

# Data Structures and Algorithms

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## ► Questions (Tu Cao)

## Ex. (8.6 Lower bound on merging sorted lists (c)(d))

- ▶ Show that if two elements are *consecutive* in the sorted order and from *different lists*, then they must be compared.
- ▶ Show a *lower bound* of  $2n - 1$  comparisons for merging two sorted lists.



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$$A' = (a_1, \dots, a_{s-1}, b_t, a_{s+1}, \dots, a_n)$$

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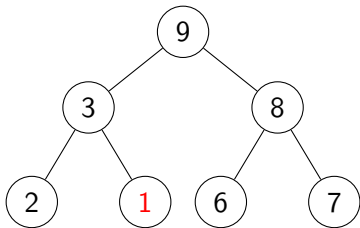
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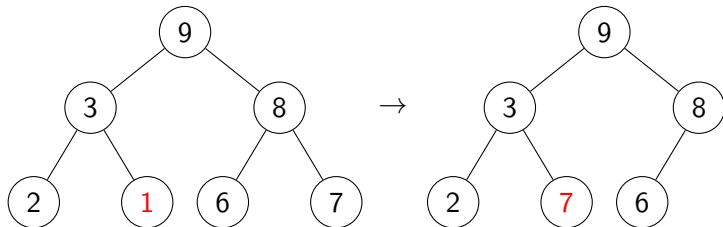
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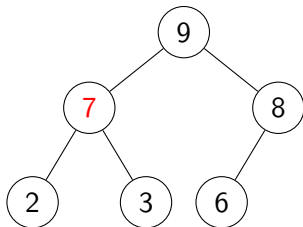
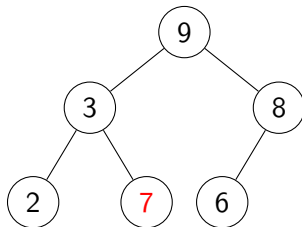
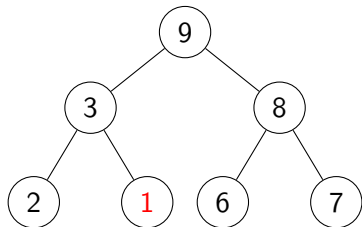
### Ex. (6.5.8 Heap Delete)

The operation  $\text{HEAP-DELETE}(A, i)$  deletes the item in node  $i$  from heap  $A$ . Give an implementation of  $\text{HEAP-DELETE}$  that runs in  $O(\lg n)$  time for an  $n$ -element max-heap.

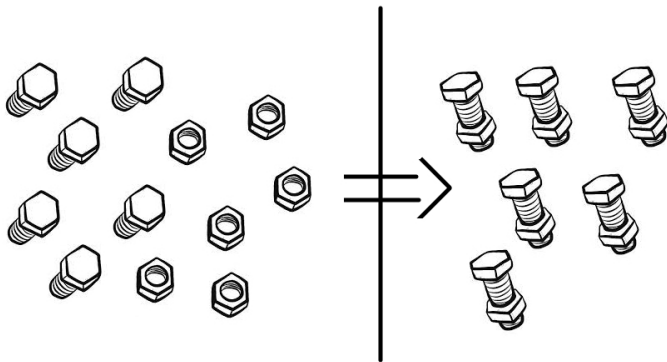








Ex. (Problem set 4, Additional Problem One, Nuts and Bolts)



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$$\log \frac{n!}{(n/2)!} \geq \log(n/2)! = \Omega(n \log n)$$



- Prove that in the **worst case**,  $\Omega(n + k \log n)$  nut-bolt tests are required to find  $k$  arbitrary matching pairs.

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$$\log \frac{n!}{(n-k)!} = \dots = \Omega(n + k \log n)$$



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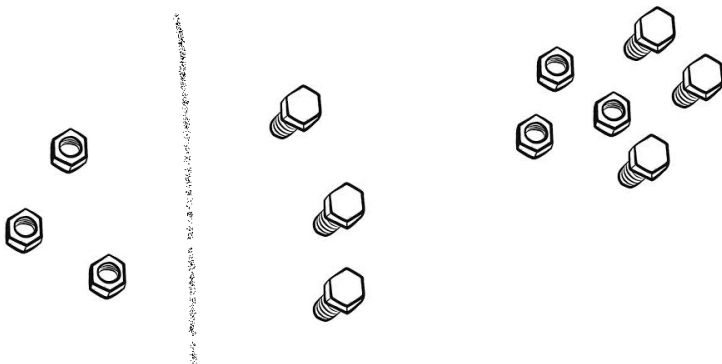
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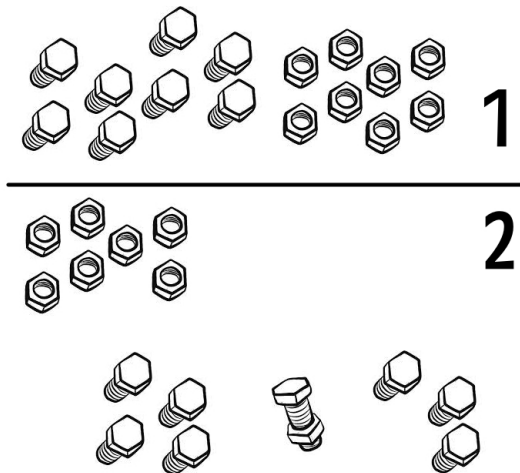


- Describe a randomized algorithm that finds  $k$  matching nut-bolt pairs in  $O(n + k \log n)$  **expected time**.

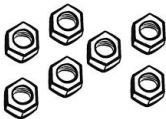


- Find **all** nut-bolt pairs: **Expected**  $O(n \log n)$

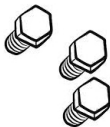
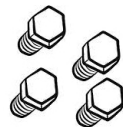
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2



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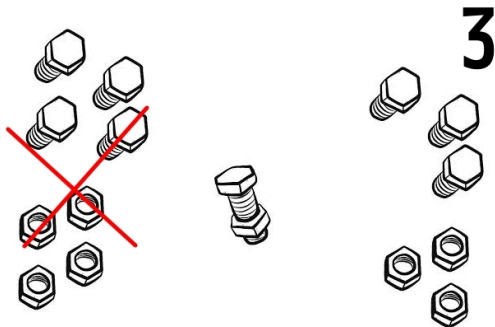
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$$T(n) = \begin{cases} n \log n & \text{if } n < 2k \\ T(n/2) + 2n & \text{otherwise} \end{cases} \implies T(n) = \Theta(n + k \log k)$$



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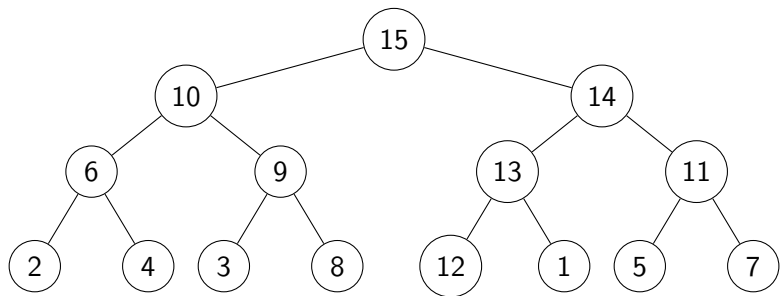
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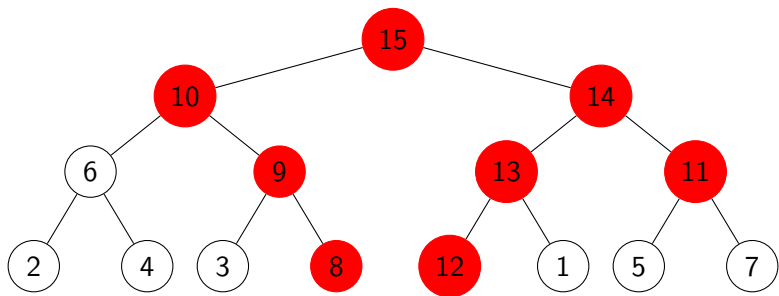
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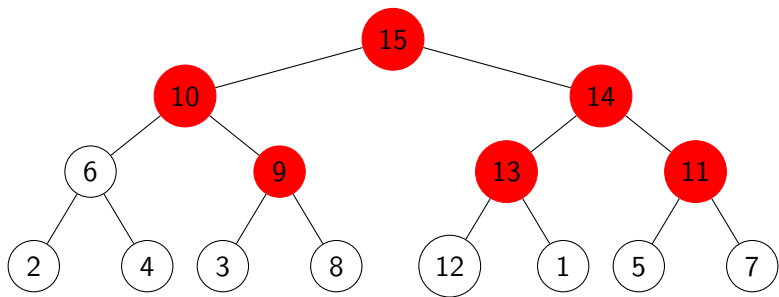
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