

Amortized Analysis

15-750
1/23/19

Trick: Add an artificial cost per operation!

Def $\Phi: \text{state} \rightarrow \mathbb{R}$ a potential

Def unit-cost = OP_i (unit-cost \approx real cost)

Def Amortized Cost = unit-cost + potential change

$$\begin{aligned}\sum AC_i &= \sum [OP_i + (\Phi_i - \Phi_{i-1})] = \sum OP_i + \Phi_n - \Phi_0 \\ &= TC + \Delta\Phi\end{aligned}$$

if $\Delta\Phi \geq 0$ then $TC \leq \sum AC_i$

Let $AC = \max_i AC_i$ then

$$TC \leq n \cdot AC \text{ if } \Delta\Phi \geq 0$$

Fibonacci Heaps

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Goal: Modify Binomial Heaps so that
 $O(1)$ Amortized decreaseKey

Back to Binomial Heaps

Lazy Meld \equiv Only link during delete min.

Claim AC is still $O(\log n)$

using $\overline{P}(A) = \# \text{ of trees}$

Idea decreaseKey(k, A) 1) disconnect k from its tree.
2) add subtree to trees of A .

Prob: Trees will become unbalanced!

$O(1)$ AC cost for DecreaseKey

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Solution Each nonroot node can have at most one missing child.

Def $\text{Mark}(k)$ if k has a missing child
& k is not a root

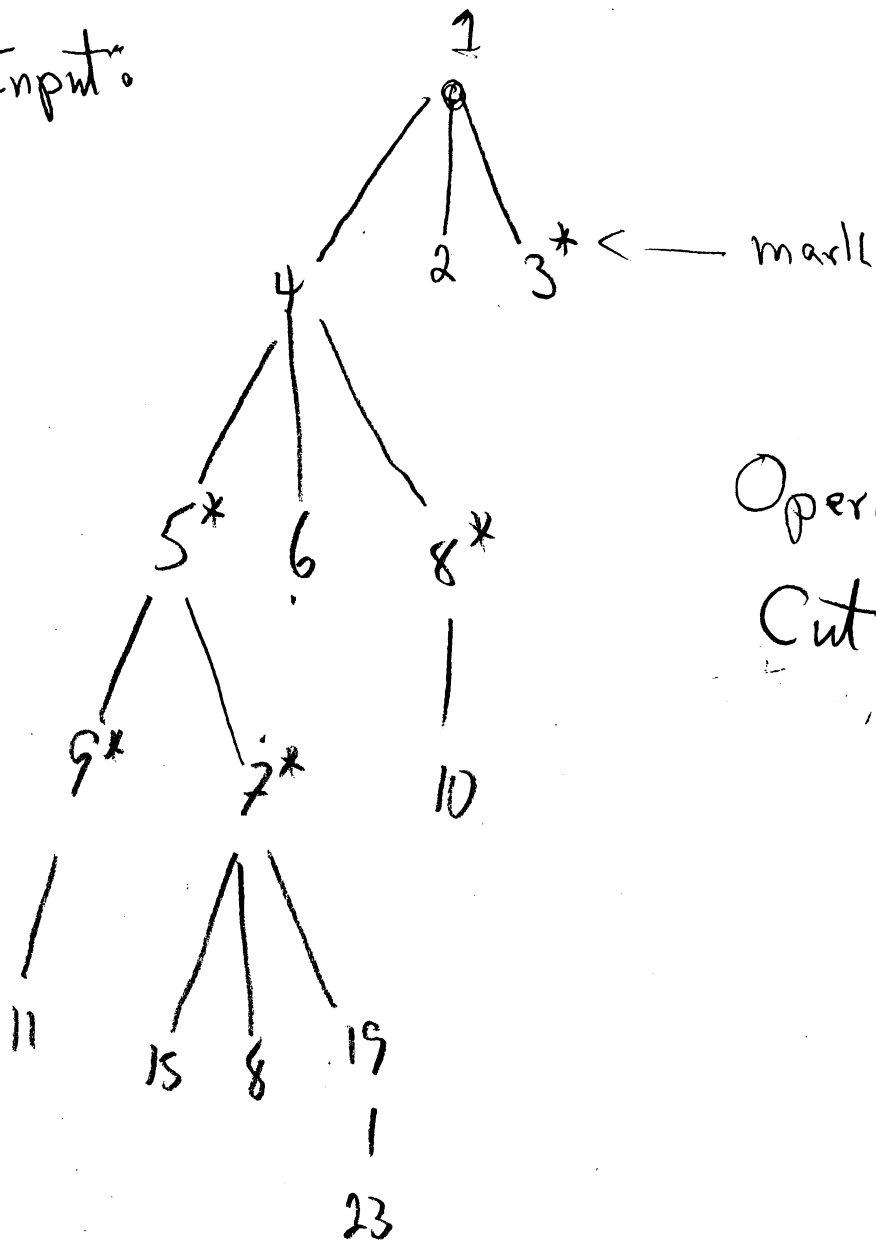
Def $\text{rank}(T) \equiv \# \text{children of root.}$

Cut(k) k a node in T

- 1) Return if k is a root
- 2) Let $p = \text{Parent}(k)$
- 3) Remove subtree rooted at k
 - a) move subtree to list of trees.
 - b) unmark k .
 - c) decrement rank of p .
 - d) If p marked then $\text{Cut}(p)$
else mark p .

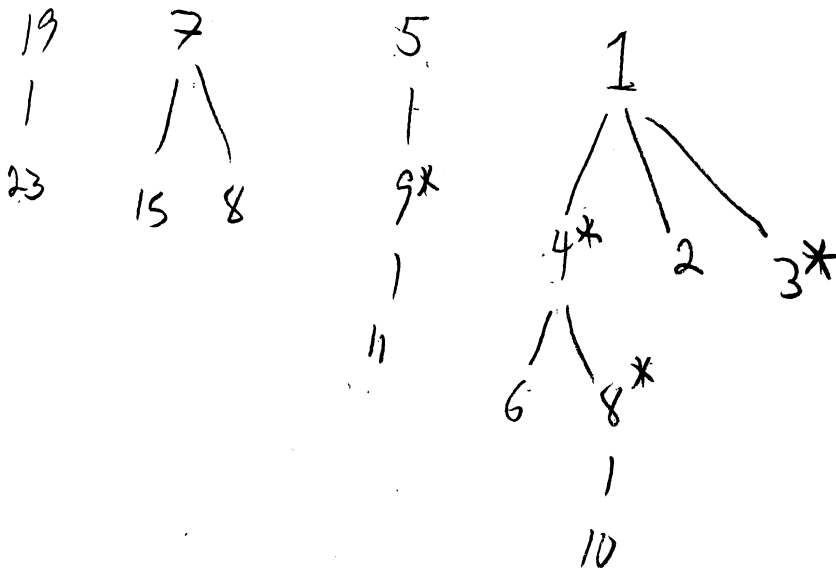
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Input:



Operation :
Cut (19)

Output:



AC of decreaseKey

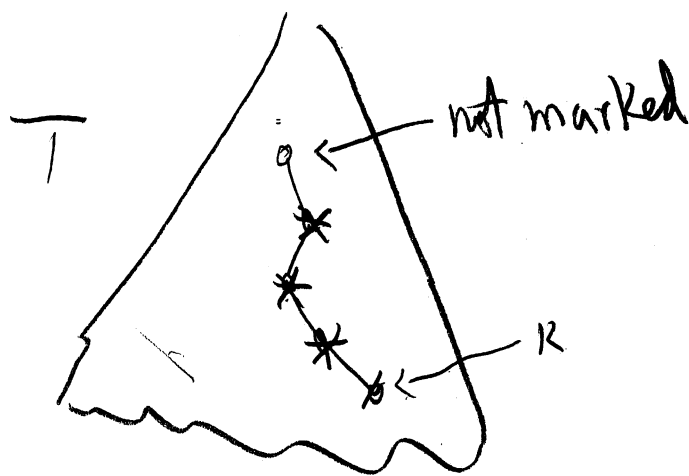
Potential Method: $\Phi(A) = \# \text{trees} + 2(\# \text{marks})$

Token Method: 1) token on each root

2) 2 tokens on each marked node

Claim Amortized Cost of Cut ≤ 4

pf consider cut(x)



Unit-cost $\equiv \# \text{new trees formed}$ eg 4
 $\leq \# \text{nodes unmarked} + 1$

$$\Delta \overline{E} = \# \text{newtrees} + 2 \left(1 - \underset{\substack{\uparrow \\ \text{new mark}}}{\# \text{unmarked}} \right)$$

$$\leq \# \text{newtrees} + 2(1 - (\# \text{newtrees} - 1))$$

$$\leq -\# \text{newtrees} + 4$$

$$AC \leq \# \text{newtrees} - \# \text{newtrees} + 4 = 4$$

Fibonacci-Delete min

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Fib-Delete min \equiv Binomial-Delete min

Fib-Delete min ($\tilde{A} = T_1, \dots, T_k$)

- 1) Link tree until at most one per rank.
- 2) Find tree whose root has min priority
- 3) remove root and add its subtrees to \tilde{A} .

Note We need # tree at step 2) $= O(\log n)$.

i.e. we need the size of a tree to be exponential in its rank.

Def The n th Fibonacci number

$$F_0 = 0, F_1 = 1 \text{ \& } F_{n+1} = F_n + F_{n-1}$$

Def Let $S_n \equiv$ min size rank n Fib Tree

Thm $F_{n+2} \leq S_n$ ($F_{n+2} = S_n$)

$$\begin{aligned} S_0 &= 1 \\ F_2 &= 1 \end{aligned}$$

$$\begin{aligned} S_1 &= 2 \\ F_3 &= 2 \end{aligned}$$

As a warmup let's show that $S_n \leq F_{n+2}$ ⁷

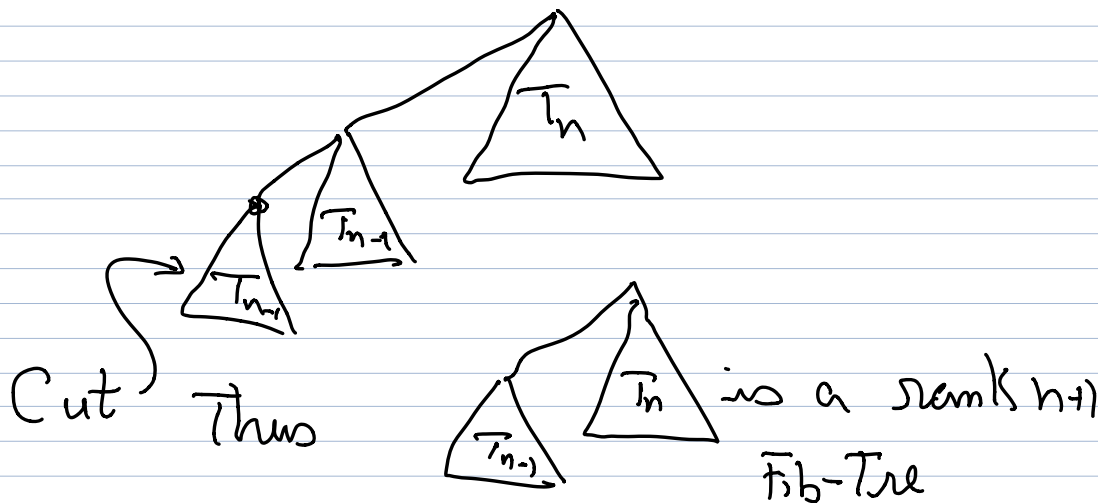
Base case is OK.

Suppose $S_{n-1} \leq F_{n+1}$ & $S_n \leq F_{n+2}$

Let T_n be a min size rank n tree

Consider $T = \text{link}(T_{n-1}, T_{n-1})$

$\bar{T} = \text{link}(T, T_n)$



$$S_{n+1} \leq \text{Size} \leq F_{n+1} + F_{n+2} = F_{n+3}$$

Size Lower Bounds for Fibonacci Trees

There are many different proofs the the size is bound below by the Fibonacci numbers. Here is yet another one.

Claim: All Fibonacci trees can be generated by the following set of rules.

- 1) The singleton tree is a Fib-tree
- 2) The link of 2 Fib-trees is a Fib-tree.
The two tree must have the same rank and the rank of the new tree is one more than the children.
- 3) The removal of any child from the root generates a Fib-tree.
The new rank is one less.
- 4) The removal of a child from an unmarked non-root parent is a Fib-tree. The parent is now marked.

Define the Fibonacci numbers to be

$$F_0 = 0 \quad F_1 = 1 \quad F_{(n+1)} = F_n + F_{(n-1)}$$

Claim: $F_{(n+2)} \leq | \text{Fib-tree of rank } n |$

Proof:

The proof is by induction on the rank of a tree T .

If the rank is 0 or 1 we are done by inspection. Let T be a minimal size tree of rank $n+1$ generated by the rules above.

Consider a sequence S of operation generating T .

Let $T' = \text{Link}(T_1, T_2)$ be the last Link in the sequence, T_2 being linked to T_1 .

Assume that the rank of T' is of minimum size over all sequences generating T . In this case we claim that there will be no rule-3's after T' .

Proof of subclaim:

The proof is by contradiction.

Suppose there was a rule-3 after constructing T' .

There are two case:

- 1) If we remove T_2 from the tree then we can find a new sequence which does not use this link at all.
- 2) Consider the case of removing a child of T_1 after T' .
Since T is of minimum size we will remove a child of T_2

after T' . Thus we could have removed these two children before the link and then linked them. This contradicts our assumption that the rank of T' was minimum.

Thus we now know that the rank of T_1 and T_2 are both n . WLOG all the rule-4s can be moved before T' except for the removal of a child of T_2 . Let T'_2 be the tree of rank $n-1$ with one child of the root removed.

$$|T| = |T_1| + |T'_2| \geq F_{n+2} + F_{n+1} = F_{n+3}.$$

QED

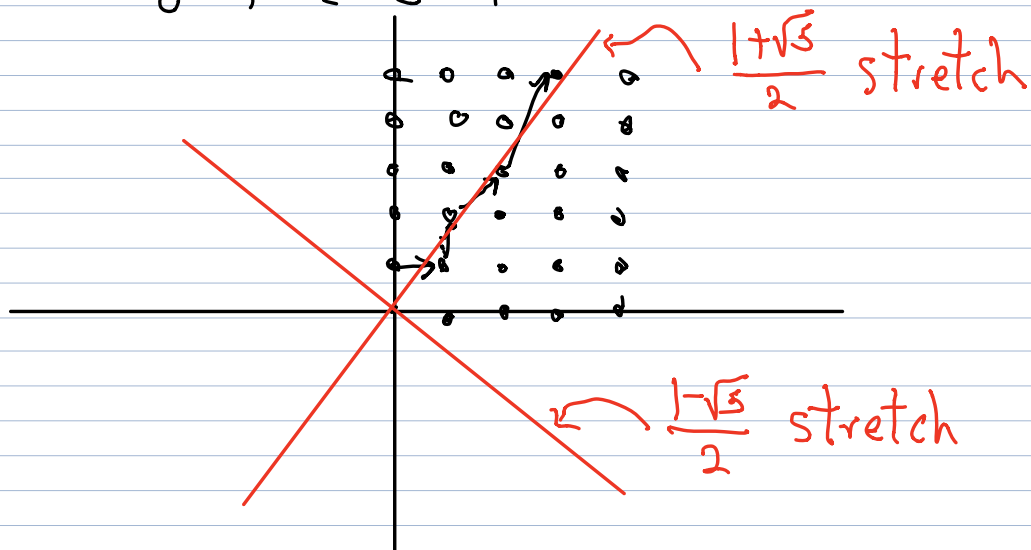
Low bounding F_n

Lets view Fibonacci as
a matrix-vector product.

$$\text{Let } \begin{pmatrix} 0 & 1 \\ 1 & 1 \end{pmatrix} \begin{pmatrix} f_{n-1} \\ f_n \end{pmatrix} = \begin{pmatrix} f_n \\ f_{n+1} \end{pmatrix} \quad \begin{matrix} f_0 = 0 \\ f_1 = 1 \end{matrix}$$

$$\text{Let } P_i = \begin{pmatrix} f_i \\ f_{i+1} \end{pmatrix}$$

0	1	1	2	3	5
1	1	2	3	5	8
P_0	P_1	P_2	P_3	P_4	P_5



$$\begin{pmatrix} 0 & 1 \\ 1 & 1 \end{pmatrix}^n \begin{pmatrix} 0 \\ 1 \end{pmatrix} = \begin{pmatrix} f_n \\ f_{n+1} \end{pmatrix}$$

What are the eigenvalues of $F = \begin{pmatrix} 0 & 1 \\ 1 & 1 \end{pmatrix}$?

$$\text{roots}(\det(\lambda I - F)) = \text{roots}\left(\det \begin{pmatrix} \lambda & -1 \\ -1 & \lambda - 1 \end{pmatrix}\right)$$

$$\text{roots}(\lambda^2 - \lambda - 1) \quad \lambda = \frac{1 \pm \sqrt{5}}{2}$$

$$\text{Spectral Thm} \Rightarrow f_n \approx \left(\frac{1+\sqrt{5}}{2}\right)^n$$