

#### Part (b)

The OFF-LINE-MINIMUM algorithm deals with n INSERT (I) operations  $(\bigcup_{k=1}^{n} I_k)$  and m EXTRACT-MIN (E) operations. To prove that the algorithm is correct, we need to prove that  $\forall j \in \{1, 2, ..., m\}$ , extract[j] contains the key returned by jth E

For i=1, the algorithm considers the entire sequence  $I_1, E, I_2, E, \dots I_m, E, I_{m+1}$ .

It first finds a discrete It first finds a  $j|i \in K_j$ . There can be couple of cases:

- 1. j = m + 1, which means that the element 1 is inserted after the last EXTRACT-MIN, in which case it will NOT be part of the extracted array, since it will never get a chance to be extracted. The algorithm also does nothing  $(j \neq m + 1)$  check on line 3 ensures it), simply proceeds to the next larger element. Since the elements  $\{1,2,\ldots n\}$  are considered in the increasing order (ensured by the for loop in line 1), this element will never be considered again. Hence, this behavior is correct.
- 2.  $j \neq m+1$ , which means that some EXRACT-MIN operation has taken place after this INSERT operation  $I_j$ . 1 being the smallest element in the set S, the immediate E operation  $(j^{th} E)$  must extract this element. The algorithm also correctly assigns  $extracted[j] \leftarrow i$  at line 4, where i = 1

For the 2nd case, after the INSERT operation of the element 1 and the immediate  $(j^{th})$  EXTRACT-MIN is evaluated correctly by the algorithm, the algorithm tries to consider the remaining sequence of operations again, but this time without the particular I and E. This is done by the line 6, which performs  $K_l \leftarrow K_l \cup K_j$  (since the keys in  $K_j$  other than the element i can only be considered for extraction by the following EXTRACT-MINS) and destroys  $K_j$ , since it already found extract[j], namely the key returned by the  $j^{th}$  EXTRACT-MIN.

Therefore, for iterations  $i=2\dots n$  it considers only the sequence of operations  $I_1, E, I_2, E, \dots I_{j-1}, E, I_{j+1}, E, \dots I_m, E, I_{m+1}$ , where l = j+1 in this case (it can be > j + 1 in other cases when j + 1 is already destroyed). Hence after removing the INSERT operation for the element 1 (it's not physically removed, but will never be considered, since i is strictly increasing) and the corresponding extracted[j], the sequence of n INSERT and m EXTRACT-MIN operations get reduced to a different (smaller) sequence of n-1 INSERT and m-1 EXTRACT-MIN operations, hence a smaller subproblem that is exactly similar and on it the algorithm will work for the iterations i = 2 to n.

By applying the same logic for the smaller subproblem with n-1 INSERT an m-1 EXTRACT-MIN operations (consdered by the algorithm steps  $\forall i =$   $2\ldots n$ ), we can divide it into 2 parts again, one for i=2 and the other for still smaller subproblem  $i=3\ldots n$  and argue that the algorithm works correctly for i=2. Continuing in this manner,  $\forall i=k\ldots n$ , each time we can divide the current problem into another subproblem with strictly non-increasing size in the sequence of operations (handled by the algorithm in iterations  $i=k+1\ldots n$ ) and prove the correctness of the  $k^{th}$  iteration. But i is increasing, hence we are done when we have i=n.

#### Part (c)

## Implementation

- Start with each element as a singleton set in a disjoint set forest, with total n elements.
- In order to form sets K<sub>j</sub>, j = 1...m+1 (in the worst case last n − 1 of them possibly empty), n − 1 UNIONs in the worst case.
- Line 2 basically then reduces to j ← FIND-SET(i) and we have n such
  operations.
- Line 5 reduces to l ← next(j), operation which is executed for n times in the worst case.
- Line 6 reduces to l ← LINK(j, l) operation which is also executed for n times in the worst case.

Hence, total number of operations = mt = O(n)

 $\Rightarrow$  amortized time =  $O(m/\log^* n) = O(n\log^*(n))$ 

or to provide a tighter bound, the amortized time =  $O(n\alpha(n))$ , where  $\alpha$  is the inverse of the Ackerman function.

### Problem 2 Solution

As it can be seen from the figure 1, starting with  $2^n + 1$  INSERT operations, followed by an EXTRACT-MIN (with CONSOLIDATE) operations, followed by  $2^n - 1$  DELETE operations can create a Fibonacci Heap of height n, with n nodes (a chain).

Note that DELETE operation uses DECREASE-KEY + EXTRACT-MIN, where none of the DECREASE-KEY operation here can have cascade-cut, since every non-root node will have its child deleted only once.

# Problem 3 Solution

Part (a)

Algorithm 1 Algorithm FIB-HEAP-CHANGE-KEY

FIB-HEAP-CHANGE-KEY(H,x,k)

- call FIB-HEAP-DECREASE-KEY(H,x,k). 1: if k < key[x] then
- 3: else if k == key[x] then
- return {do nothing}.
- 5: else {increase key}
- for each child y of x do
- call CUT(H, y, x). 7:
- 8: end for
- $key[x] \leftarrow k$ . 9:
- call CASCADING CUT(H, x).
- 11: end if
  - Lines 1-2 have an amortized cost of O(1), so have lines 3-4 (comparison cost).
  - Let's analyze the amortized cost for lines 5 10, i.e., for the increase-key operation.

By the potential method, potential before increase-key = t(H) + 2m(H).

Line 7 can increase the number of trees t(H) by at most D(n) (maximum degree of a node in the n-node Fibonacci heap =  $O(\lg n)$ ).

Also, if we assume that the number of cascading cut recursive calls line 10 is c, then total decrease in number of marked nodes = O(c), where the same call produces O(c) additional trees, where c is a constant. Hence the potential after increase-key = (t(H) + D(n) + O(c)) + 2(m(H) - O(c)).

Hence, the change in potential is at most

$$= (t(H) + D(n) + O(c)) + 2(m(H) - O(c))) - (t(H) + 2m(H))$$
  
=  $D(n) - O(c) = O(\lg n)$ .

Total amortized time for FIB-HEAP-CHANGE-KEY = O(lg n).

# Part (b)

Deleting a node  $\Rightarrow$  Decrease the corresponding key to  $-\infty$ , followed by Extract-Min, hence has an amortized cost of  $O(1) + O(\lg n) = O(\lg n)$ .

