

# Parallel Algorithms - sorting

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(Some slides are based on those from the book “Parallel Programming Techniques & Applications Using Networked Workstations & Parallel Computers, 2nd ed.” de B. Wilkinson)

# Sorting in Parallel

*Why?*

- it is a frequent operation in many applications

*Goal?*

- sorting a sequence of values in increasing order using  $n$  processors

*Potential speedup?*

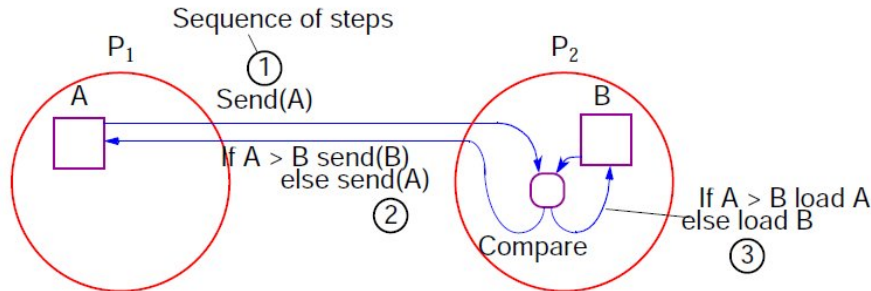
- best sequential algorithm has complexity  $\mathcal{O}(n \log n)$
- the best we can aim with a parallel algorithm, using  $n$  processors is:  
optimal complexity of a parallel sorting algorithm:  $\mathcal{O}(n \log n)/n = \mathcal{O}(\log n)$

# Compare-and-swap with message exchange (1/2)

Sequential sorting requires the comparison of values and swapping in the positions they occupy in the sequence. And, if it is in parallel? And, if the memory is distributed?

## version 1:

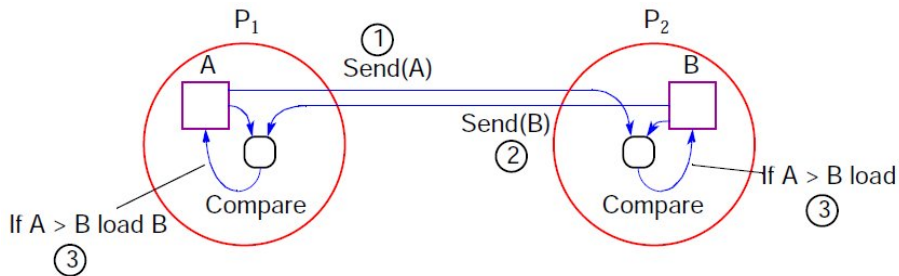
- $P_1$  send  $A$  to  $P_2$ , this compares  $B$  with  $A$  and sends to  $P_1$  the  $\min(A, B)$ .



# Compare-and-swap with message exchange (2/2)

## version 2:

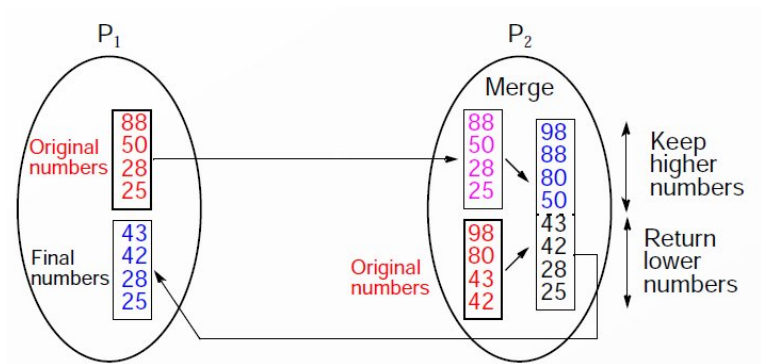
- $P_1$  sends  $A$  to  $P_2$ ;  $P_2$  sends  $B$  to  $P_1$ ;  $P_1$  does  $A = \min(A, B)$  and  $P_2$  does  $B = \max(A, B)$ .



# Data partition

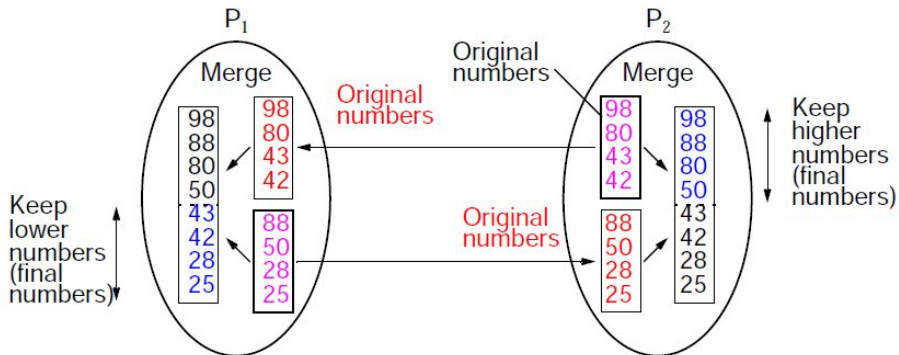
## Version 1:

- $n$  numbers and  $p$  processors
- $n/p$  numbers assigned to each processor.



# Merging two sub-lists

version 2:

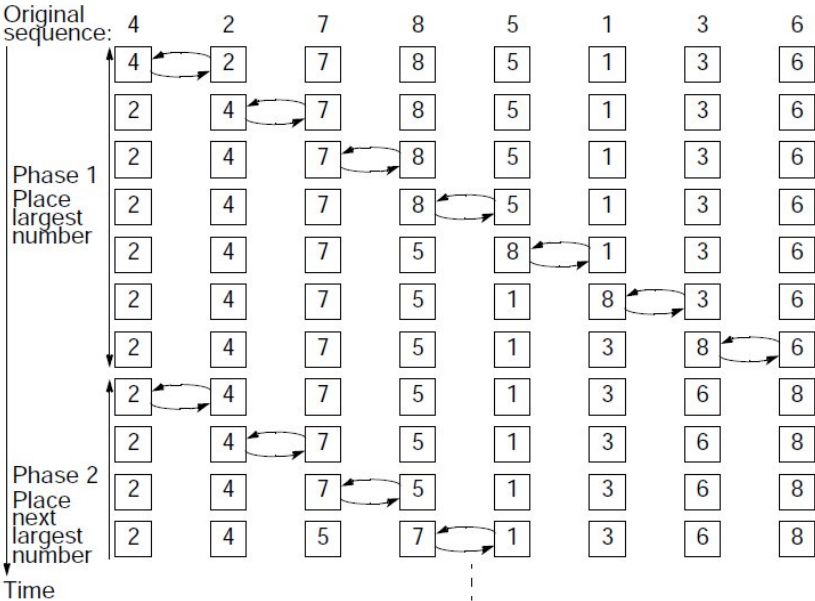


# Bubble Sort

- compares two consecutive values at a time and swaps them if they are out of order.
- greater values are being moved towards the end of the list.
- number of comparisons and swaps:  $\sum_{i=1}^{n-1} i = \frac{n(n-1)}{2}$

which corresponds to a time complexity  $\mathcal{O}(n^2)$ .

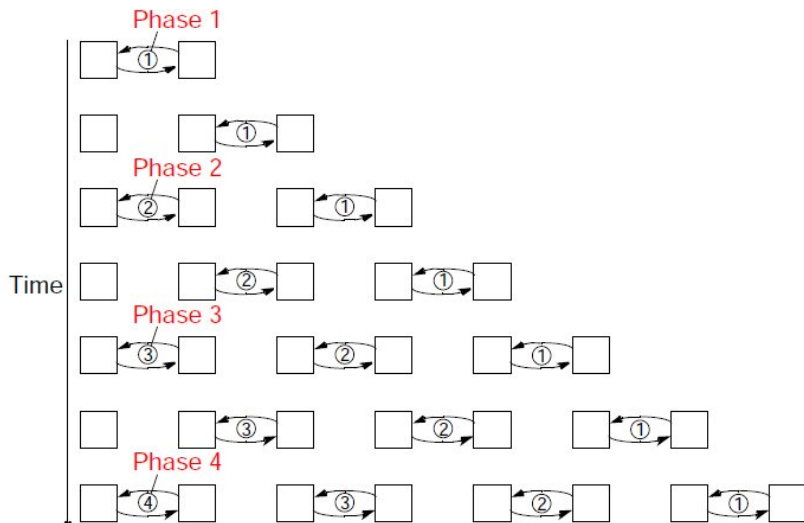
# Bubble-sort example





# Parallel Bubble-sort

The idea is to run multiple iterations in parallel.



# Odd-Even with transposition (1/2)

- it is a variant of the bubble-sort
- operates in two alternate phases:

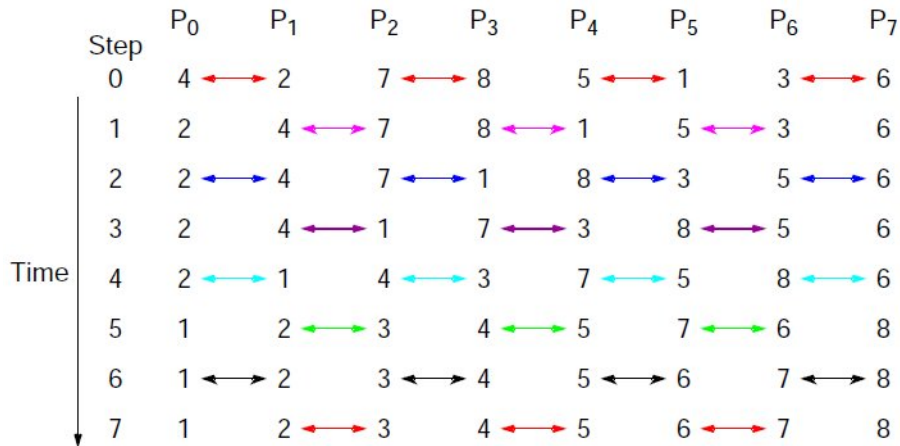
## **Phase-even:**

- ▶ even processes exchange values with right neighbors.

## **Phase-odd:**

- ▶ odd processes exchange values with right neighbors.

# Odd-Even with transposition (2/2)

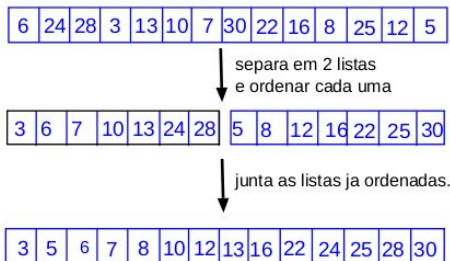


# Parallel algorithm - Odd-Even with transposition

```
void ODD-EVEN-PAR(n)
{
    id = process label
    for (i= 1; i<= n; i++) {
        if (i is odd)
            compare-and-exchange-min(id+1);
        else
            compare-and-exchange-max(id-1);
        if (i is even)
            compare-and-exchange-min(id+1);
        else
            compare-and-exchange-max(id-1);
    }
}
```

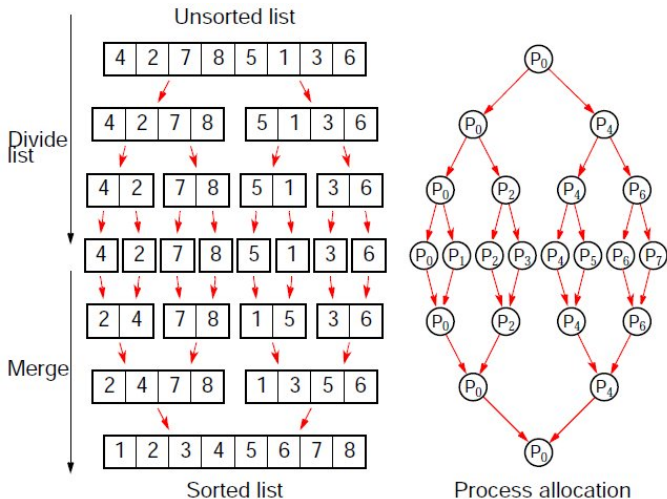
# Mergesort (1/2)

- Example of a *divide-and-conquer* algorithm
- Sorting method to sort a vector; first subdivides it in two parts, applies again the same method to each part and when they are both sorted (2 sorted vectors/lists) with  $m$  and  $n$  elements, they are merged to produce a sorted vector that contains  $m + n$  elements of the initial vector.
- The average complexidade is  $\mathcal{O}(n \log n)$ .



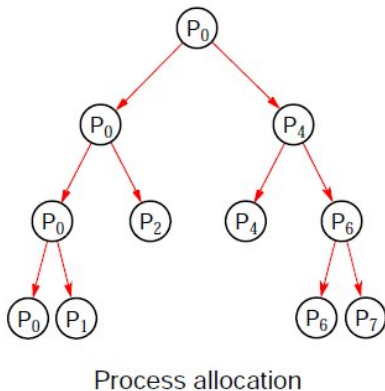
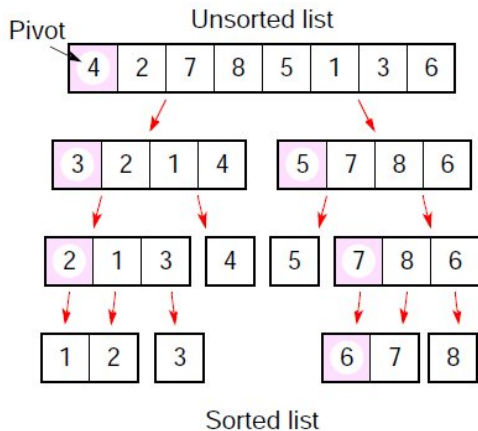
# Parallel Mergesort (2/2)

Using a strategy to assign work to processors organized in a tree.



# Parallel Quicksort

Using a strategy for work-assignment in a tree-fashion.



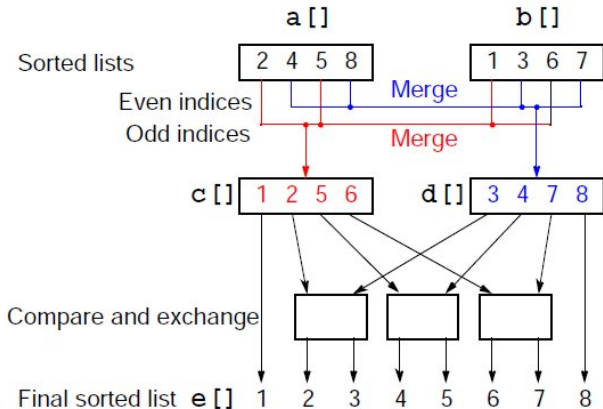
# Difficulties with the allocation of processes organized in a tree

- the initial division starts with just one process, which is limiting.
- the search tree of quicksort is not, in general, balanced
- selecting the pivot is very important for efficiency



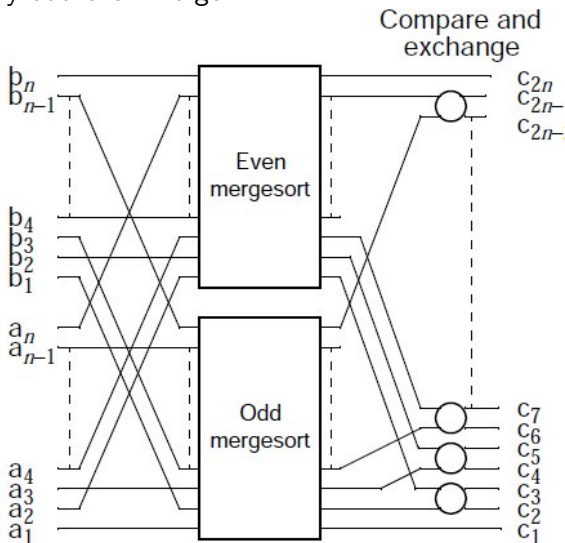
# Odd-Even mergesort

- complexity:  $\mathcal{O}(\log^2 n)$
- merging the two lists  $a_1, a_2, \dots, a_n$  and  $b_1, b_2, \dots, b_n$ , where  $n$  is a power of 2.



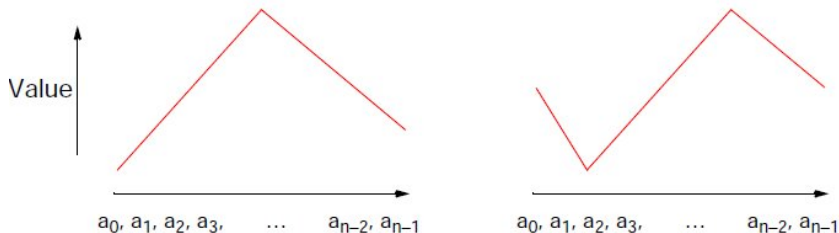
# Odd-Even mergesort

Apply recursively odd-even merge:



# Bitonic Sort (1/7)

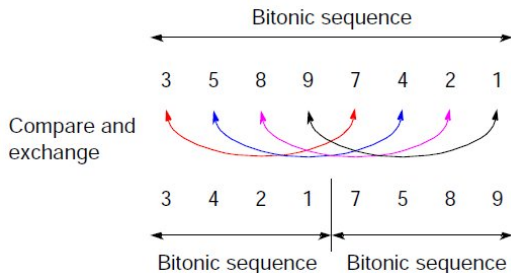
- complexity:  $\mathcal{O}(\log^2 n)$
- a sequence is bitonic if it contains two sequences, one increasing and one decreasing, i.e.  
$$a_1 < a_2 < \dots < a_{i-1} < a_i > a_{i+1} > a_{i+2} > \dots > a_n$$
for some  $i$  such that  $(0 \leq i \leq n)$
- a sequence is bitonic if the property described is attained by a circular rotation to the right of its elements.
- Examples:



# Bitonic Sort (2/7)

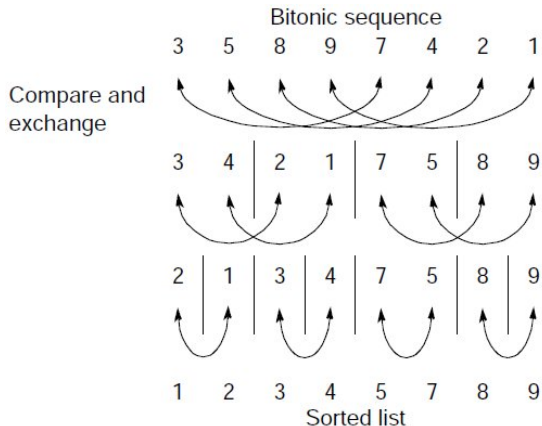
Special characteristic of bitonic sequences:

- if we do a compare-and-exchange operation with elements  $a_i$  and  $a_{i+n/2}$ , for all  $i$ , in a sequence of size  $n$ ,
- we obtain *two bitonic sequences* in which all the values in one sequence are smaller than the values of the other.
- Example: start with sequence 3, 5, 8, 9, 7, 4, 2, 1 and we obtain:

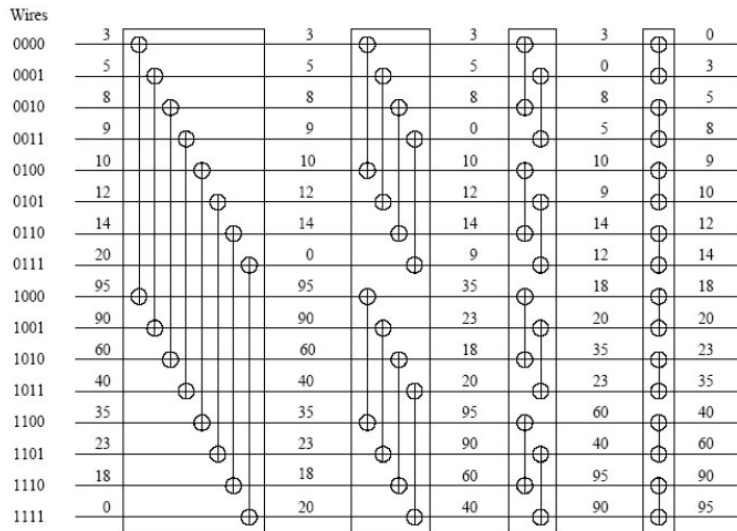


# Bitonic Sort (3/7)

- the compare-and-exchange operation moves smaller values to the left and greater values to the right.
- given a bitonic sequence, if we apply recursively these operations we get a sorted sequence.



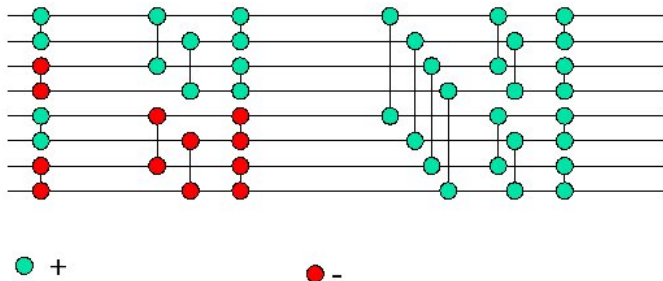
# Bitonic Sort example (4/7)



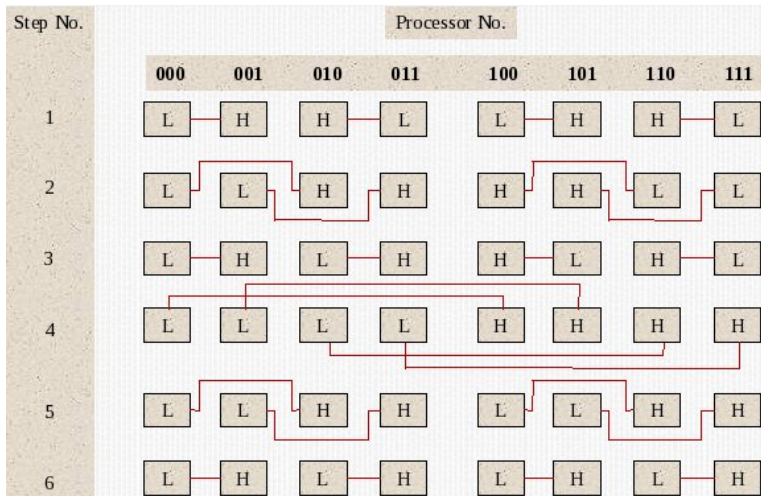
# Bitonic Sort (5/7)

To sort an unsorted sequence

- merge sequences in larger bitonic sequences, starting with adjacent pairs, alternating monotonicity.
- in the end, the bitonic sequence becomes sorted in a unique increasing sequence.



# Bitonic Sort (6/7)





# Bitonic Sort (7/7)

Unsorted sequence  $\Rightarrow$  bitonic sequence  $\Rightarrow$  sorted sequence.

