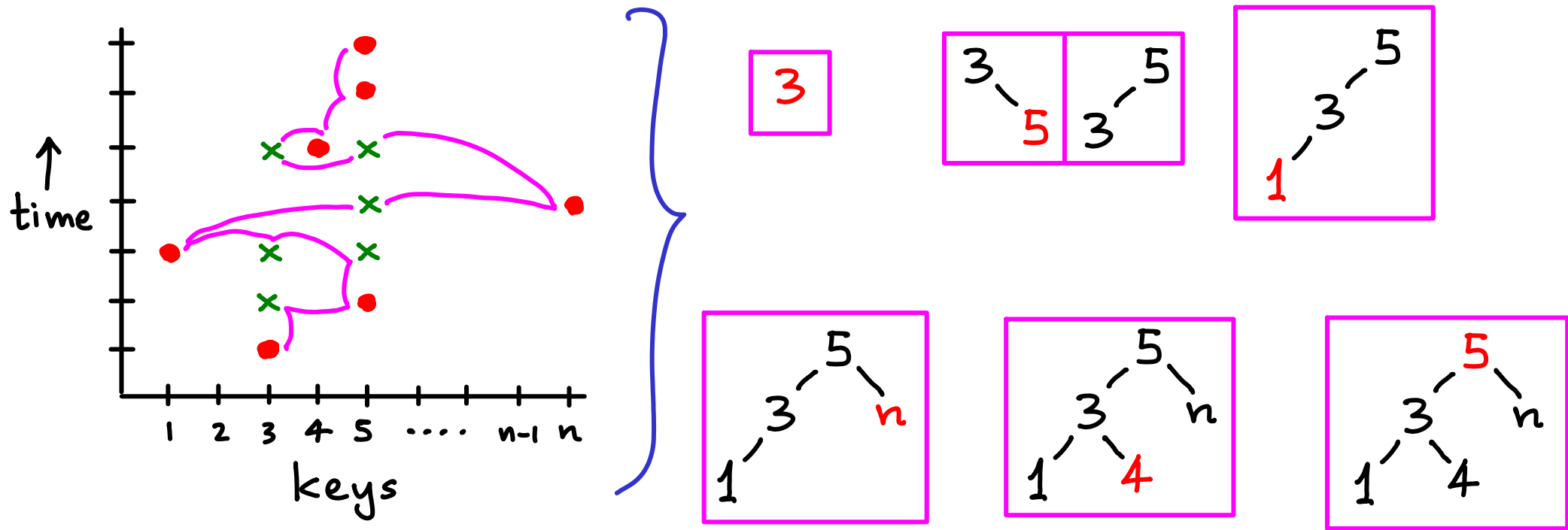
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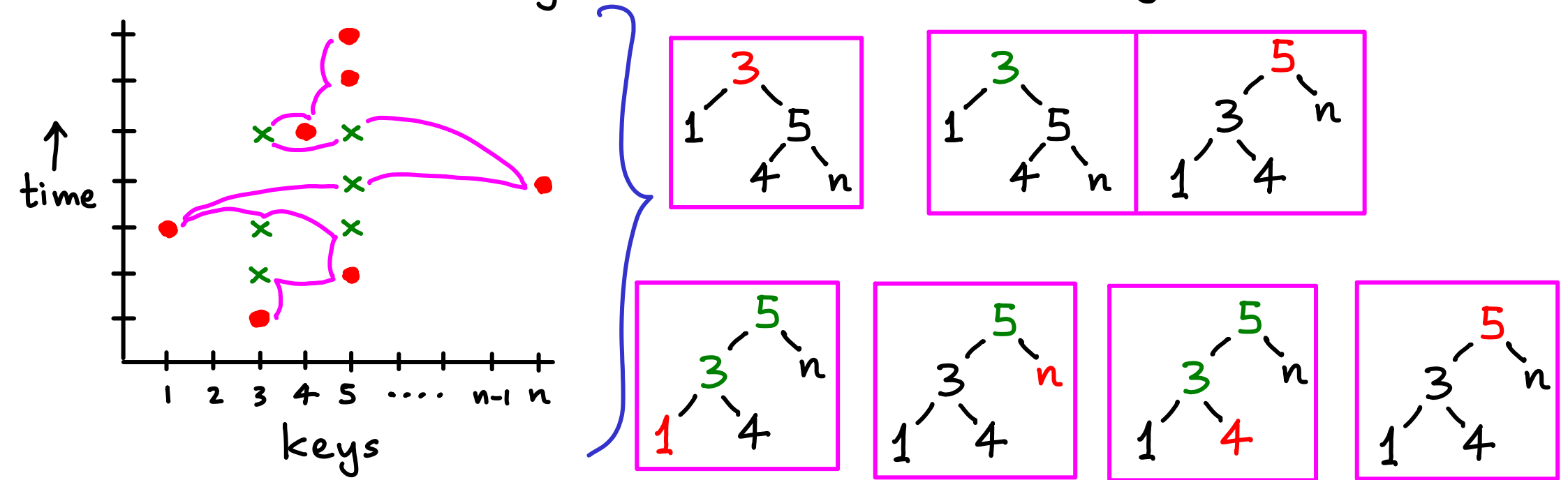
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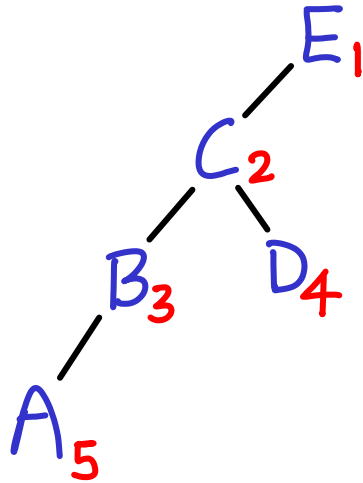
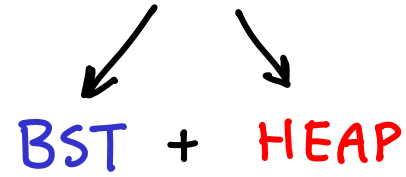
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Theorem: // version for static set of keys (no insert-delete)  
 (reverse) any diagram where no two points form opposite corners of a closed rectangular region that is empty of other points corresponds to the set of key accesses for some BST algorithm

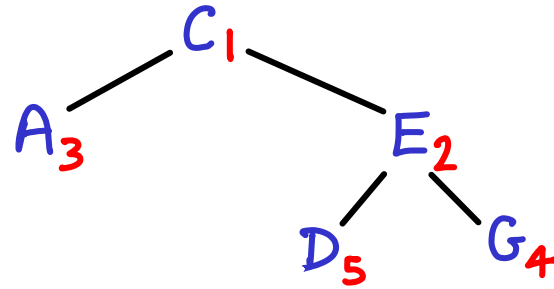
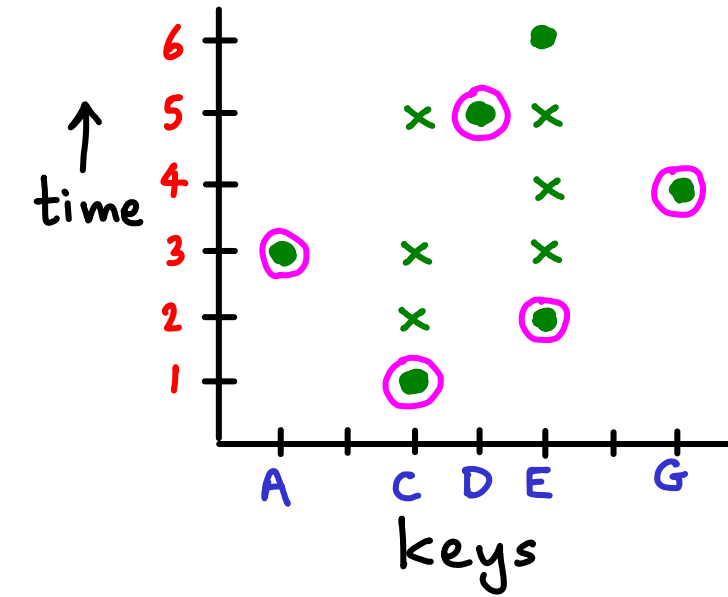


We will prove the theorem constructively, using TREAPS



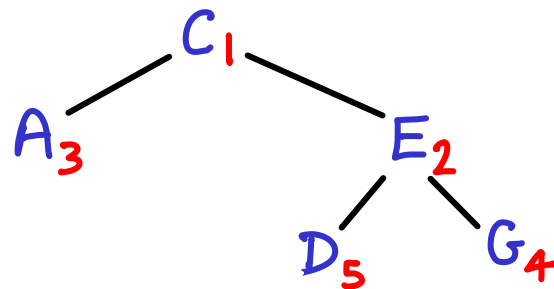
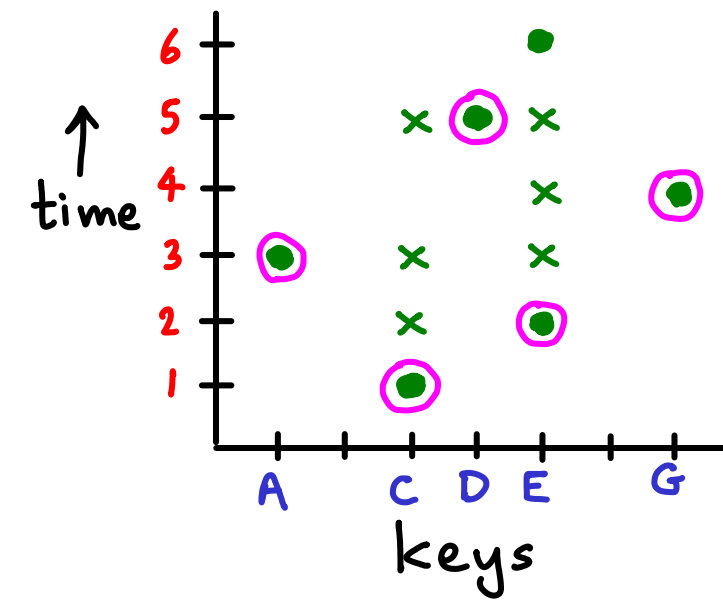
If heap values (and keys) are unique then shape is too.

Given a diagram, let every key have treap priority = lowest access time



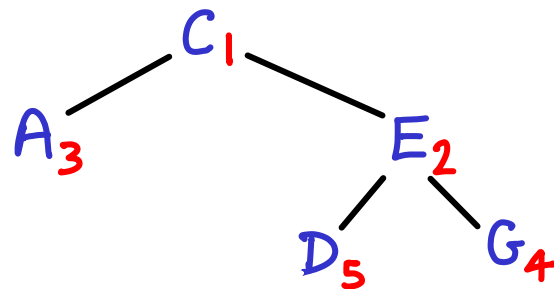
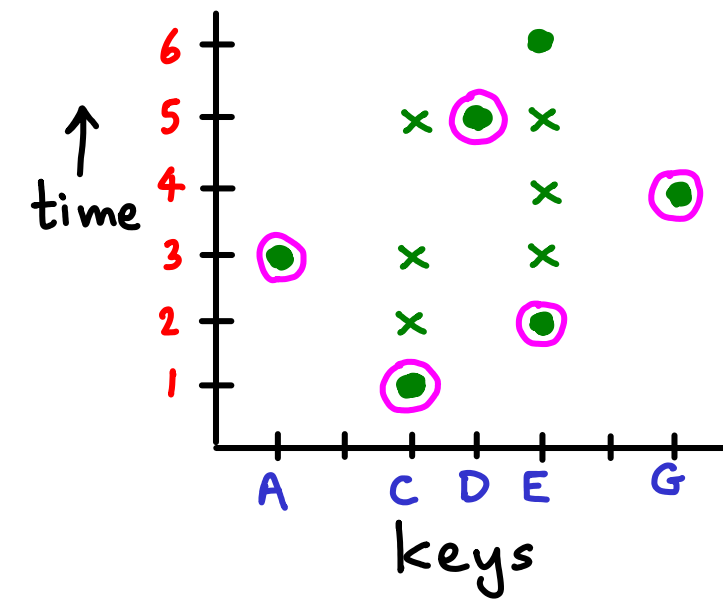


Given a diagram, let every key have treap priority = lowest access time



Treap priorities will increase over time

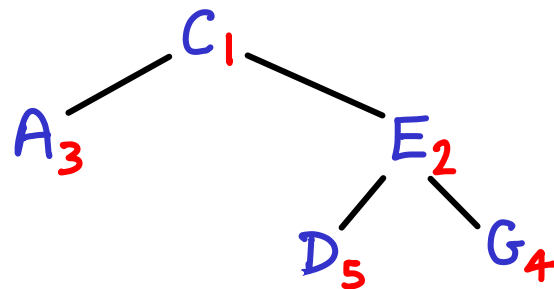
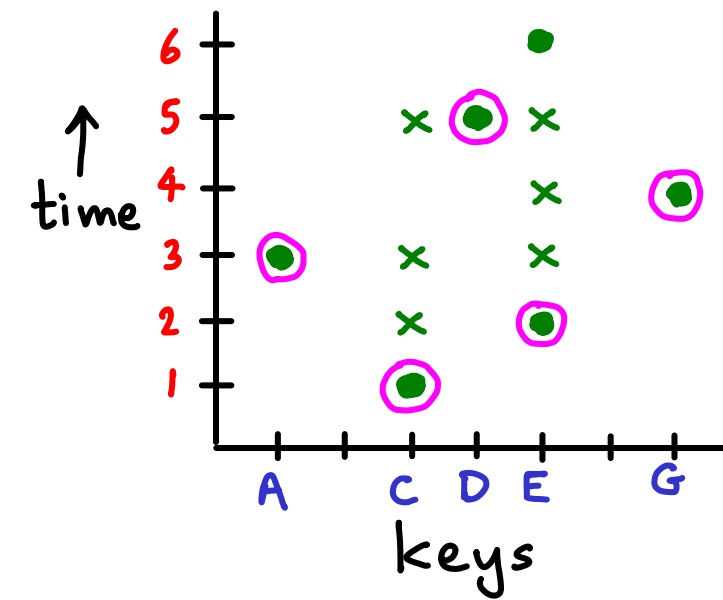
Given a diagram, let every key have treap priority = lowest access time



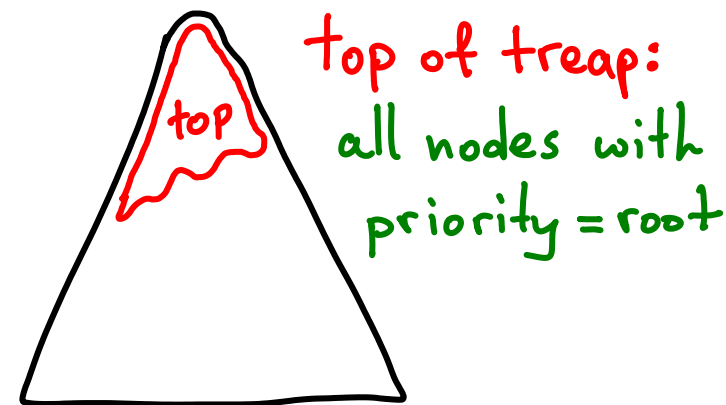
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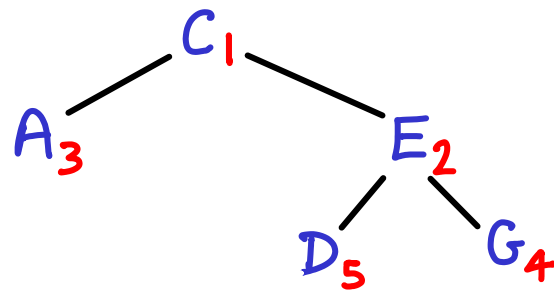
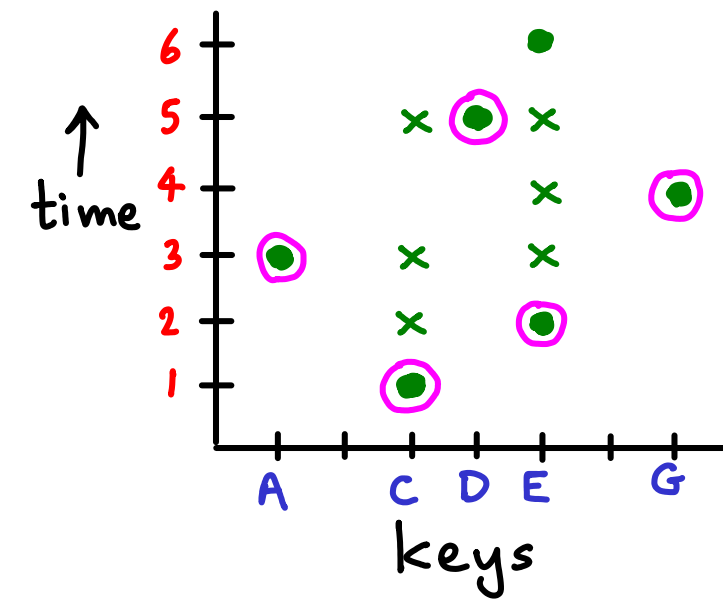


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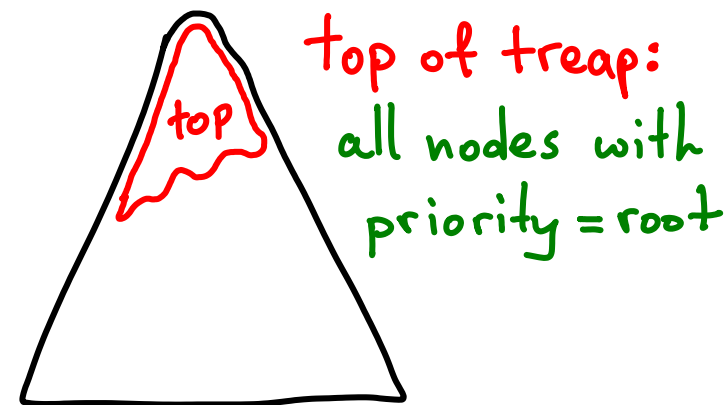


At time = min priority, we must access all of **top** and nothing below in treap

Given a diagram, let every key have treap priority = lowest access time

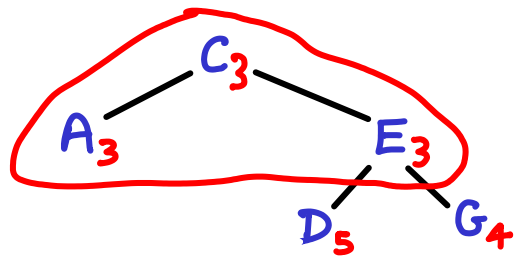
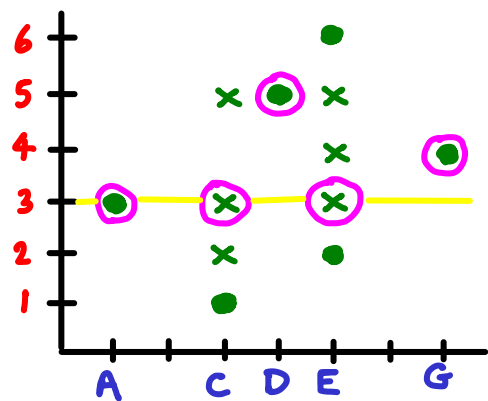


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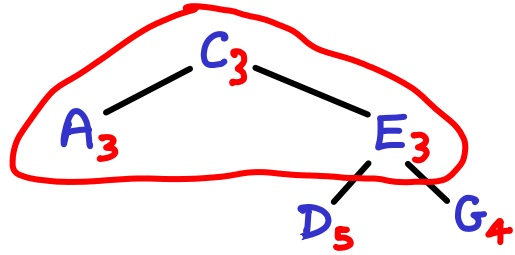
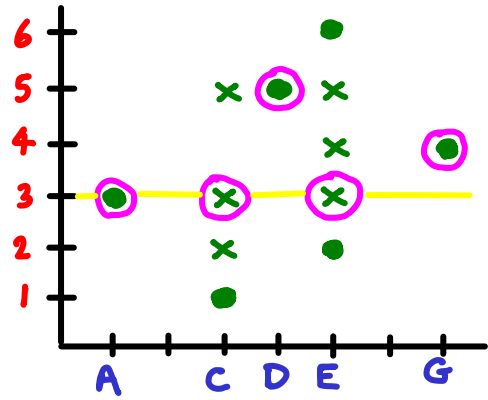


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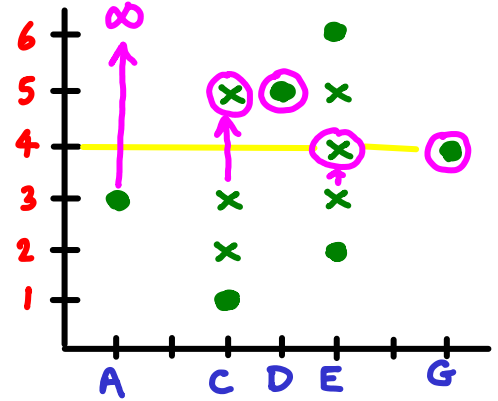
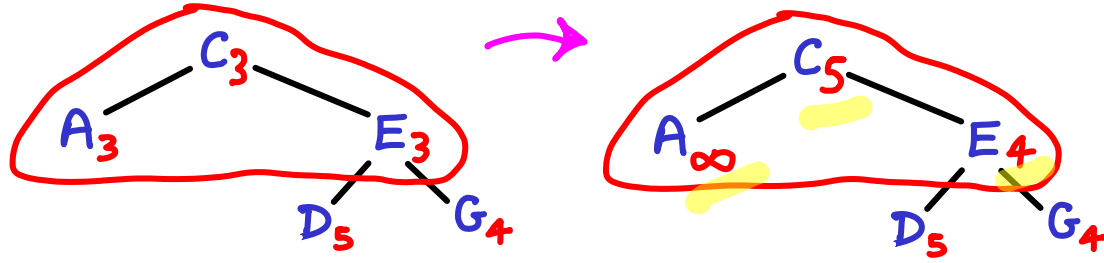
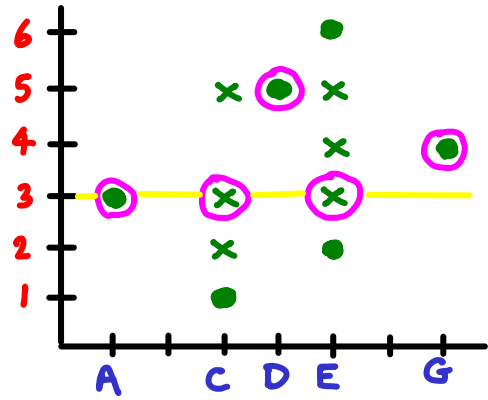
→ **top** may change shape via rotations,  
and all priorities within will increase in value  
(to next required access time)



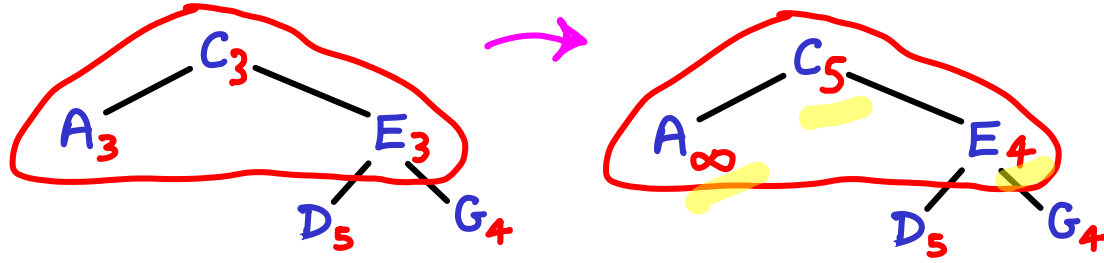
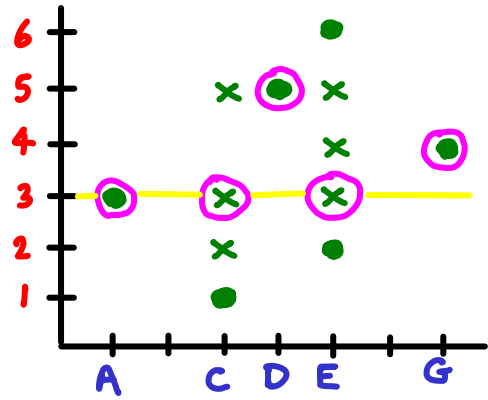
How should priorities in **top** change?



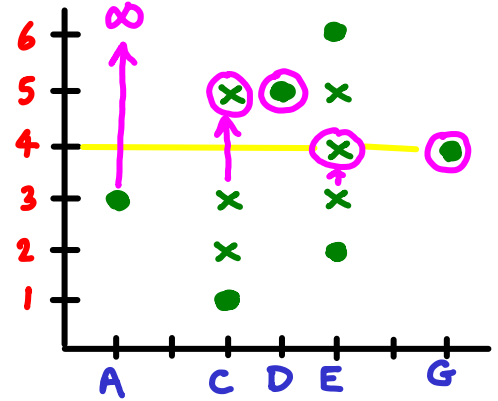
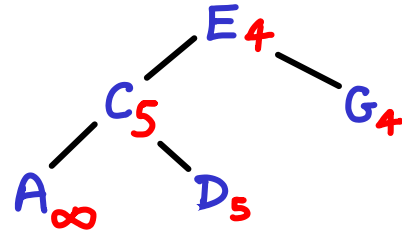
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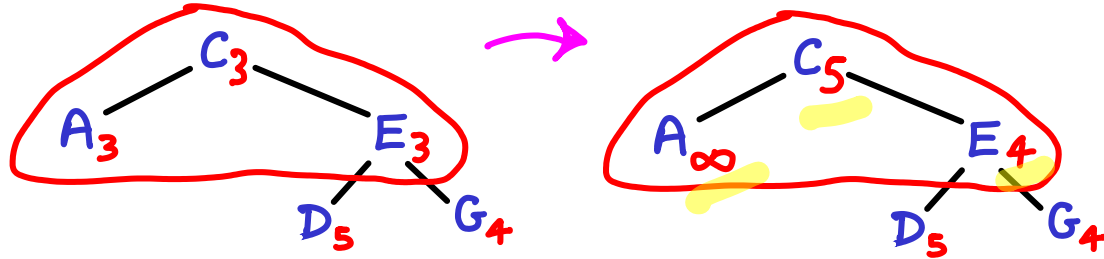
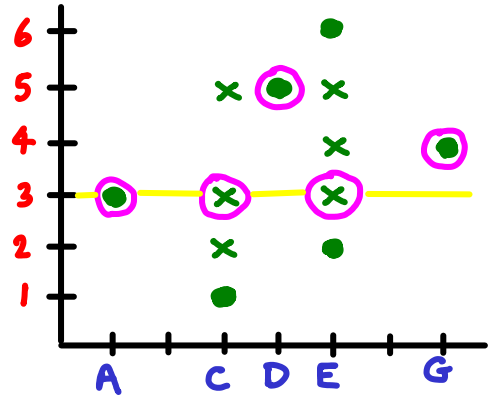


left-rotate(C)

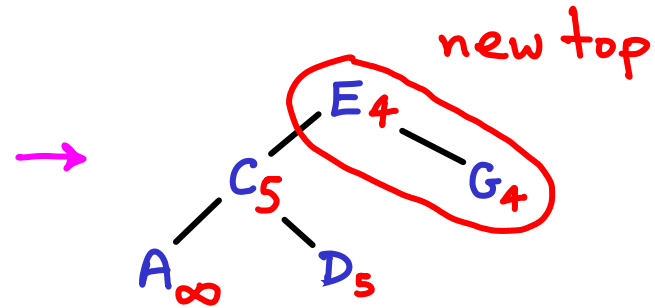
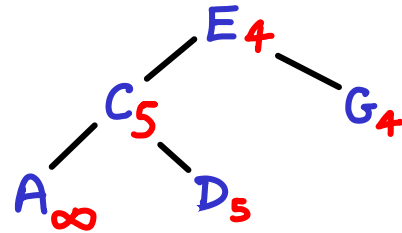
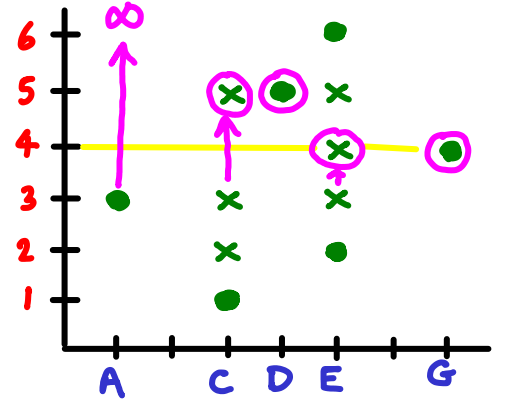




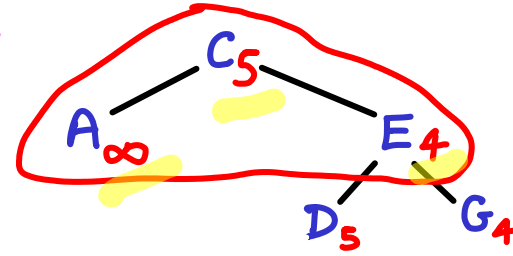
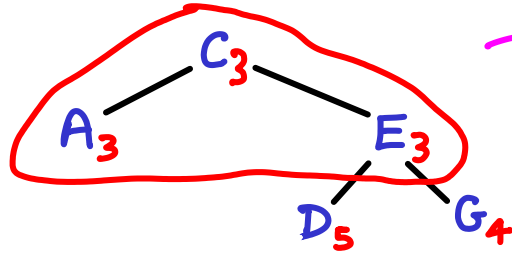
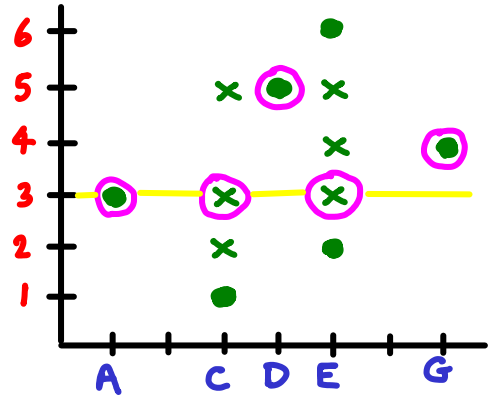
How should priorities in **top** change?



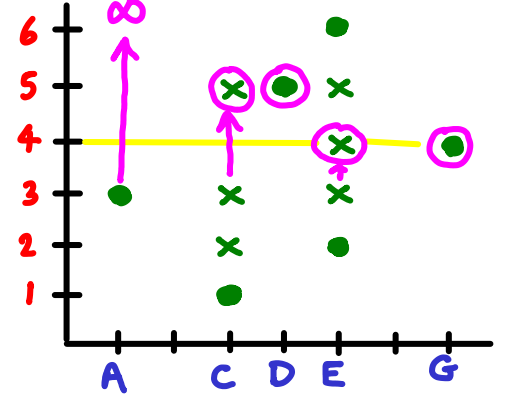
left-rotate(C)



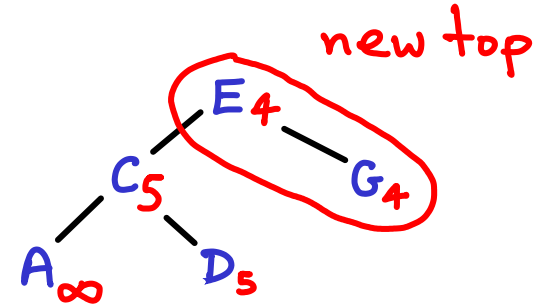
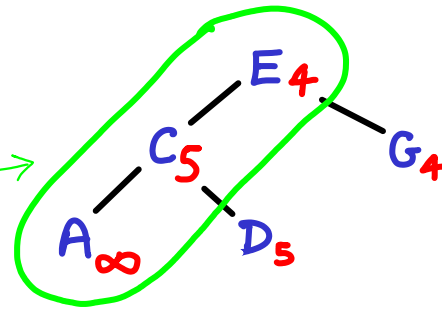
How should priorities in **top** change?



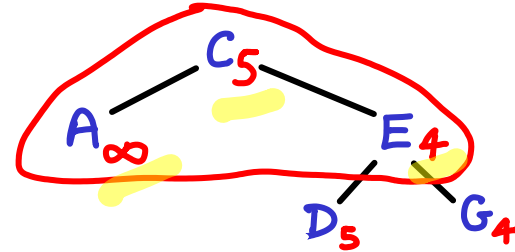
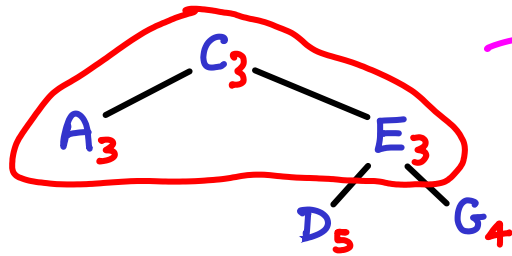
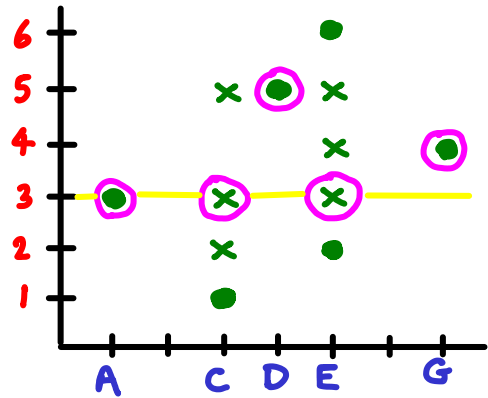
left-rotate(C)



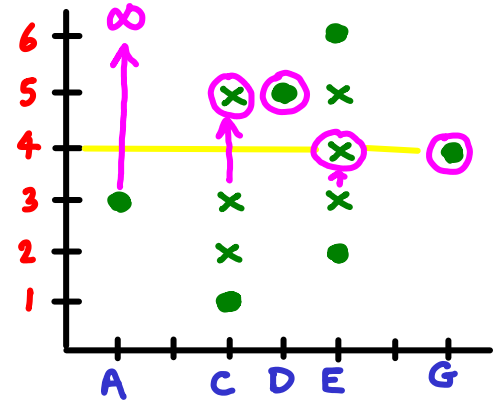
Just convert given shape of top  
to whatever shape we need  
s.t. heap property is restored



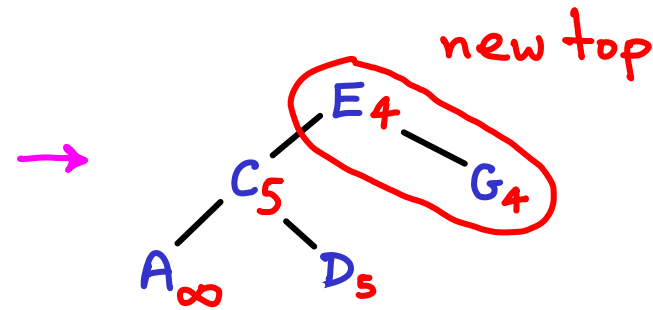
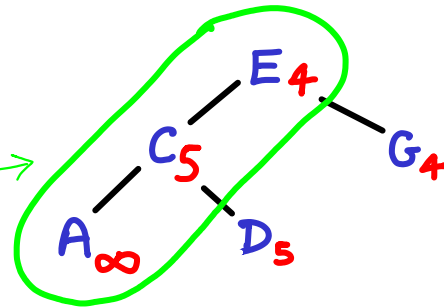
How should priorities in **top** change?



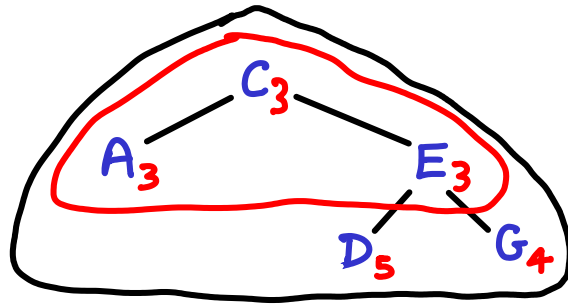
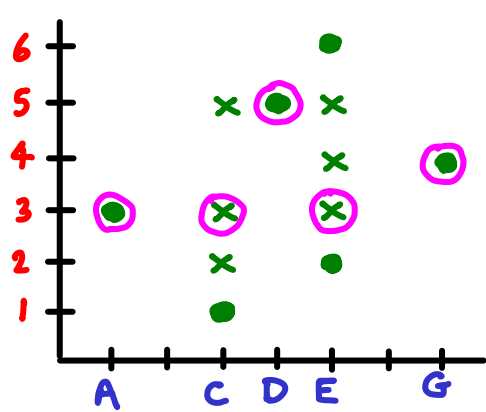
left-rotate(C)



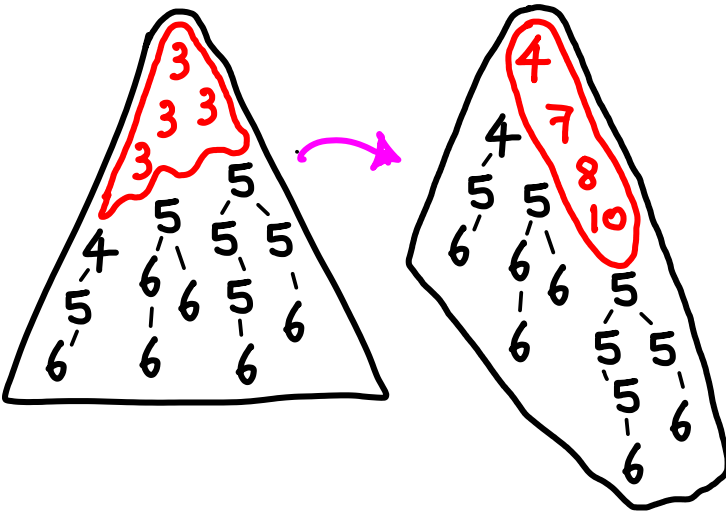
Just convert given shape of top to whatever shape we need s.t. heap property is restored



From COMP-160 we know this can always be done with  $< 2n$  rotations



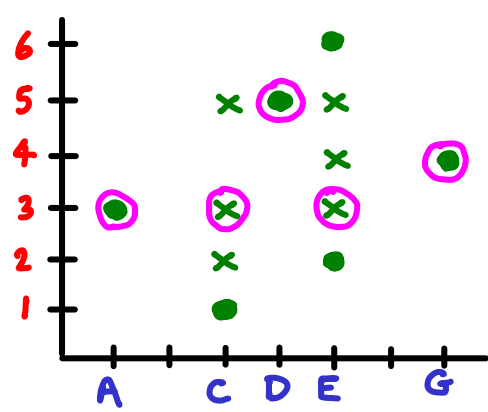
Method so far: at every time step, we will access (and possibly rotate) precisely the nodes in **top**, and update their priorities.



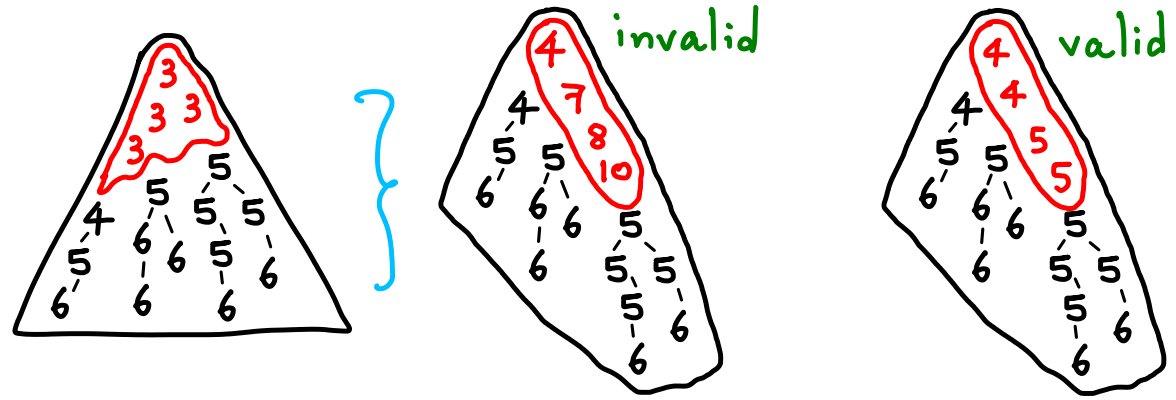
This restores the **top** as a treap.

All other nodes passively follow.

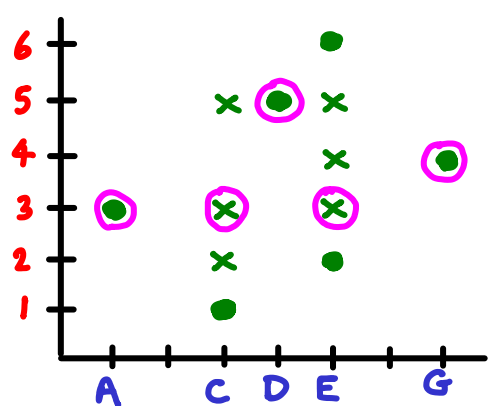




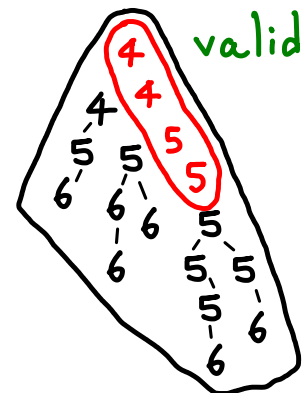
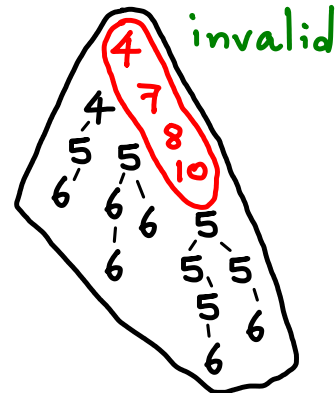
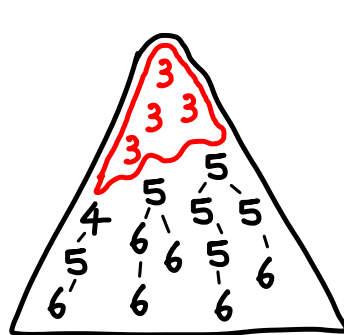
Claim:  
new priorities  
won't violate  
heap property



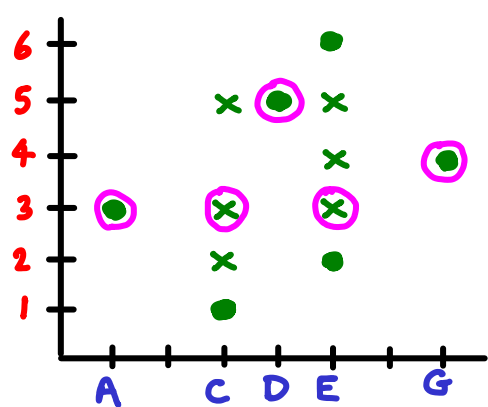
PROOF...



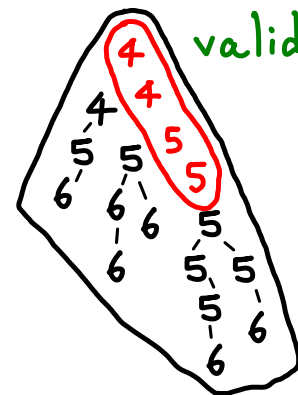
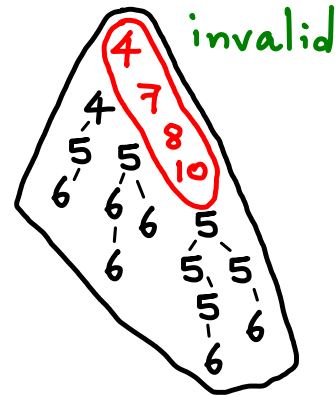
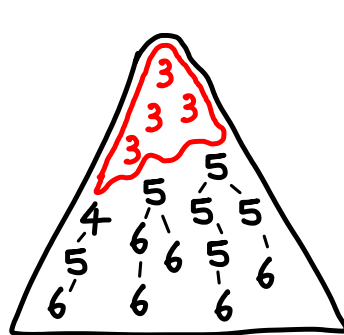
Claim:  
new priorities  
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heap property



Proof by contradiction:



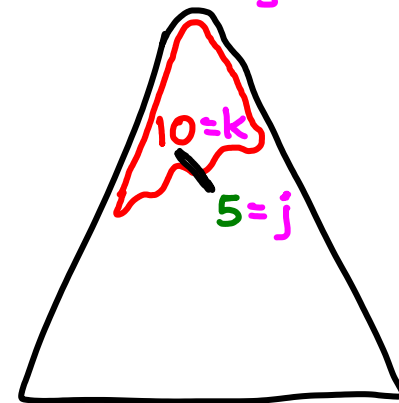
Claim:  
new priorities  
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heap property



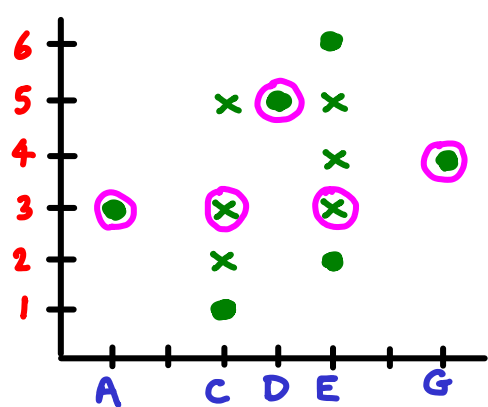
Proof by contradiction: suppose  $\exists$  edge  $x \rightarrow y$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$

keys:

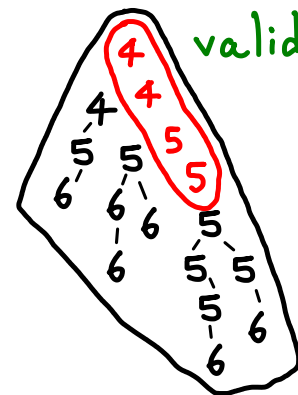
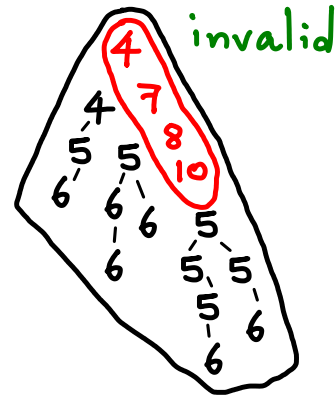
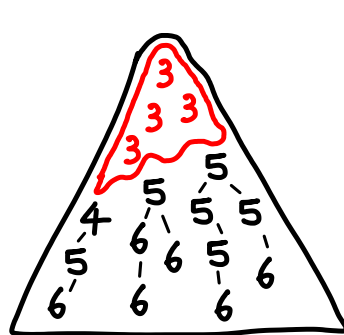
wlog  $x < y$







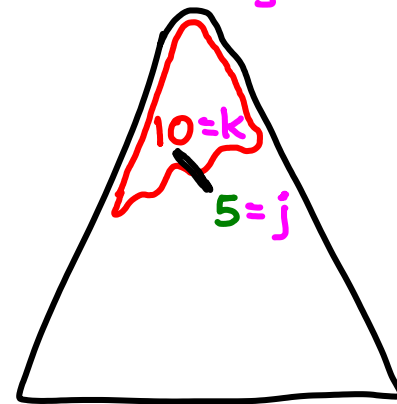
Claim:  
new priorities  
won't violate  
heap property

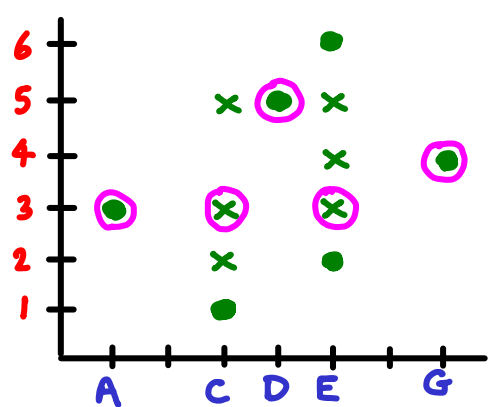


Proof by contradiction: suppose  $\exists$  edge  $x \rightarrow y$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$

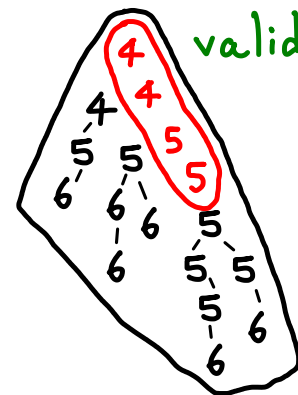
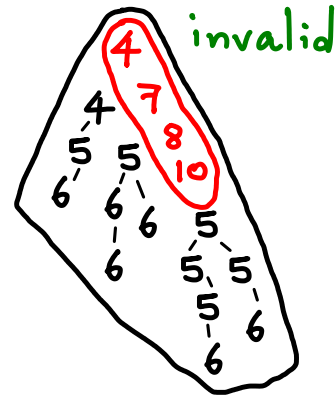
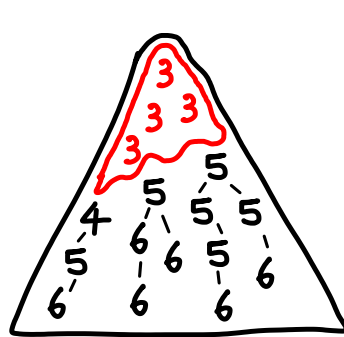
We know  $\underbrace{\text{priority}(y)}_j > \underbrace{\text{old priority}(x)}_i$

WHY?



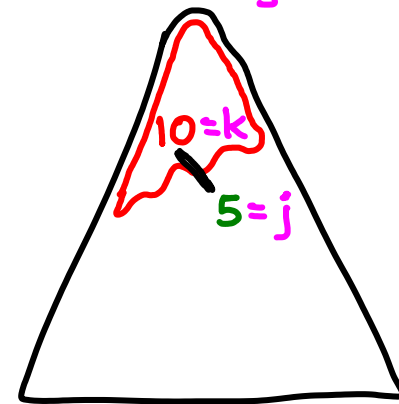


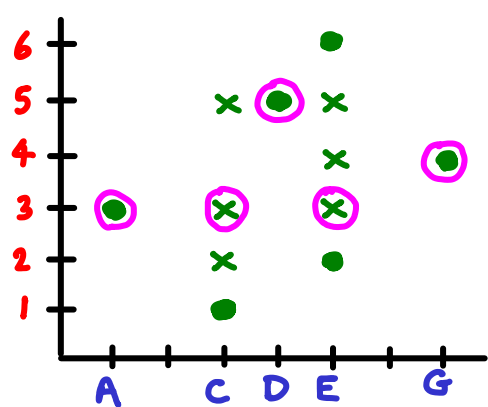
Claim:  
new priorities  
won't violate  
heap property



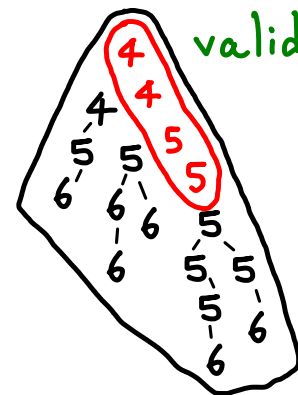
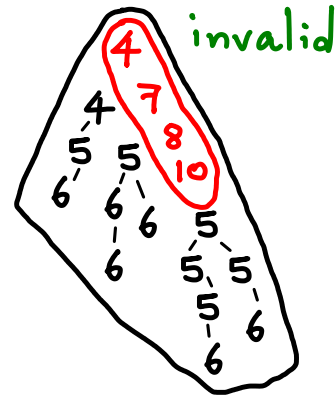
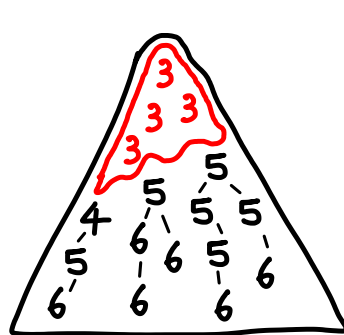
Proof by contradiction: suppose  $\exists$  edge  $x \rightarrow y$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$

We know  $\underbrace{\text{priority}(y)}_j > \underbrace{\text{old priority}(x)}_i$   
wasn't in top





Claim:  
new priorities  
won't violate  
heap property

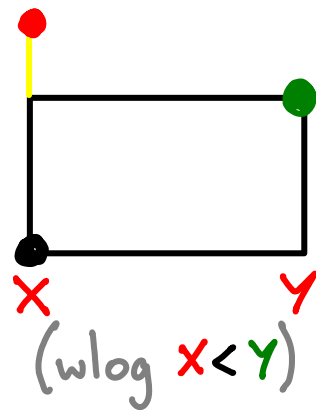


Proof by contradiction: suppose  $\exists$  edge  $x \rightarrow y$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$

time  $k > j$  —

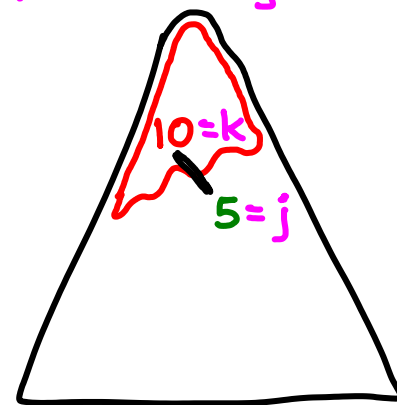
time  $j > i$  —

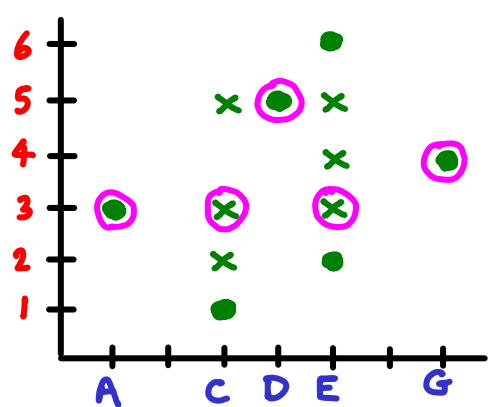
time  $i$  —



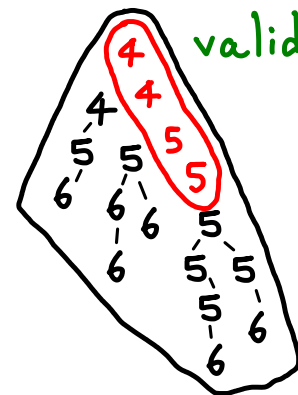
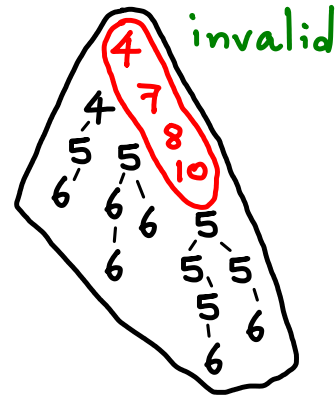
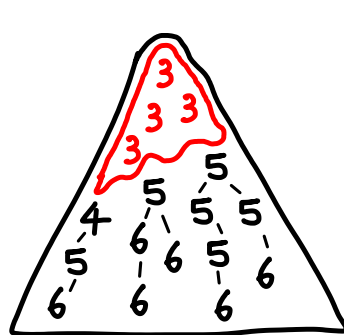
We know  $\underbrace{\text{priority}(y)}_j > \underbrace{\text{old priority}(x)}_i$

...?

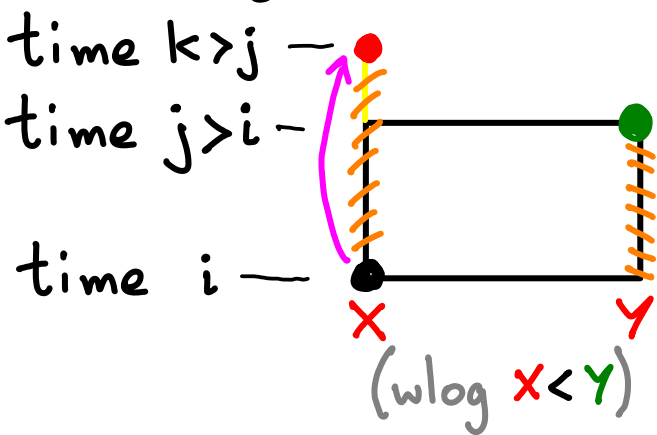




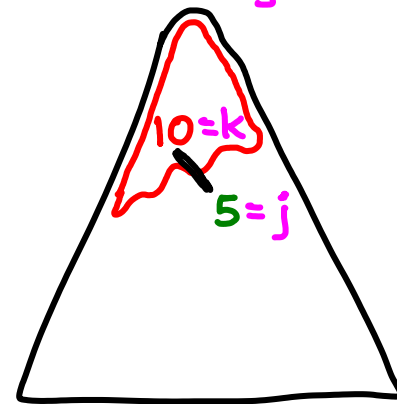
Claim:  
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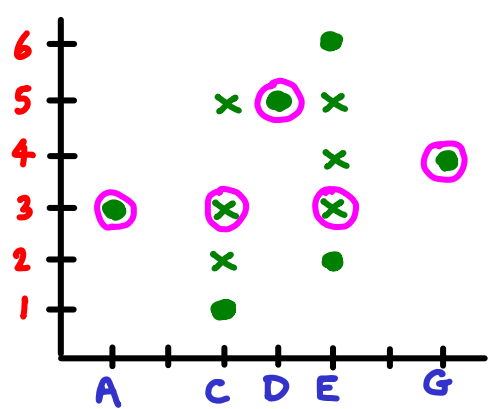


Proof by contradiction: suppose  $\exists$  edge  $x \rightarrow y$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$

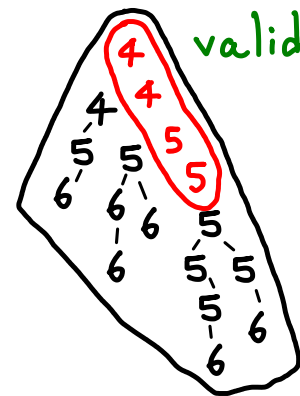
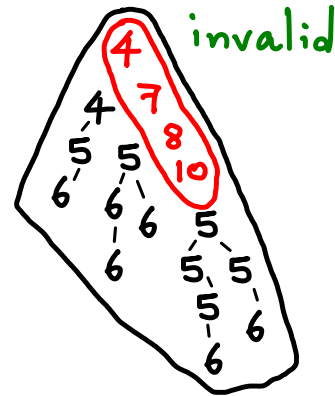
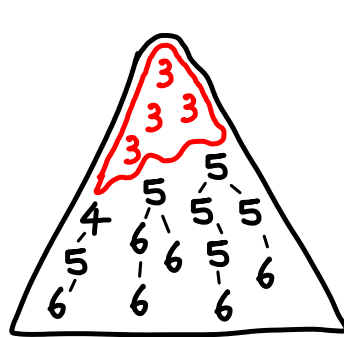


We know  $\underbrace{\text{priority}(y)}_j > \underbrace{\text{old priority}(x)}_i$   
 $\hookrightarrow$  so left & right sides of box are empty

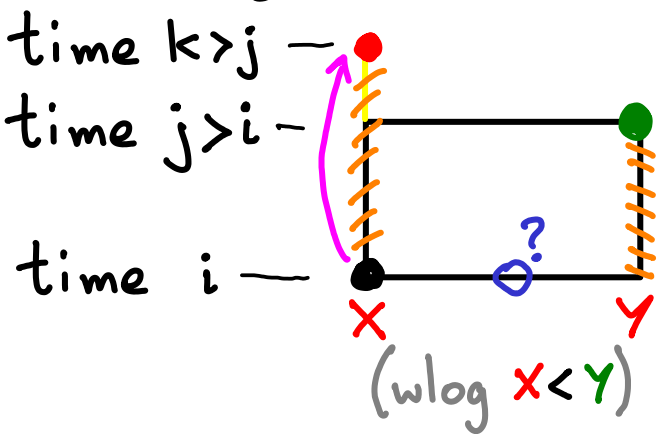




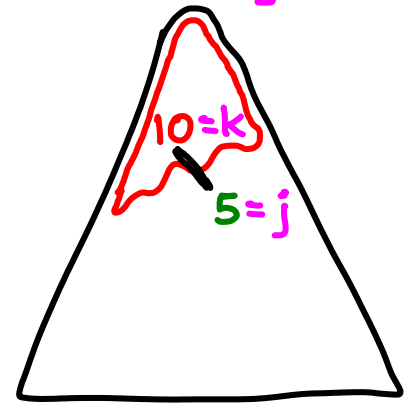
Claim:  
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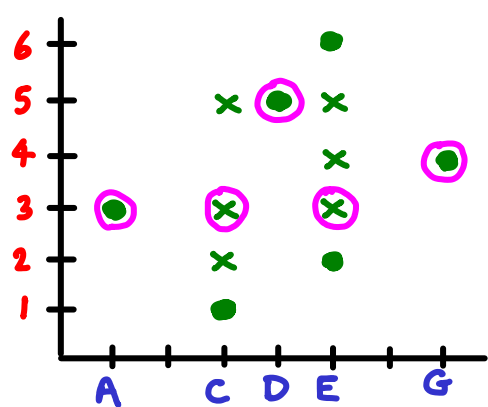


Proof by contradiction: suppose  $\exists$  edge  $x \rightarrow y$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$

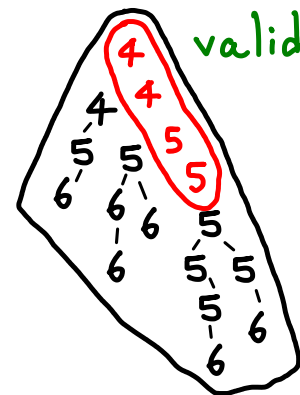
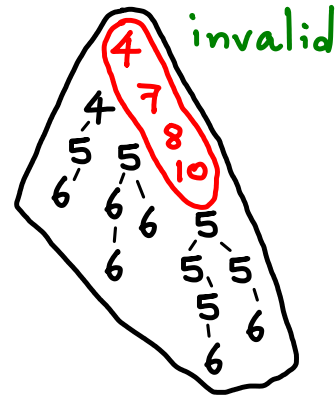
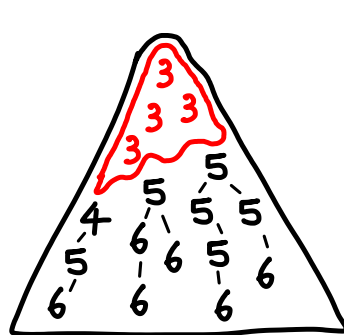


We know  $\underbrace{\text{priority}(y)}_j > \underbrace{\text{old priority}(x)}_i$   
 ↳ so left & right sides of box are empty  
 What about bottom side?

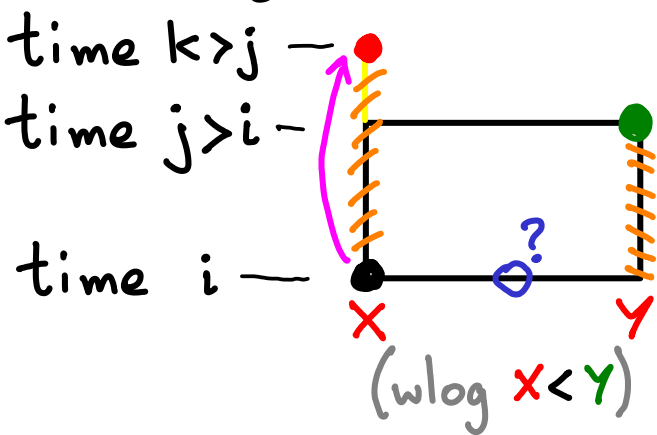




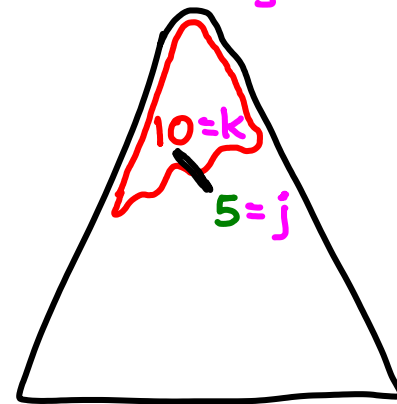
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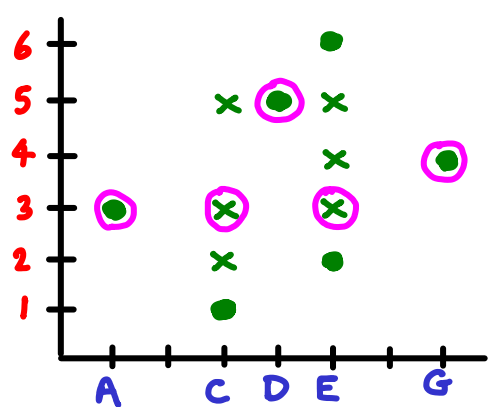


Proof by contradiction: suppose  $\exists$  edge  $\overset{x}{\text{---}} \underset{y}{\text{---}}$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$

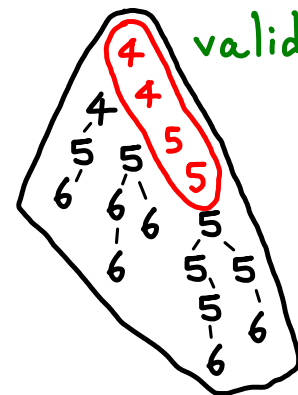
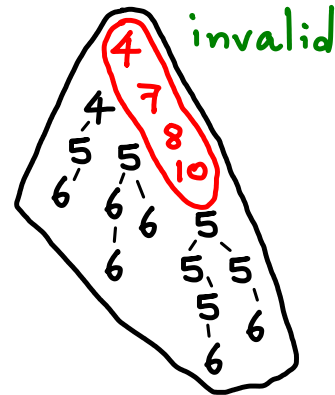
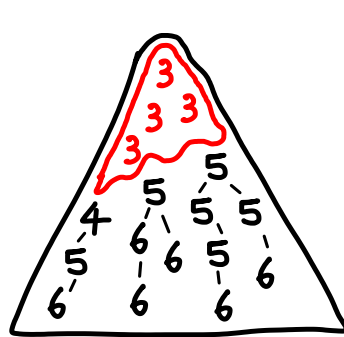


We know  $\underbrace{\text{priority}(y)}_j > \underbrace{\text{old priority}(x)}_i$   
 ↳ so left & right sides of box are empty  
 What about bottom side?  
 Would need  $x < \text{key} < y$  but then...

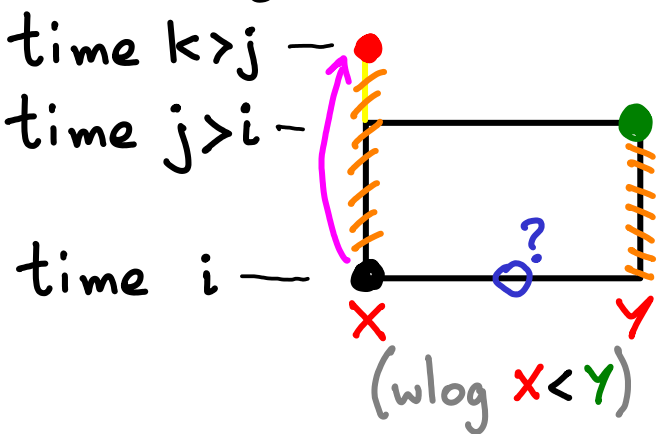




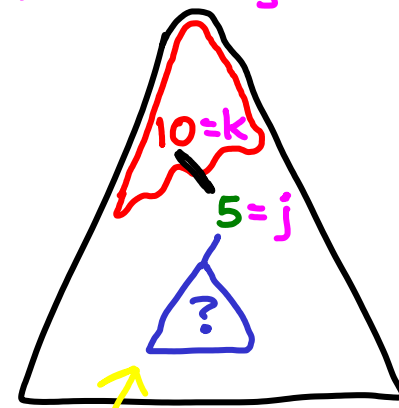
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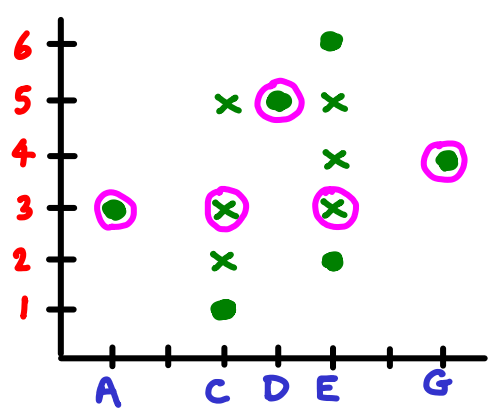


Proof by contradiction: suppose  $\exists$  edge  $x \rightarrow y$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$

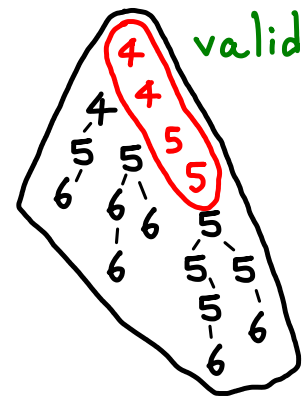
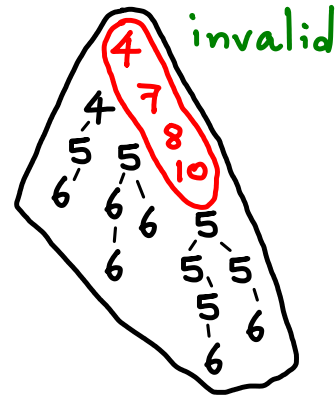
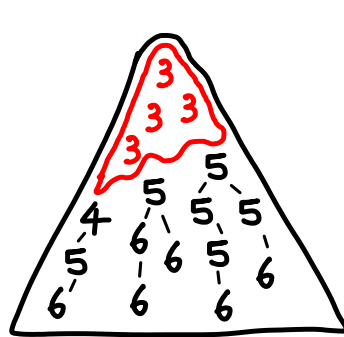


We know  $\underbrace{\text{priority}(y)}_j > \underbrace{\text{old priority}(x)}_i$   
 $\hookrightarrow$  so left & right sides of box are empty  
 What about bottom side?  
 Would need  $x < \text{key} < y$  but then...  
 ...key is in left subtree of  $y$  (at time  $i$ )

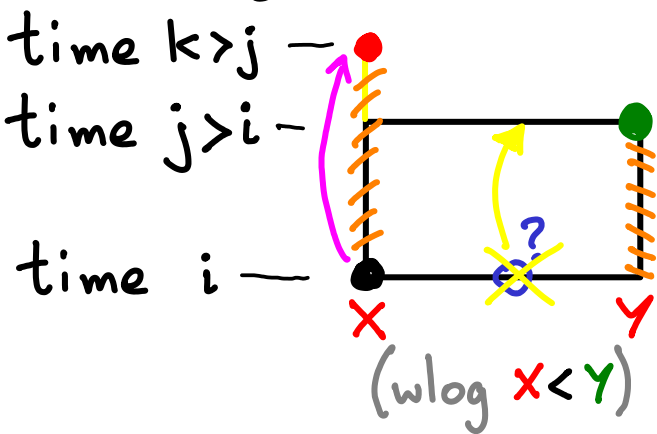




Claim:  
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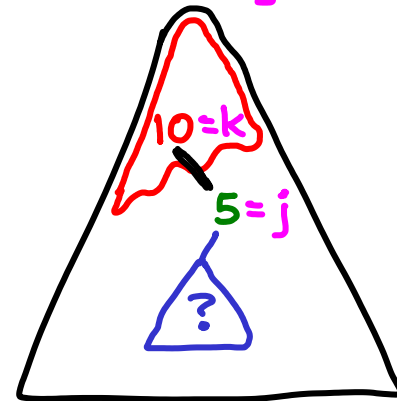
Proof by contradiction: suppose  $\exists$  edge  $x \rightarrow y$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$



We know  $\underbrace{\text{priority}(y)}_j > \underbrace{\text{old priority}(x)}_i$   
 ↳ so left & right sides of box are empty  
 What about bottom side?

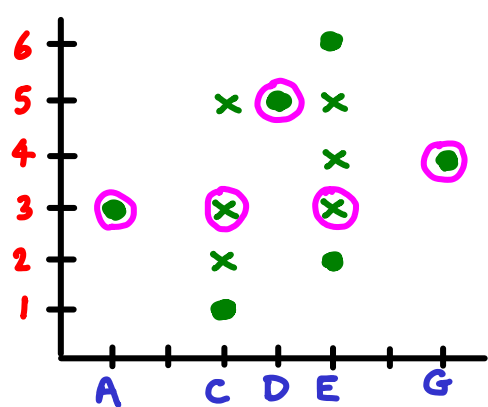
Would need  $x < \text{key} < y$  but then...

...key is in left subtree of Y, so (unchanged) priority  $\geq j$  ( $> i$ )

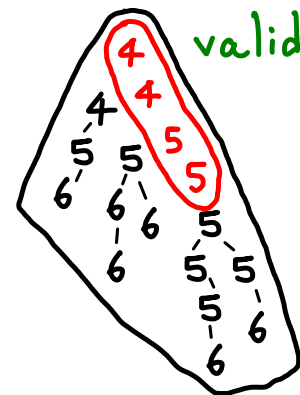
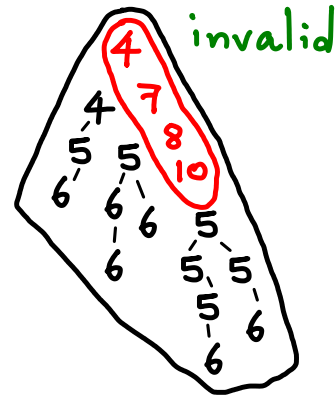
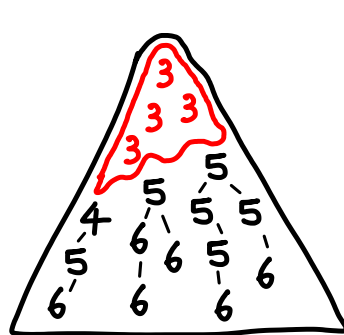


CONTRADICTION

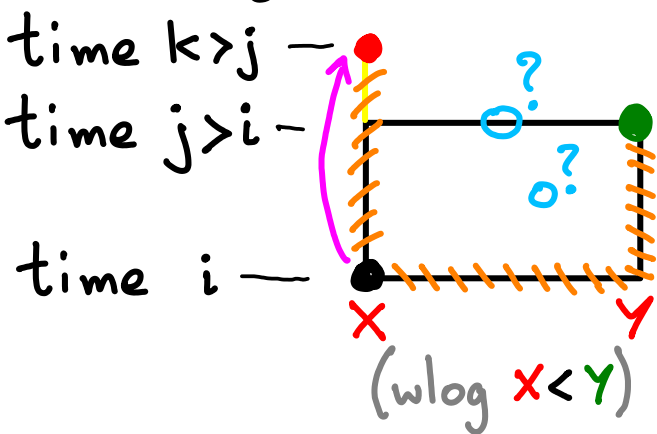




Claim:  
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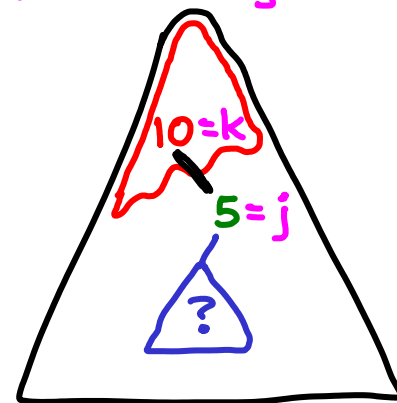
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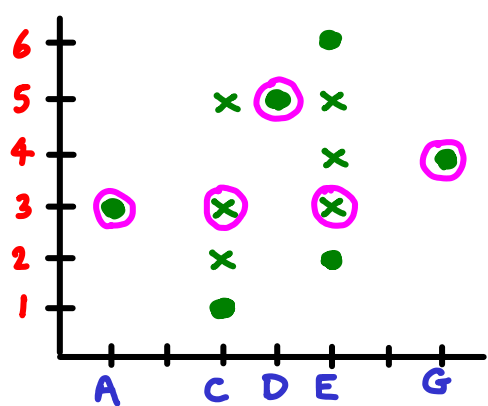
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Would need  $x < \text{key} < y$  but then...

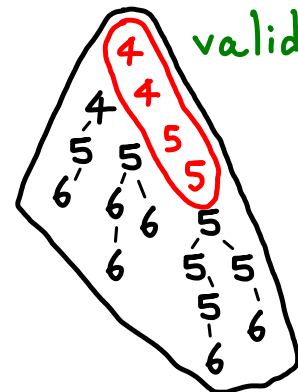
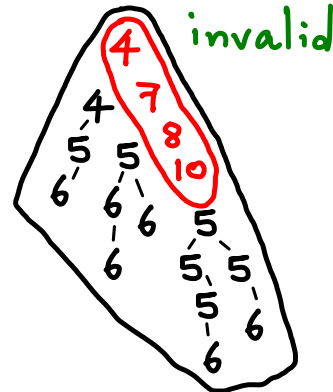
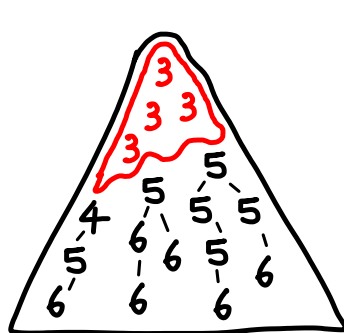
...key is in left subtree of  $y$ , so (unchanged) priority  $\geq j$  ( $> i$ )  
 $\hookrightarrow$  so bottom side is empty.



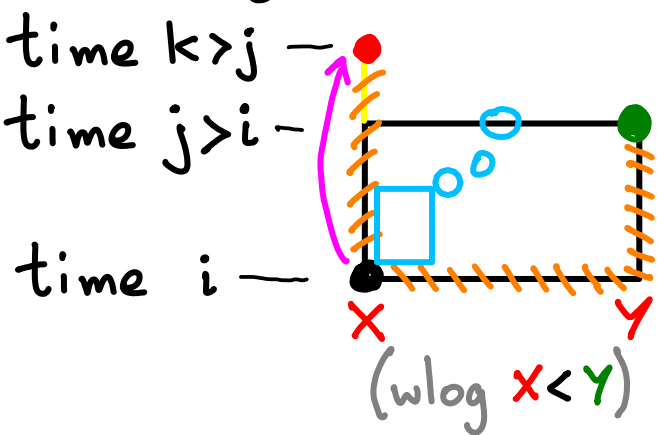
Top side? Inside?



Claim:  
new priorities  
won't violate  
heap property



Proof by contradiction: suppose  $\exists$  edge  $x \rightarrow y$  s.t.  $\underbrace{\text{new priority}(x)}_k > \underbrace{\text{priority}(y)}_j$

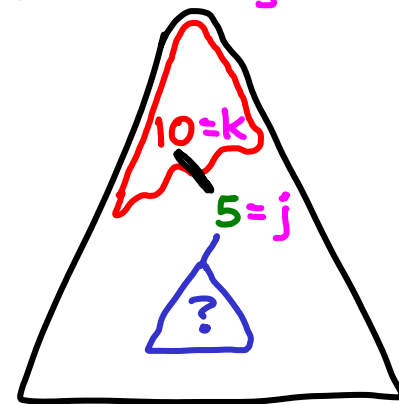


We know  $\underbrace{\text{priority}(y)}_j > \underbrace{\text{old priority}(x)}_i$   
 $\hookrightarrow$  so left & right sides of box are empty  
 What about bottom side?

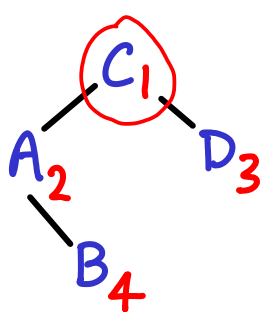
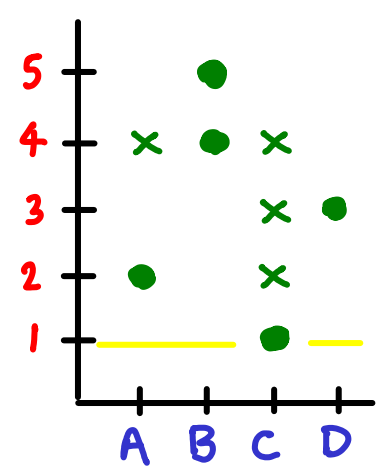
Would need  $x < \text{key} < y$  but then...

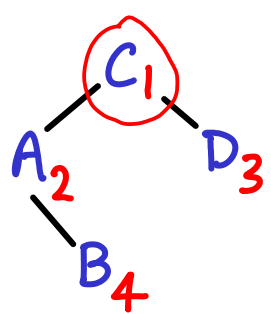
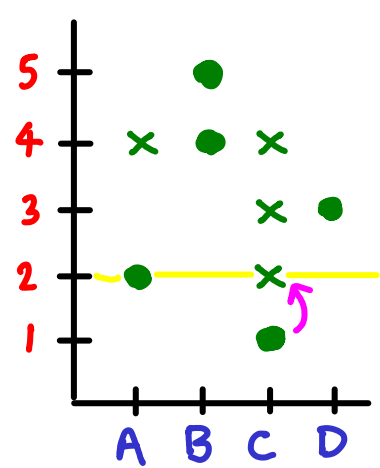
...key is in left subtree of  $y$ , so (unchanged) priority  $\geq j$  ( $> i$ )

$\hookrightarrow$  so bottom side is empty.

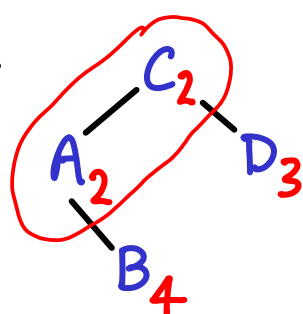


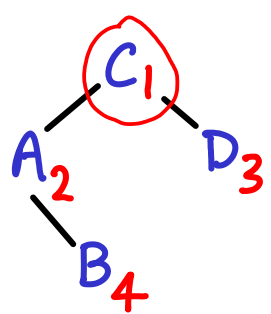
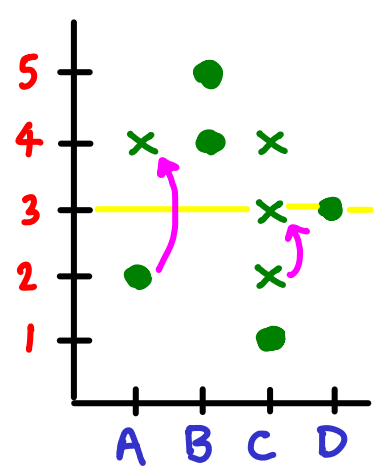
Now, if we place a point on top side, or inside, we will get an empty rectangle  $\square$



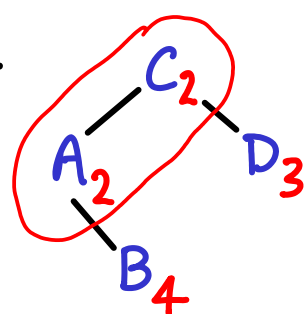


$C \rightarrow 2$

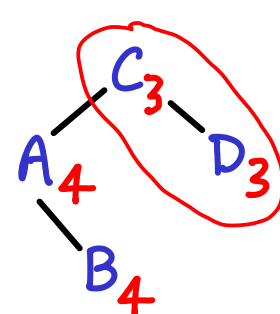


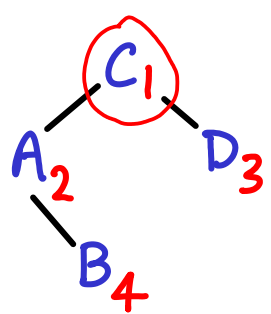
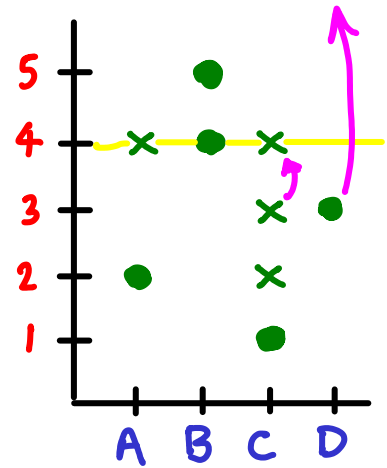


$C \rightarrow 2$

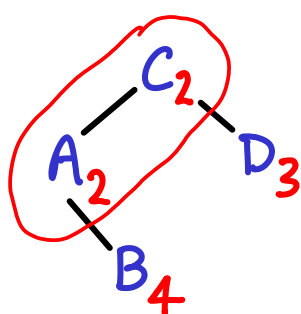


$C \rightarrow 3$   
 $A \rightarrow 4$

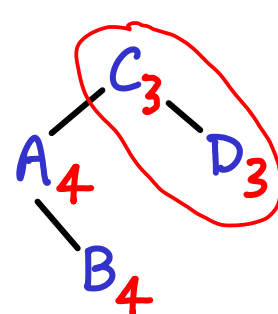




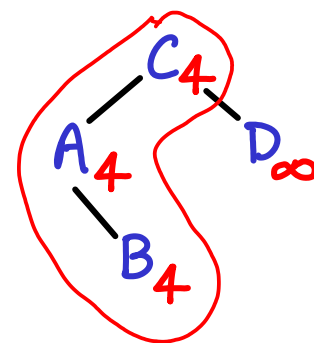
$C \rightarrow 2$

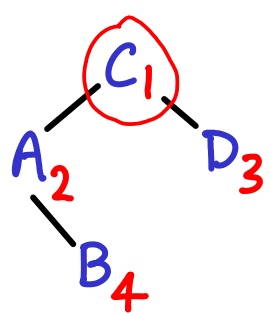
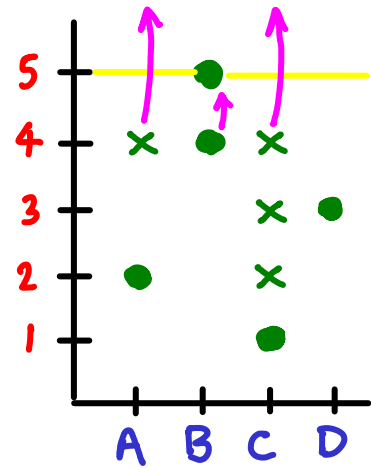


$C \rightarrow 3$   
 $A \rightarrow 4$

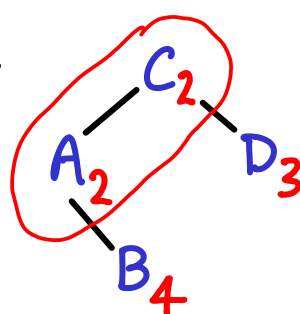


$C \rightarrow 4$   
 $D \rightarrow \infty$

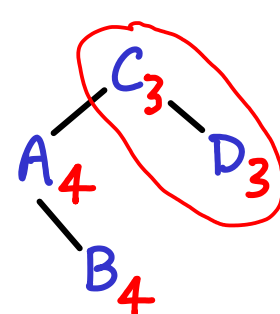




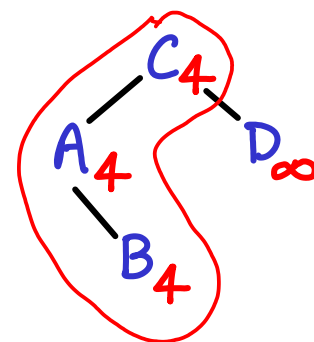
$C \rightarrow 2$



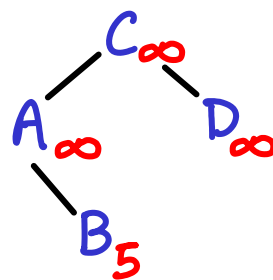
$C \rightarrow 3$   
 $A \rightarrow 4$

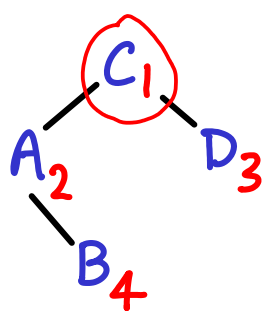
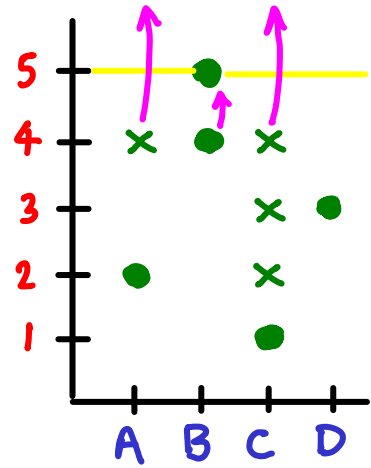


$C \rightarrow 4$   
 $D \rightarrow \infty$

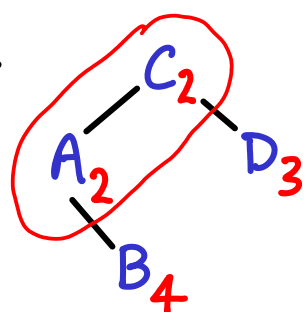


$A, C \rightarrow \infty$   
 $B \rightarrow 5$

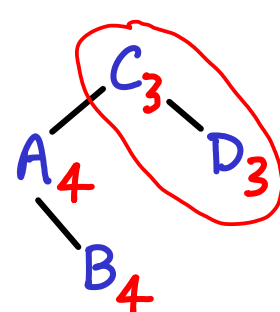




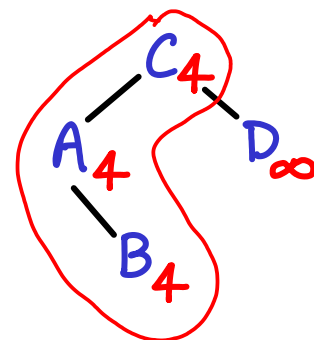
$C \rightarrow 2$



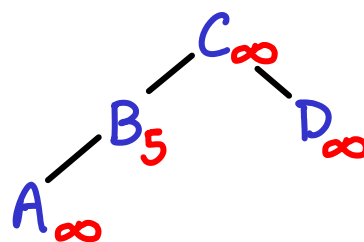
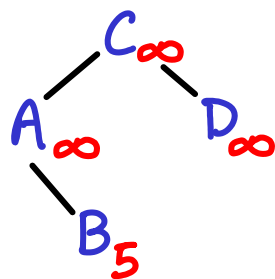
$C \rightarrow 3$   
 $A \rightarrow 4$



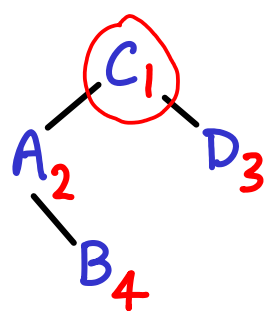
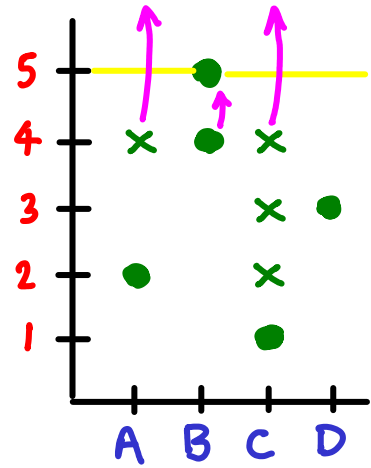
$C \rightarrow 4$   
 $D \rightarrow \infty$



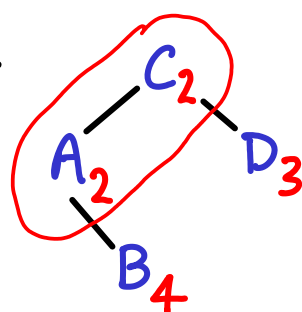
$A, C \rightarrow \infty$   
 $B \rightarrow 5$



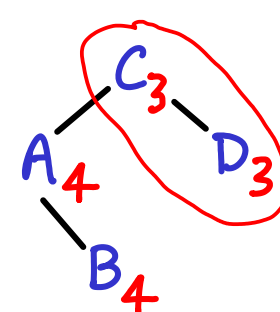




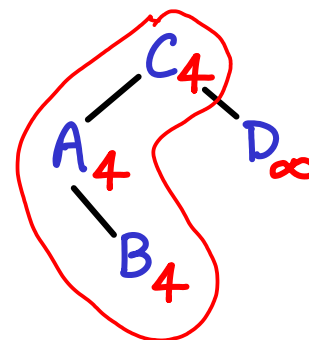
$C \rightarrow 2$



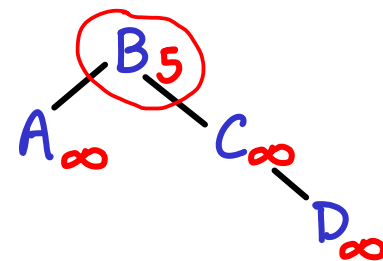
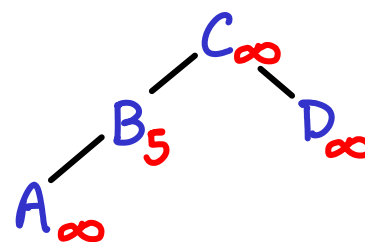
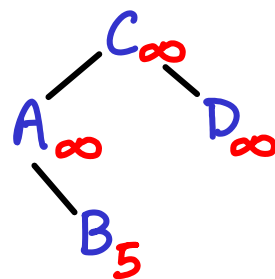
$C \rightarrow 3$   
 $A \rightarrow 4$

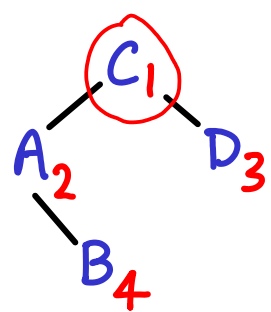
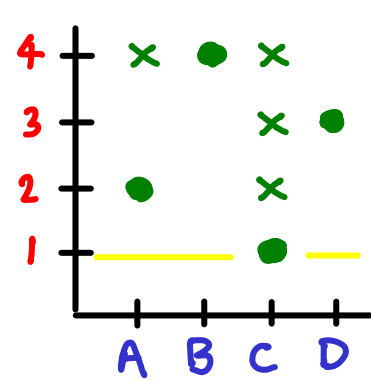


$C \rightarrow 4$   
 $D \rightarrow \infty$

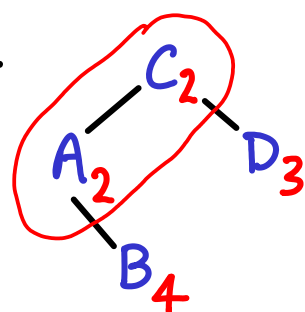


$A, C \rightarrow \infty$   
 $B \rightarrow 5$



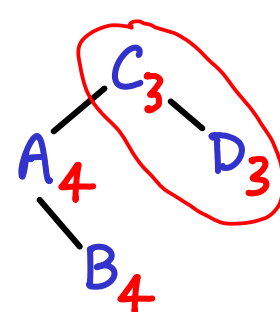


$C \rightarrow 2$



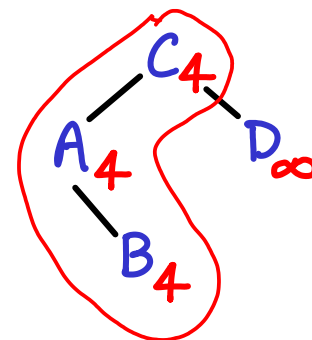
$C \rightarrow 3$

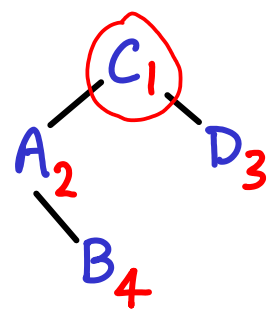
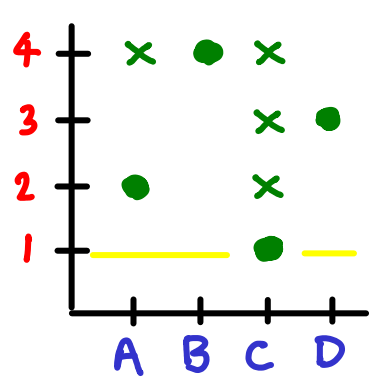
$A \rightarrow 4$



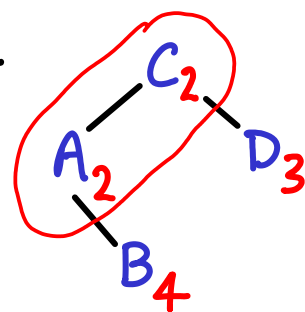
$C \rightarrow 4$

$D \rightarrow \infty$

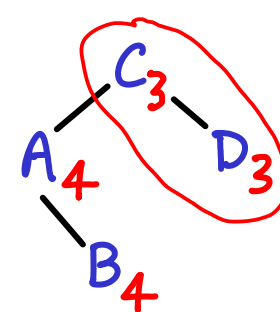




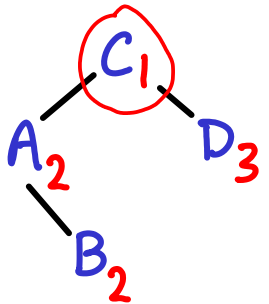
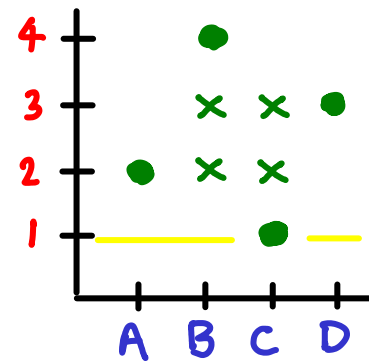
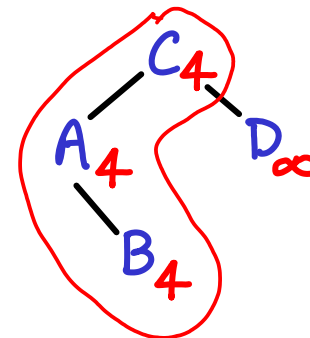
$C \rightarrow 2$

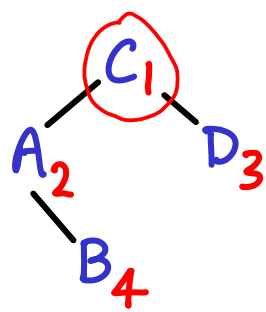
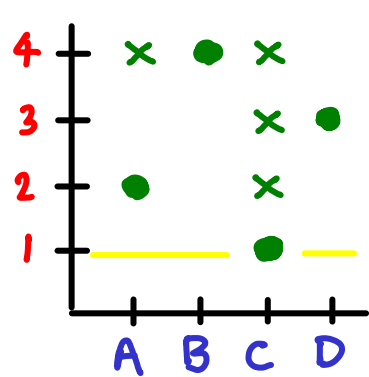


$C \rightarrow 3$   
 $A \rightarrow 4$

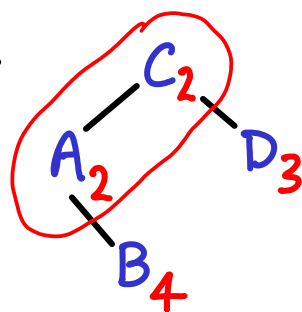


$C \rightarrow 4$   
 $D \rightarrow \infty$

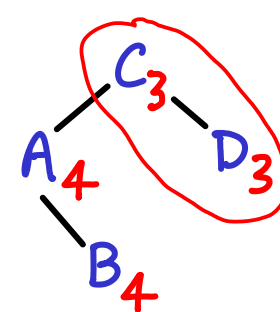




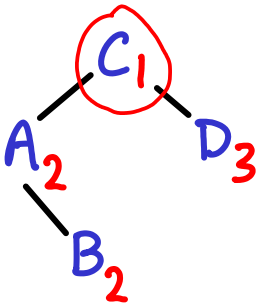
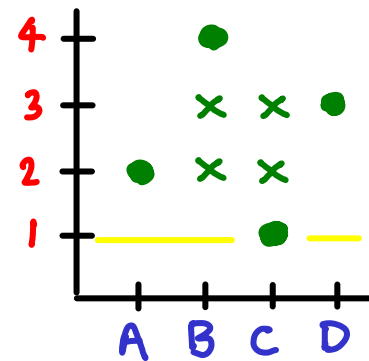
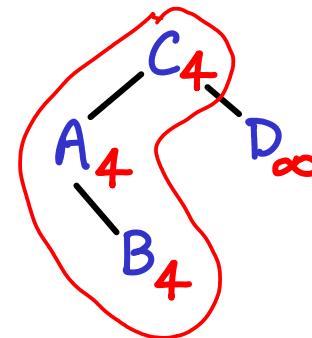
$C \rightarrow 2$



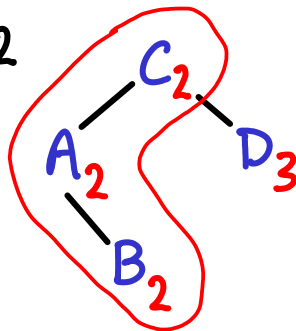
$C \rightarrow 3$   
 $A \rightarrow 4$

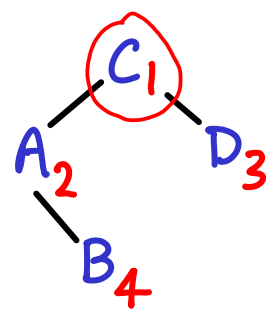
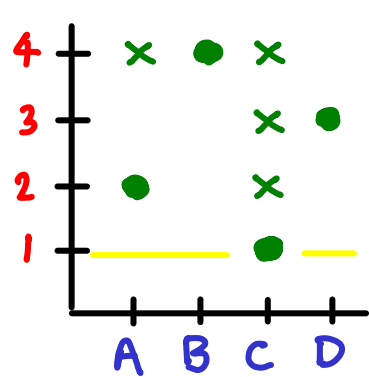


$C \rightarrow 4$   
 $D \rightarrow \infty$

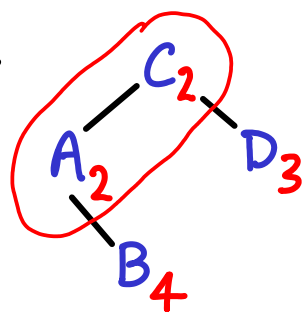


$C \rightarrow 2$

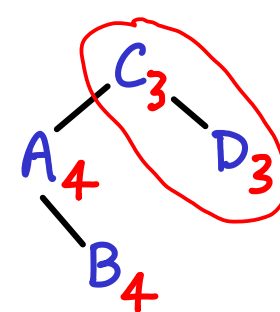




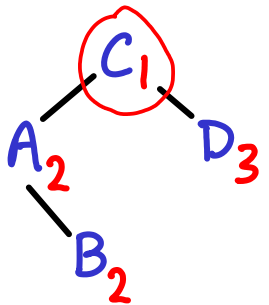
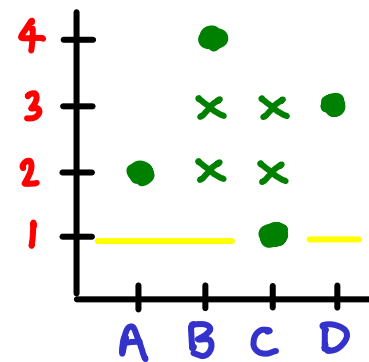
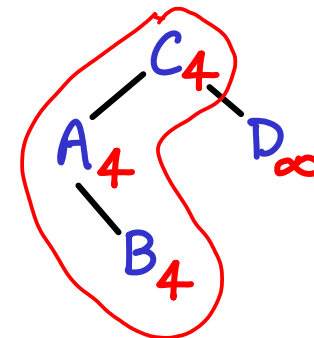
$C \rightarrow 2$



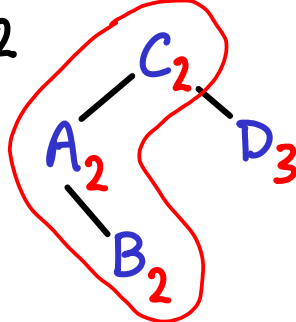
$C \rightarrow 3$   
 $A \rightarrow 4$



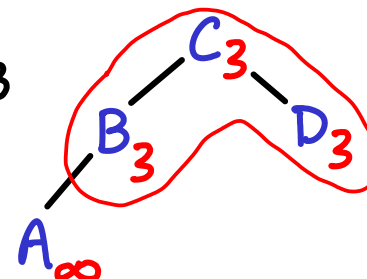
$C \rightarrow 4$   
 $D \rightarrow \infty$

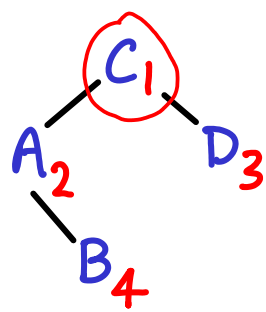
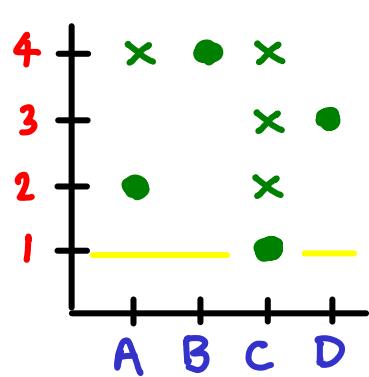


$C \rightarrow 2$

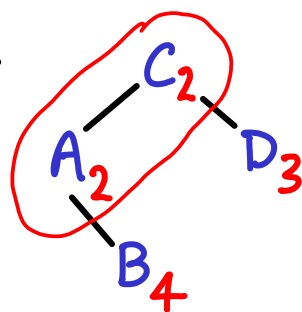


$A \rightarrow \infty$   
 $B, C \rightarrow 3$

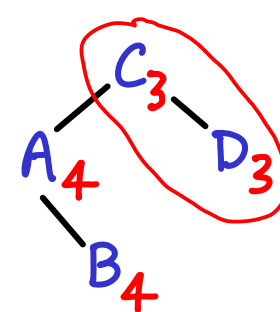




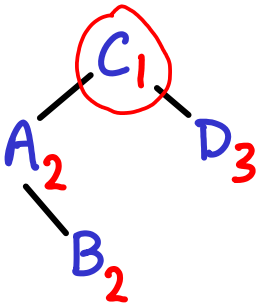
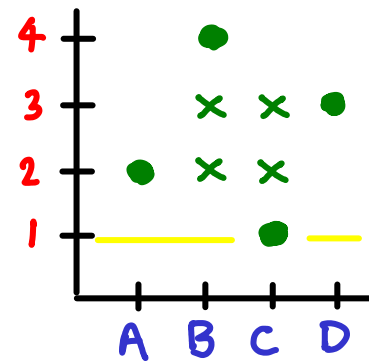
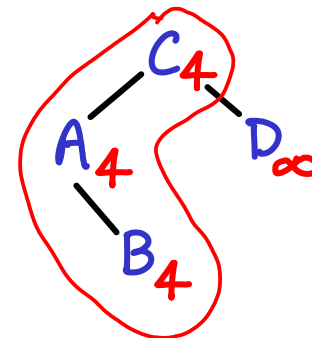
$C \rightarrow 2$



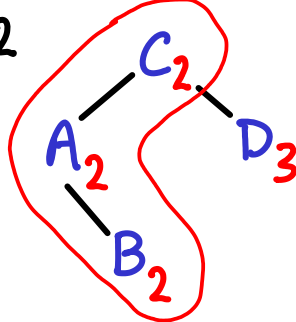
$C \rightarrow 3$   
 $A \rightarrow 4$



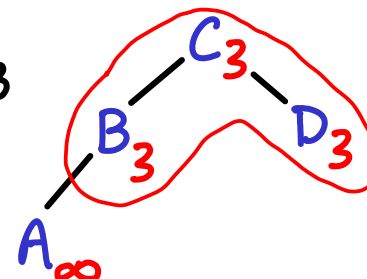
$C \rightarrow 4$   
 $D \rightarrow \infty$



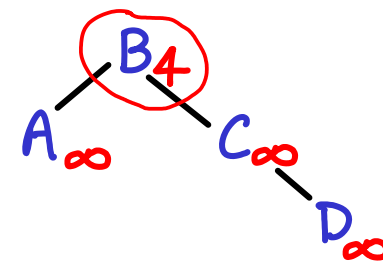
$C \rightarrow 2$

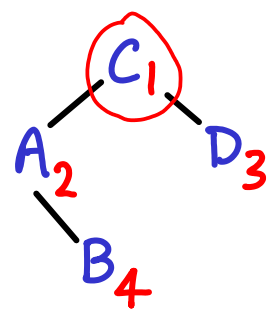
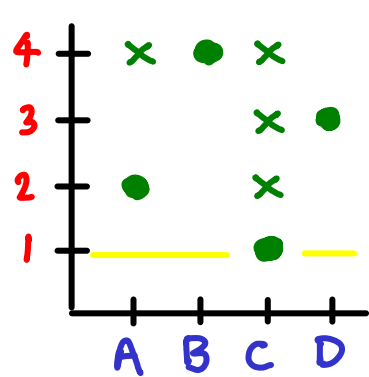


$A \rightarrow \infty$   
 $B, C \rightarrow 3$

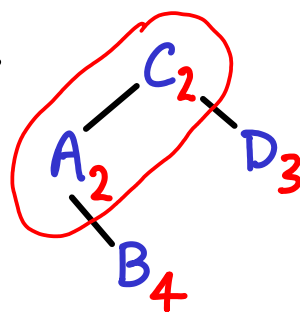


$C, D \rightarrow \infty$   
 $B \rightarrow 4$

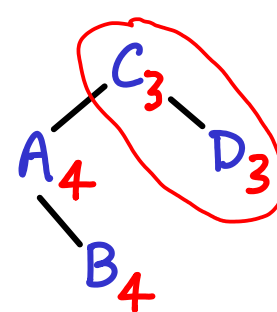




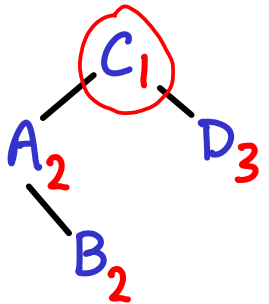
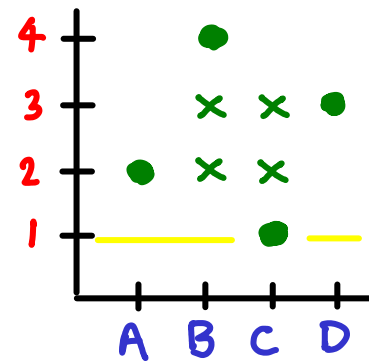
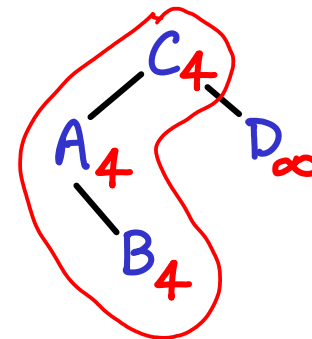
$C \rightarrow 2$



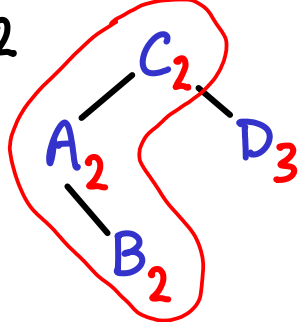
$C \rightarrow 3$   
 $A \rightarrow 4$



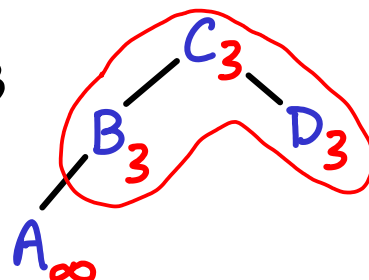
$C \rightarrow 4$   
 $D \rightarrow \infty$



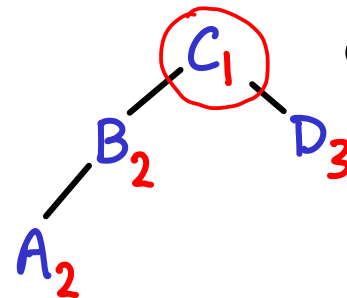
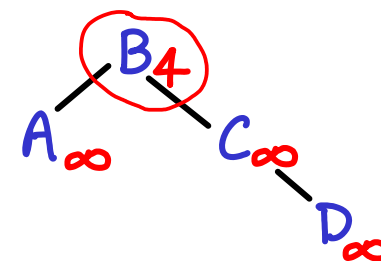
$C \rightarrow 2$



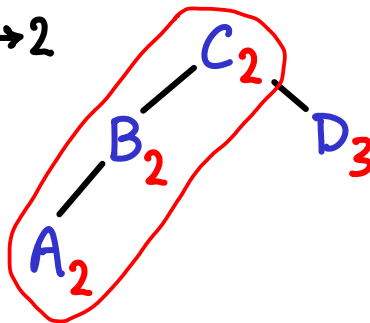
$A \rightarrow \infty$   
 $B, C \rightarrow 3$



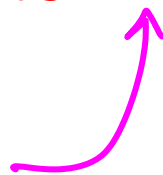
$C, D \rightarrow \infty$   
 $B \rightarrow 4$



$C \rightarrow 2$



$A \rightarrow \infty$   
 $B, C \rightarrow 3$



## Conclusion so far:

Every BST op sequence can be drawn as a special grid pattern  
and every valid grid pattern can be translated into a sequence of BST ops



# Conclusion so far:

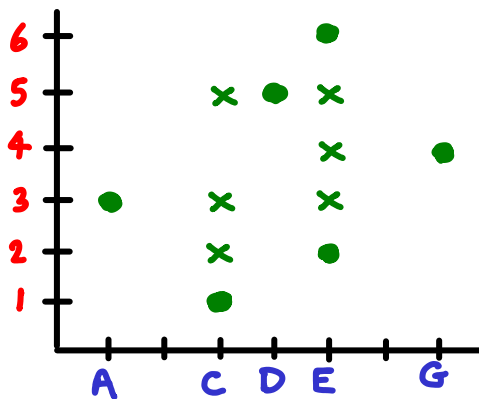
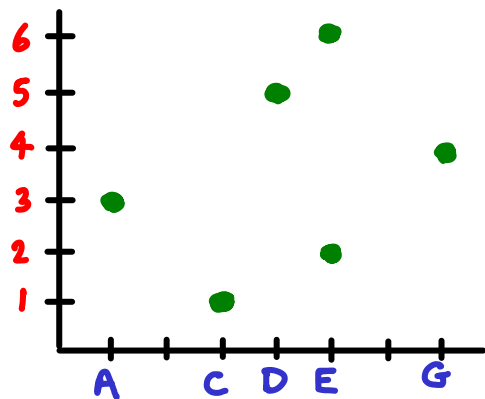
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therefore

BST optimality (when we can modify the tree)

is related to

minimizing #added points to make a given grid pattern valid



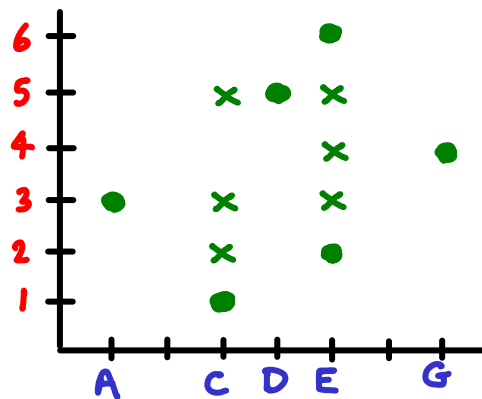
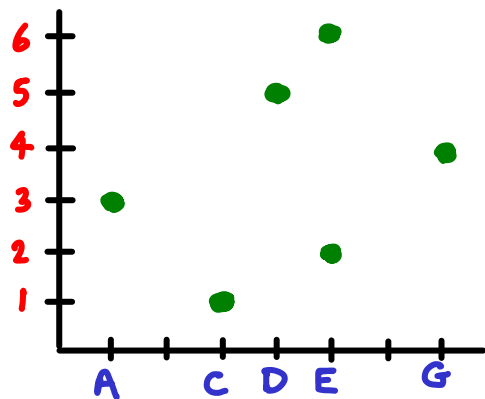
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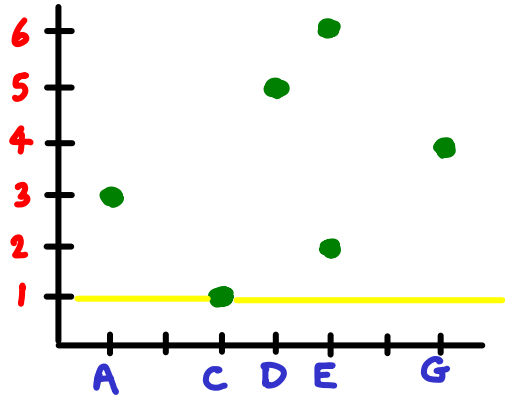
↪ minimizing #added points to make a given grid pattern valid



"Arboraly Satisfied Set"

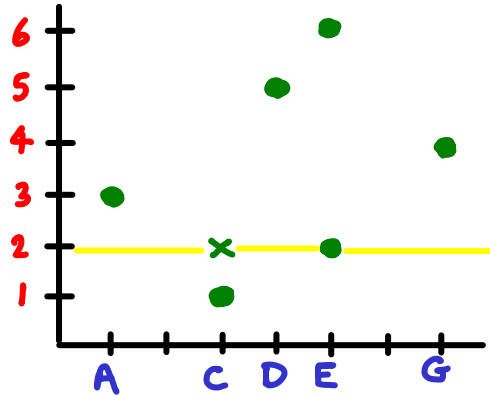
Greedy algorithm (online: doesn't even need to know sequence)

→ Sweep up, add points only when necessary



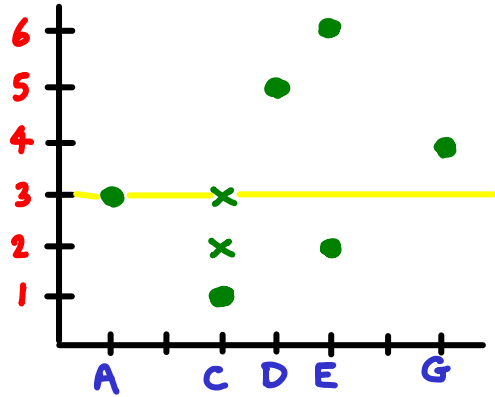
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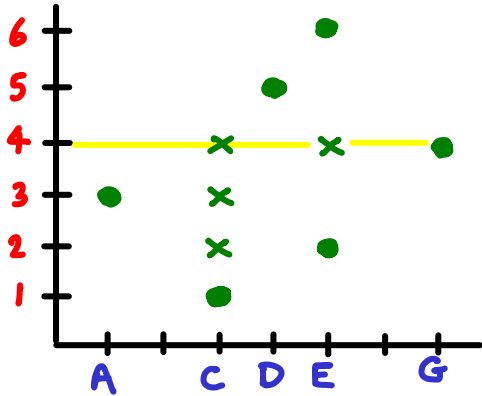
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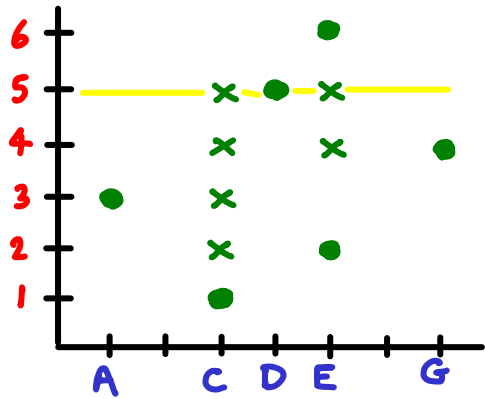
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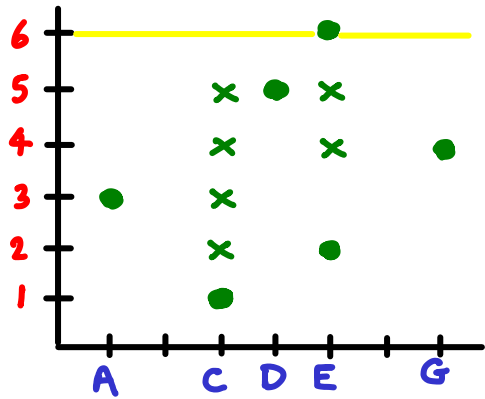
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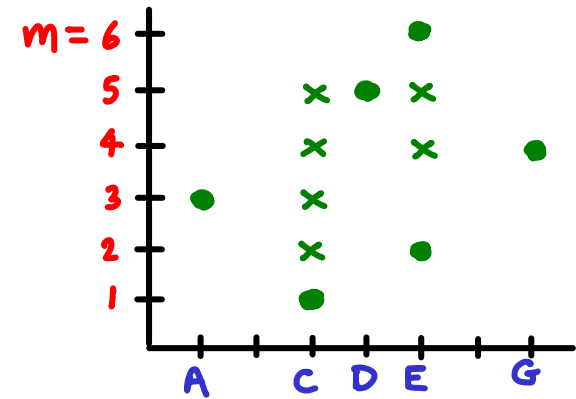
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Greedy algorithm (online: doesn't even need to know sequence)

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Conjectured  $O(OPT)$  or  $OPT + O(m)$

$OPT$ : min #steps possible, with knowledge of sequence

