

§3 Amortized Analysis

Motivating example: Repeated binary increment, #bit flips when counting to n ? (+decrement?)

Definition (amortized cost):

Let $\mathcal{A}.\text{Method}_1, \dots, \mathcal{A}.\text{Method}_k$ denote an implementation of an abstract data type.

Let $T(n)$ denote the worst-case cost of any sequence of n calls of \mathcal{A} 's methods.

Then amortized cost of \mathcal{A} is $T(n)/n$.

- Don't confuse:**
- amortized cost
 - average-case cost
 - expected cost

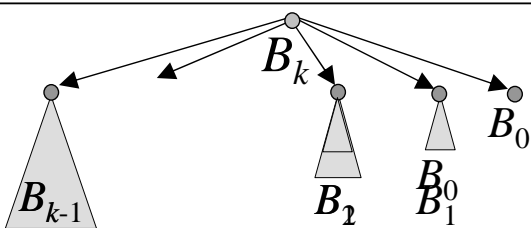
Potential method of analysis:

Let c_j denote cost of j -th operation,

$\Phi_j := \#1\text{s in counter after } j\text{-th op.} \Leftrightarrow \text{before } (j+1)\text{-st op.}$

$$\Rightarrow c_j + \Phi_j - \Phi_{j-1} \leq 2, \quad \Phi_0 = 0, \Phi_j \geq 0 \quad \sum_{1 \leq j \leq n} c_j/n \leq 2 - \Phi_n/n$$

§3 Relaxed Binomial Trees



A relaxed Binomial Tree of order $k \geq 1$ consists of a root with k children, the j^{th} being a relaxed binom. tree of order $\geq j-2$

Lemma: A relaxed binomial tree of order k has $\geq F_{k+2} \geq \Omega(1.6^k)$ nodes

Merge

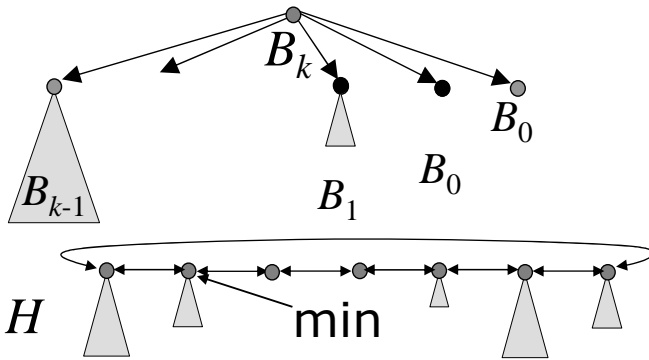
Prune

$$\sum_{j>0} j \cdot 2^j = 2 : \quad \sum_{j>0} j \cdot q^j = q \cdot \partial_q \sum_{j \geq 0} q^j = q \cdot \partial_q 1/(1-q) = q/(1-q)^2$$

$\phi := (1 + \sqrt{5})/2 \approx 1.618$
Fibonacci no.s F_k

$$1 + F_1 + F_2 + \dots + F_k = F_{k+2} \geq \phi^k$$

§3 Fibonacci Heaps

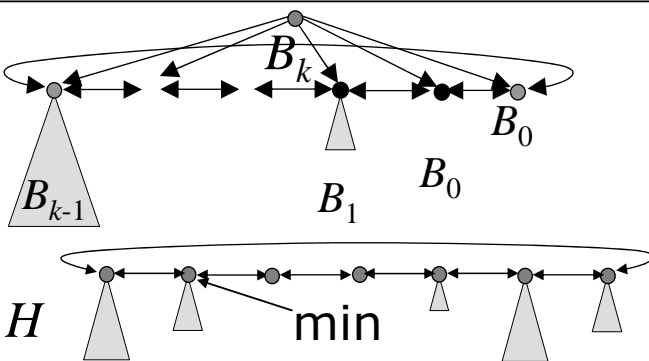


A relaxed Binomial Tree of order $k \geq 1$ consists of a root with k children, the j^{th} being a relaxed binom.tree of order $\geq j-2$

Lemma: A relaxed binomial tree of n nodes has order $\leq O(\log n)$ | A Fibonacci Heap H is a list of t heap-ordered relaxed binomial trees with pointer to the min.

- Extract min.key: $O(\log n)$ amortized cost
- Decrease key: $O(1)$
- Merge two Fib.heaps: $O(1)$
- Insert element: $O(1)$
- Create 1-elem.Fib.heap: $O(1)$

§3 Extract Minimum



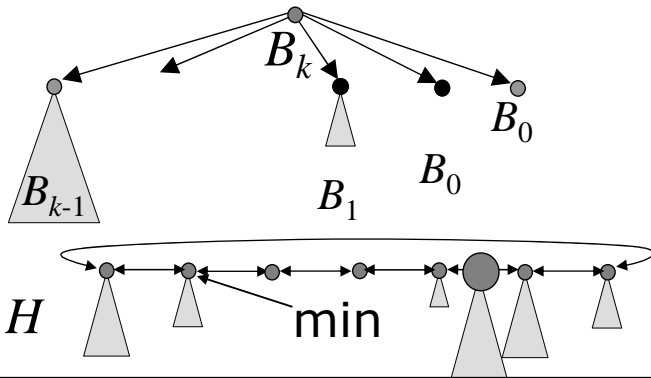
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Lemma: A relaxed binomial tree of n nodes has order $\leq O(\log n)$ | A Fibonacci Heap H is a list of t heap-ordered relaxed binomial trees with pointer to the min.

- Extract min.key:** $O(\log n)$ amortized cost
- Delete target of min.ptr
- Merge two Fibonacci heaps.
- Consolidate s.t. each tree order occurs only once!

$c_j + \Phi_j - \Phi_{j-1} \leq O(\log n), \quad \Phi_0 = 0, \Phi_j \geq 0$ | Potential $\Phi = O(t)$

§3 Decrease Key

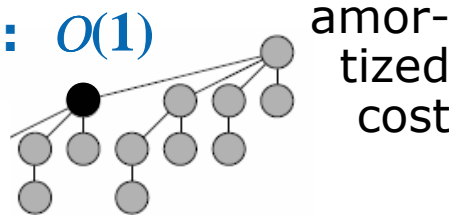


A relaxed Binomial Tree of order $k \geq 1$ consists of a root with k children, the j^{th} being a relaxed binom. tree of order $\geq j-2$

Lemma: A relaxed binomial tree of n nodes has order $\leq O(\log n)$

Decrease key: $O(1)$

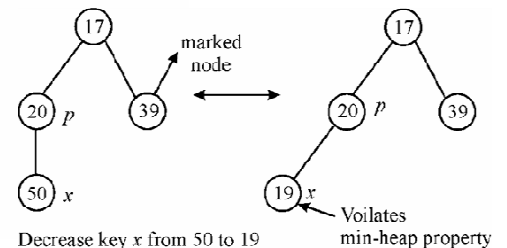
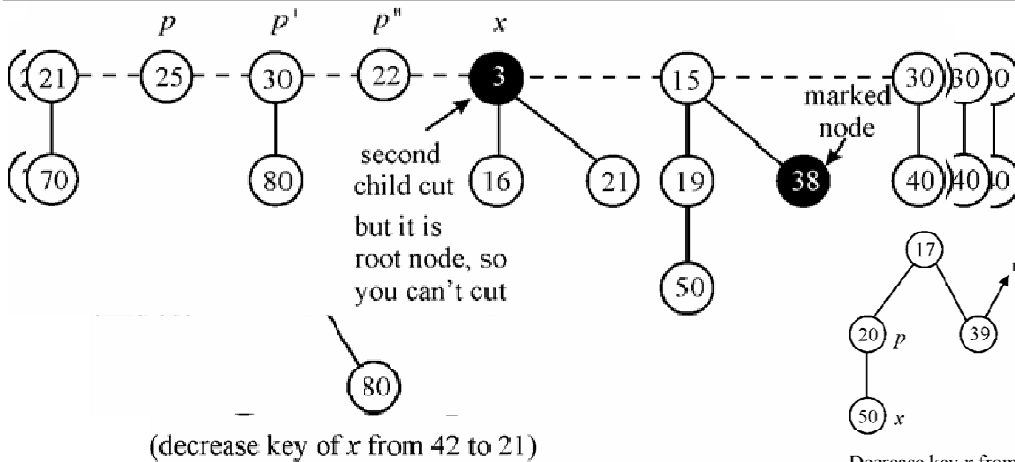
- cut subtree
- **mark** parent
- if already **marked**: reset, cut & cascade



A Fibonacci Heap H is a list of t heap-ordered relaxed binomial trees with pointer to the min.

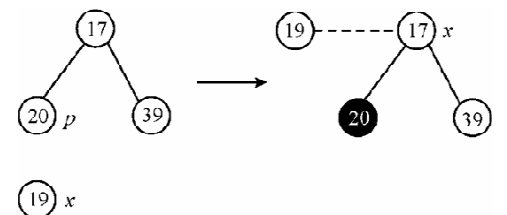
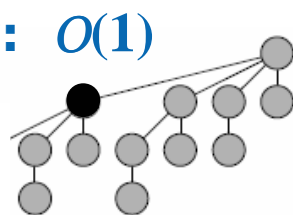
$$c_j + \Phi_j - \Phi_{j-1} \leq O(1), \quad \Phi_0 = 0, \Phi_j \geq 0 \quad \text{Potential } \Phi = O(t + 2m)$$

§3 Cuts, Marks, and Cascading



Decrease key: $O(1)$

- cut subtree
- **mark** parent
- if already **marked**: reset, cut & cascade



$$c_j + \Phi_j - \Phi_{j-1} \leq O(1), \quad \Phi_0 = 0, \Phi_j \geq 0 \quad \text{Potential } \Phi = O(t + 2m)$$