

# Algorithms: COMP3121/3821/9101/9801

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MORE DIVIDE AND CONQUER ALGORITHMS



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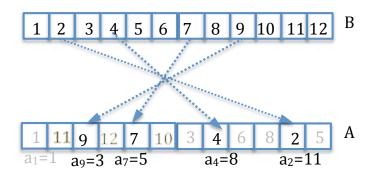
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- In other words, we count the number of pairs of movies i, j such that i < j (movie i precedes movie j on B's list) but  $a_i > a_j$  (movie i is in the position  $a_i$  on A's list which is after the position  $a_j$  of movie j on A's list.



For example 1 and 2 do not form an inversion because  $a_1 < a_2$  ( $a_1 = 1$  and  $a_2 = 11$  because  $a_1$  is on the first and  $a_2$  is on the eleventh place in A); However, for example 4 and 7 do form an inversion because  $a_7 < a_4$  ( $a_7 = 5$  because  $a_7$  is on the fifth place in A and  $a_4 = 8$ )

• An easy way to count the total number of inversions between two lists is by looking at all pairs i < j of movies on one list and determining if they are inverted in the second list, but this would produce a quadratic time algorithm,  $T(n) = \Theta(n^2)$ .

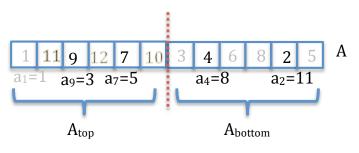
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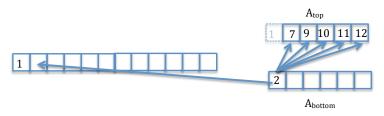
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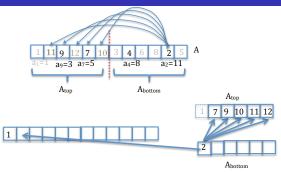
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- The main idea is to tweak the Merge-Sort algorithm.

- We split the list  $\langle a_1, a_2, \dots, a_n \rangle$  into two (approximately) equal parts  $A_{top} = \langle a_1, \dots, a_{\lfloor 2/n \rfloor} \rangle$  and  $A_{bottom} = \langle a_{\lfloor 2/n \rfloor + 1}, \dots, a_n \rangle$ .
- Note that the total number of inversions in array A is equal to the sum of the number of inversions  $I(A_{top})$  in  $A_{top}$  (such as 9 and 7) plus the number of inversions  $I(A_{bottom})$  in  $A_{bottom}$  (such as 8 and 11) plus the number of inversions  $I(A_{top}, A_{bottom})$  across the two halves (such as 7 and 4).



- We now recursively sort arrays  $A_{top}$  and  $A_{bottom}$  and obtain the number of inversions  $I(A_{top})$  in the sub-array  $A_{top}$  and the number of inversions  $I(A_{bottom})$  in the sub-array  $A_{bottom}$ ;
- We now merge the two sorted arrays  $A_{top}$  and  $A_{bottom}$  while counting the number of inversions which are across the two sub-arrays, i.e., such that i < j but such that  $a_i \in A_{bottom}$  and  $a_j \in A_{top}$ :





- We now merge the two sorted arrays  $A_{top}$  and  $A_{bottom}$  while counting the number of inversions  $I(A_{top}, A_{bottom})$  which are across the two sub-arrays.
- When the next smallest element among all elements in both arrays is an element in  $A_{bottom}$ , such an element clearly is in an inversion with all the remaining elements in  $A_{top}$  and we add the total number of elements remaining in  $A_{top}$  to the current value of the number of inversions across  $A_{top}$  and  $A_{bottom}$ .

- Whenever the next smallest element among all elements in both arrays is an element in  $A_{top}$ , such an element clearly is not involved in any inversions across the two arrays (such as 1, for example).
- After the merging operation is completed, we obtain the total number of inversions  $I(A_{top}, A_{bottom})$  across  $A_{top}$  and  $A_{bottom}$ .
- The total number of inversions I(A) in array A is finally obtained as:

$$I(A) = I(A_{top}) + I(A_{bottom}) + I(A_{top}, A_{bottom})$$