

SORTING NETWORKS

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Sorting Networks

Comparison Networks

A sorting network is a (comparison) network that always sorts its inputs by performing comparisons only (i.e. countsort, radix sort can not be implemented in such networks). Sorting networks are special cases of a broader class of networks known as comparison networks.

A comparison network consists of wires and comparators. A **comparator** is a box with two inputs x and y and two outputs a and b . The comparator compares x and y and outputs through a the minimum of x and y and through b the maximum of x and y . The box of Fig 1. in most cases is simplified into the vertical line of Fig 2. Each comparator takes $O(1)$ time steps to compare the two keys and output them in proper order. The wires transmit values as a whole (think of parallel communication rather than serial) from left to right. If multiple comparators are attached to a horizontal line that transfers the input values the result of a preceding comparator must become available before a succeeding comparator starts performing the comparison required. The **depth** of a sorting network is the maximum number of comparators attached in a path (not line) from an input to an output. Thus if all input lines are of depth 0, and the input wires to a comparator are of depth d_1 and d_2 then the two output wires of the comparator are of the same depth $\max\{d_1, d_2\} + 1$.

A sorting network is a comparison network whose output lines generate the input sequence in monotonically increasing order top-to-bottom (i.e. smallest element appear on top-right output line and largest in bottom-right).

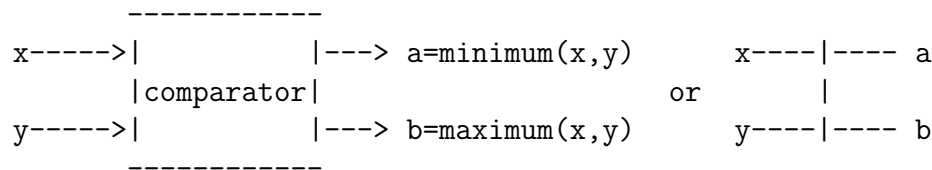


Fig 1.

Fig 2.

The sorting algorithm implied by a sorting network is an **oblivious sorting algorithm**. An oblivious algorithm is an algorithm whose actions are always the same and independent of the input and output: in an oblivious sorting algorithm the sequence of comparisons performed is the same for all inputs and outputs.

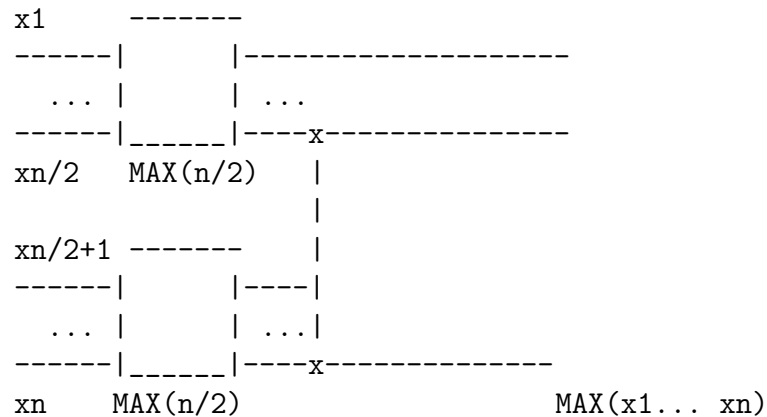
Comparison Networks

Finding the maximum

Suppose we are interested in Finding the maximum of n values. Let n be a power of two.

One way to build a comparison network for finding the maximum is divide and conquer. Suppose that a comparison network with n input lines and n output lines finds the maximum of n values fed through the input lines and this maximum appears through the bottom wire of the output. We can construct this network recursively by first constructing two networks, one that finds the maximum of the first $n/2$ values and one that finds the maximum of the remaining $n/2$ values. Then, a single comparison determines the maximum of the two maxima, i.e. the maximum of the n values.

MAX(i): A box with i input and i output wires.
 The maximum appears through the bottom output wire



Let $S(n)$ be the size of $MAX(n)$. Then,

$$S(n) = 2S(n/2) + 1$$

We have $S(2) = 1$. A solution for $S(n)$ is $S(n) = n - 1$. Let $D(n)$ be the depth/delay of $MAX(n)$. Then,

$$D(n) = D(n/2) + 1$$

We have $D(2) = 1$. A solution for $D(n)$ is $D(n) = \lg n$.

Sorting Networks

Some simple networks

Sorting 1 key ----- Immediate

Sorting 2 keys ----X----- Trivial
 |
 ----X-----

Sorting 3 keys -x-----x- An insertion sort based network
 | |
 -x---x---x-
 |
 -----x-----

Sorting 4 keys -x---x---x-- Sort first three keys as before
 | | | Then binary search/insert 4th
 -x-x-x-x--x-- key into the first three.
 | |
 ---x---|--x--
 | |
 -----x--x--

or

-x---x---x--- Sort using insertion sort;
 | | | Last three comparators (one touched
 -x-x-x-x-x--- from right) insert 4th key into the
 | | sorted sequence of the first three
 ---x-x-x----- (figure from above)
 |
 -----x-----

Sorting Networks

0-1 Sorting Lemma

The 0-1 Sorting Lemma also referred to as 0-1 (Sorting) principle can be used to show that a comparison network is indeed a sorting network. The 0-1 sorting lemma says that if a sorting network sorts all inputs of zeroes and ones correctly, then it can sort any type of inputs as well, be them floating point numbers, integers, etc. Note that the lemma applies to sorting “algorithms” that are oblivious and use only comparisons and do not inspect the values of the input.

Lemma MonotonicP. If a comparison network transforms $a = \langle a_1, \dots, a_n \rangle$ into a $b = \langle b_1, \dots, b_n \rangle$, then for any monotonically increasing function f , the network transforms $f(a) = \langle f(a_1), \dots, f(a_n) \rangle$, into $f(b) = \langle f(b_1), \dots, f(b_n) \rangle$.

Proof MonotonicP. A proof of the monotonic property will be by induction.

The basis of the induction is the proof that a single comparator has the monotonic property. Suppose that the inputs to a comparator are x and y . If $x \leq y$, then $f(x) \leq f(y)$ by the monotonicity of f . In the former case x is output on the top output line and in the latter case $f(x)$ is output on the top output line. A similar observation applies to the case $x \geq y$, where $y, f(y)$ are on the top output line. Therefore $\min(f(x), f(y)) = f(\min(x, y))$, and $\max(f(x), f(y)) = f(\max(x, y))$.

A comparator C at depth d has input lines that are of depth strictly less than d . If these input lines carry a_i and a_j when the input is a , they will carry, by the inductive hypothesis $f(a_i)$ and $f(a_j)$, when the input is $f(a)$. This completes the induction, as C would produce. $f(\min(a_i, a_j)), f(\max(a_i, a_j))$ by the base case.

0-1 Sorting Lemma If a comparison network with n inputs sort all 2^n possible input sequences of zeroes and ones, then it sort all sequences of arbitrary numbers correctly.

Proof 0-1SL. Suppose that the comparison network sort all 2^n binary n inputs, but fails to sort a sequence s of arbitrary numbers. Then this means that in sequence s there are two numbers s_i and s_j that are out of order, i.e. $s_i < s_j$ but the network places s_j before s_i . We then define the following monotonically increasing sequence.

$$f(x) = \begin{cases} 0 & \text{if } x \leq s_i \\ 1 & \text{if } x \geq s_i \end{cases}$$

Since the network places s_j before s_i then given a monotonically increasing f it would place $f(s_j) = 1$ before $f(s_i) = 0$ in the output sequence, i.e. it would place an 1 before a 0. Then this specific input sequence of 0's and 1's (implied by f) would not be sorted contradicting the assumption that all binary sequences are sorted correctly.

Sorting networks

Building Steps

In order to build a sorting network, we will proceed in steps.

- We first show how to sort more structured sequences called bitonic sequences, and thus how to construct a bitonic sorting network.
- We then show how to merge two sorted sequences and thus how to construct a merging sorting network.
- We finally show how to sort an arbitrary sequence.

Sorting networks

Bitonic sorting

A **bitonic sequence** is a sequence that

S1 monotonically increases and then monotonically decreases or

S2 is a circular shift (rotation) of a sequence described in case S1.

For example $\langle 4, 7, 8, 6, 5, 3, 2, 1 \rangle$ is a bitonic sequence, and so is $\langle 7, 8, 6, 5, 3, 2, 1, 4 \rangle$ that results from shifting/rotating the former sequence one position to the left.

We first show how to sort a bitonic sequence of length n .

In the remainder we will assume that n is a power of two. If this is not the case, we can pad keys in the sequence so that its length becomes a power of two.

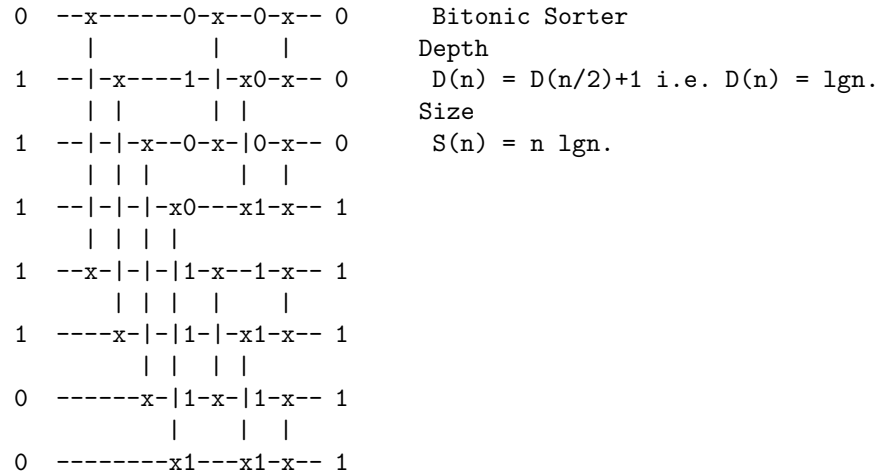
Idea. A comparison network where line i is connected to line $i + n/2$, $0 \leq i < n/2$, turns a bitonic sequence of 0's and 1's into two bitonic sequences of half the original size, one of which is clean (all output lines contain one kind of input).

Algorithm BitonicSort. Use the idea recursively until we “clean” all the lines. The first application cleans half the input (which becomes a trivial bitonic sequence) and turns the other half into a bitonic sequence whose elements are smaller than (or equal to) the cleaned ones if it is the top-half (and at least than the cleaned elements if it is the bottom half).

Analysis of BitonicSort. This will take $\lg n$ phases. Each phase consists of $n/2$ comparators. The depth of the network is $\lg n$ and its size $n \lg n/2$.

Bitonic sorting

Algorithm Correctness



BitonicSort Algorithm Correctness

In order to prove the correctness of this scheme we distinguish four cases assuming the input is of the form $\bar{0}\bar{1}\bar{0}$, where $\bar{1}, \bar{0}$ denote a block of 1's and 0's of arbitrary (potentially not equal) size respectively. The symmetric case $\bar{1}\bar{0}\bar{1}$ is treated analogously.

- a $\bar{1}$ does not include the midpoint and falls in top half.
- b $\bar{1}$ does not include the midpoint and falls in bottom half.
- c $\bar{1}$ includes midpoint and length less than $n/2$.
- d $\bar{1}$ includes midpoint and length not less than $n/2$.

In case (a) a block $\bar{0}$ of length at least $n/2$ results in top half (i.e it is clean). Same for case (b). In case (c) we have the same. In case *d* we have a block $\bar{1}$ of length $n/2$ in the bottom/upper half, and a bitonic sequence in the bottom half.

In all cases we obtain at least one clean half, two bitonic sequences, and every element in the top half is less than or equal to every element in the bottom half.

Sorting networks

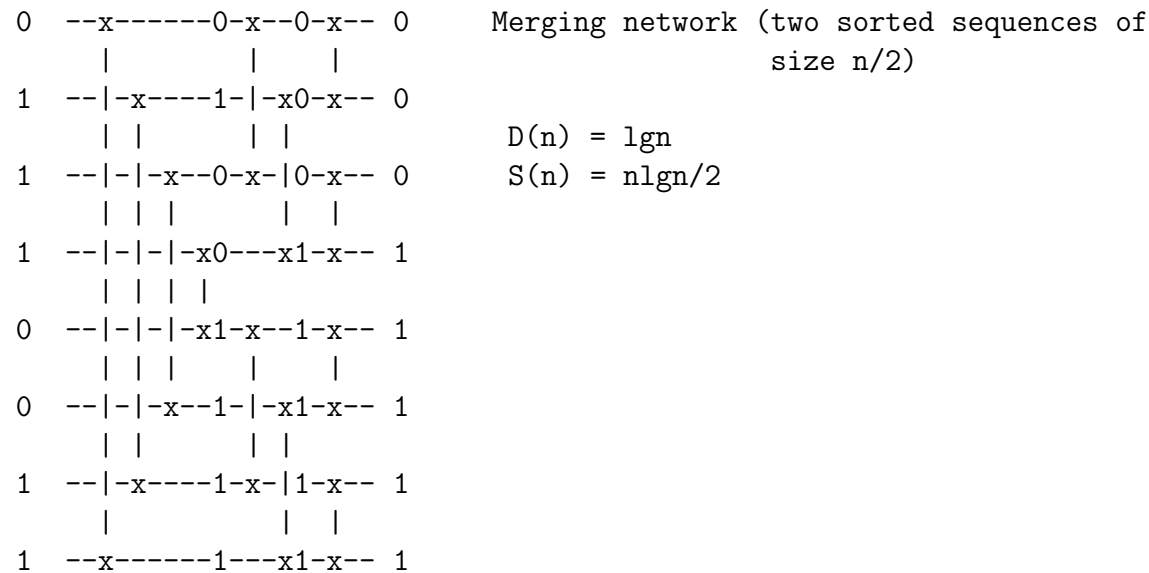
Merging

The problem of merging deals with merging two sorted sequences into one sorted sequence. Suppose the total length of the sorted sequence is $n = k + l$, and k, l are the lengths of the two sequences to be merged. In the remainder we will assume that $k = l = n/2$. **The sequence formed by the first sequence and the reverse of the latter is bitonic.** Since it is bitonic it can be sorted with the bitonic sorter presented in the previous section.

The only problem that needs to be resolved is transforming two sorted sequences into a bitonic sequence. This transformation can be incorporated in the first phase of the bitonic network described in the previous section.

We recall that in the first phase of the bitonic network line i is compared to $i + n/2$ and a clean sequence (which is also trivially bitonic) of length $n/2$ results in one of the halves, and a bitonic sequence results in the other half.

The key of the input sequence that should be in the $i + n/2$ line if the input sequences was to be converted into a bitonic sequence would have been the i -th largest key of the second sequence that would be reversed. However that key is currently in line $n - i + 1$. The easy way to resolve this problem is by performing a comparison not between i and $i + n/2$ but between i and $n - i + 1$ instead. After the first phase is completed we get two bitonic sequences for the top and bottom half and thus the remaining phase of the bitonic sorter need not be modified.



Sorting networks

Sorting Networks

We are now ready to introduce the algorithm for sorting, i.e. build a sorting network that sorts its input. The algorithm is merge-sort based. In order to sort n keys we produce two sorted sequences recursively (divide and conquer step) and merge these sequences (combining step), by the n -line merging network of the previous section. The basis of the recursive decomposition is easy. A sequence consisting of a single key is already sorted.

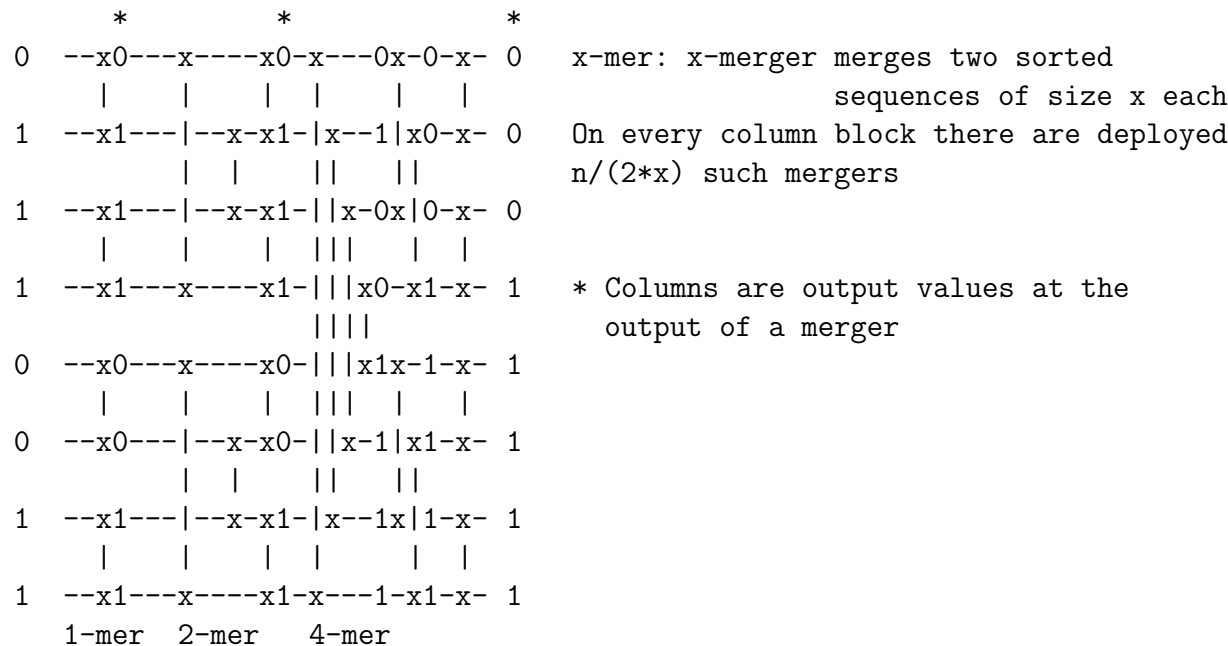
Therefore using this divide and conquer construction of a sorting network we conclude the following. The depth and size of such a network can be found as follows.

$$D(n) = D(n/2) + \lg n$$

This gives $D(n) = O(\lg^2 n)$ by the master method and $\lg n(1 + \lg n)/2$ by the iteration method.

$$S(n) = 2S(n/2) + O(n \lg n)$$

This gives $S(n) = O(n \lg^2 n)$ by the master method.



Sorting Networks

Batcher's Odd-even merge-sort

A variant of bitonic-based sorting that achieve a slighter better running time the + in $\lg n + 1$ becomes a minus -, is also due to Batcher. There are asymptotically faster networks today (eg. AKS due to Ajtai-Komlos-Szemerédi, 1984) that have depth $O(\lg n)$; however they suffer from large constants hidden in the big-Oh notation. Batcher's odd-even merge sort algorithm was developed in the 1960's and can be implemented in an $O(n)$ size network to sort n keys in time $O(\lg^2 n)$. The idea behind it is just plain merge-sort.

Merge-Sort(A, n, l=1, r=n)

1. Divide A[l..r] into two halves A[l..m] and A[m+1..r].
2. Sort A[l..m] and A[m+1..r] recursively.
3. Merge A[l..m] and A[m+1..r]

Question 1: How many recursive rounds? Answer: $O(\lg n)$.

Question 2: How do you parallelize? Answer: Step 2 is obvious.

Question 3: Step 3? Answer: ?

Question 4: Running Time? Answer:

The running time of a parallelization would be as follows.

$$T_{sort}(n) = T_{sort}(n/2) + T_{merge}(n/2)$$

where $T_{sort}(n)$ is the time to sort n keys in parallel with n processors, and $T_{merge}(n)$ is the time to merge 2 lists of n keys each in parallel using $2n$ processors

The only question left unanswered is: Question 3. In order to merge we use a procedure called odd-even merge that works miraculously well.

Sorting Networks

Parallel Odd-even merge

Let $A = \langle a_0 \dots a_{m-1} \rangle$ and $B = \langle b_0 \dots b_{m-1} \rangle$, where A, B are two sorted sequences to be merged.

```
begin ODDEVENMERGE ( $A = \langle a_0 \dots a_{m-1} \rangle, B = \langle b_0 \dots b_{m-1} \rangle, m$ )
1a.   Even(A) =  $\langle a_0, a_2, \dots, a_{m-2} \rangle$ ;
1b.   Odd(A)  =  $\langle a_1, a_3, \dots, a_{m-1} \rangle$ ;
1c.   Even(B) =  $\langle b_0, b_2, \dots, b_{m-2} \rangle$ ;
1d.   Odd(B)  =  $\langle b_1, b_3, \dots, b_{m-1} \rangle$ ;
2a.   C = ODDEVENMERGE(Even(A), Odd (B), m/2);
2b.   D = ODDEVENMERGE(Odd (A), Even(B), m/2);
3.     $L_{pre} = \langle c_0, d_0, c_1, d_1, c_2, d_2, \dots, c_{m-1}, d_{m-1} \rangle$ ;
      // x:y means compare x and y and place so that the left of the two
      // is the smallest of the two
4.    L      =  $\langle c_0 : d_0, c_1 : d_1, c_2 : d_2, \dots, c_{m-1} : d_{m-1} \rangle$ ;
      //Perform a comparison side-by-side between  $c_i$  and  $d_i$ .
5.    Return(L);
end ODDEVENMERGE
```

Note. The variant given here slightly differs from the original Batcher paper. In that paper Odd(A) with Odd(B) and Even(A) with Even(B) are merged. That however, would require the comparison of d_i with c_{i+1} in line 4 instead, with c_0 and d_{m-1} not participating in that step (left unchanged).

An Example.

```
A = < 1 5 7 8 >
B = < 2 3 4 6 >
even(A) = < 1 7 >   odd(A) = < 5 8 >
even(B) = < 2 4 >   odd(B) = < 3 6 >
C   = OddEvenMerge(even(A), odd(B)) = < 1 3 6 7 >
D   = OddEvenMerge(odd (A), even(B)) = < 2 4 5 8 >
Lpre = < 1 2 3 4 6 5 7 8 >
Lpre = < 1:2 3:4 6:5 7:8 >
L    = < 1 2 3 4 5 6 7:8 >
```

Sorting Networks

Parallel Odd-even merge

Lemma OEm. ODDEVENMERGE works as claimed.

Proof of Lemma.

We use the 0-1 Sorting Lemma.

Let A consists of a 0's and $m - a$ 1's, and B of b 0's and $m - b$ 1's.

After Line1,

$odd(A)$ has $\lfloor a/2 \rfloor$ 0's, and

$even(A)$ has $\lceil a/2 \rceil$ 0's.

Similarly,

$odd(B)$ has $\lfloor b/2 \rfloor$ 0's, and

$even(B)$ has $\lceil b/2 \rceil$ 0's.

Then, after Line2, C has

$c' = \lceil a/2 \rceil + \lfloor b/2 \rfloor$ 0's

and D has

$d' = \lfloor b/2 \rfloor + \lceil a/2 \rceil$ 0's,

where $|c' - d'| \leq 1$.

Then, after Line3, we get

a. If $c = d$ or $c = d + 1$,

$$L = L_{pre} \quad 0 \quad 0 \quad \dots \quad 0 \quad 1 \quad 1 \quad 1 \quad 1$$

$c + d$ 0's

b. If $c = d - 1$,

$$L = L_{pre} \quad 0 \quad 0 \quad \dots \quad 0 \quad 1 \quad 0 \quad 1 \quad 1$$

$2c$ 0's flip

This completes the proof.

Parallel Odd-even merge: discussion

The interesting point about ODDEVENMERGE is that the preparatory steps for the recursive calls interlace the two sequences, and

1. To merge two sequences of size n each, we merge recursively two of size $n/2$ twice
2. To merge two sequences of size $n/2$ each, we merge recursively two of size $n/2^2$ twice
 - i. To merge two sequences of size $n/2^{i-1}$ each, we merge recursively two of size $n/2^i$ twice
- $\lg n$ To merge two sequences of size 2 each, we merge recursively two of size 1 twice.

The base of the recursions is easy. Merging two sequences of size 1 requires just one comparison and is equivalent to sorting/maximum finding.

At this point we have completed Line 2. Sorting the L_{pre} sequence is also easy. Lines 3 and 4 require just one parallel step.

Thus the running time of the merging phase is

$$\begin{aligned}T_{merge}(m) &= T_{merge}(m/2) + 1 \\T_{merge}(m) &= O(\lg m).\end{aligned}$$

Sorting Networks

Parallel Odd-even merge-sort

Algorithm ODDEVENMERGE merges two sorted sequences. ODDEVENMERGESORT is described below for completion. It sorts a sequence of n keys.

```
begin ODDEVENMERGESORT ( $X = \langle x_0 \dots x_{n-1} \rangle, n$ )
1a.   Left(A) =  $\langle x_0, x_1, \dots, x_{n/2-1} \rangle$ ;
1b.   Right(A) =  $\langle x_{n/2}, x_{n/2+1}, \dots, x_{n-1} \rangle$ ;
2a.   L(A) = ODDEVENMERGESORT(Left(A),  $n/2$ );
2b.   R(A) = ODDEVENMERGESORT(Right(A),  $n/2$ );
3.    Y = ODDEVENMERGE(L(A), R(A),  $n/2$ );
5.    Return(Y);
end ODDEVENMERGESORT
```

The running time of ODDEVENMERGESORT is, however, more complicated. Lines 1a and 1b are done in parallel. Lines 2a and 2b are done in parallel. Line 3 is $T_{merge}(n/2)$.

$$\begin{aligned} T_{sort}(n) &= T_{sort}(n/2) + T_{merge}(n/2) \\ T_{sort}(n) &= O(\lg^2 n). \end{aligned}$$

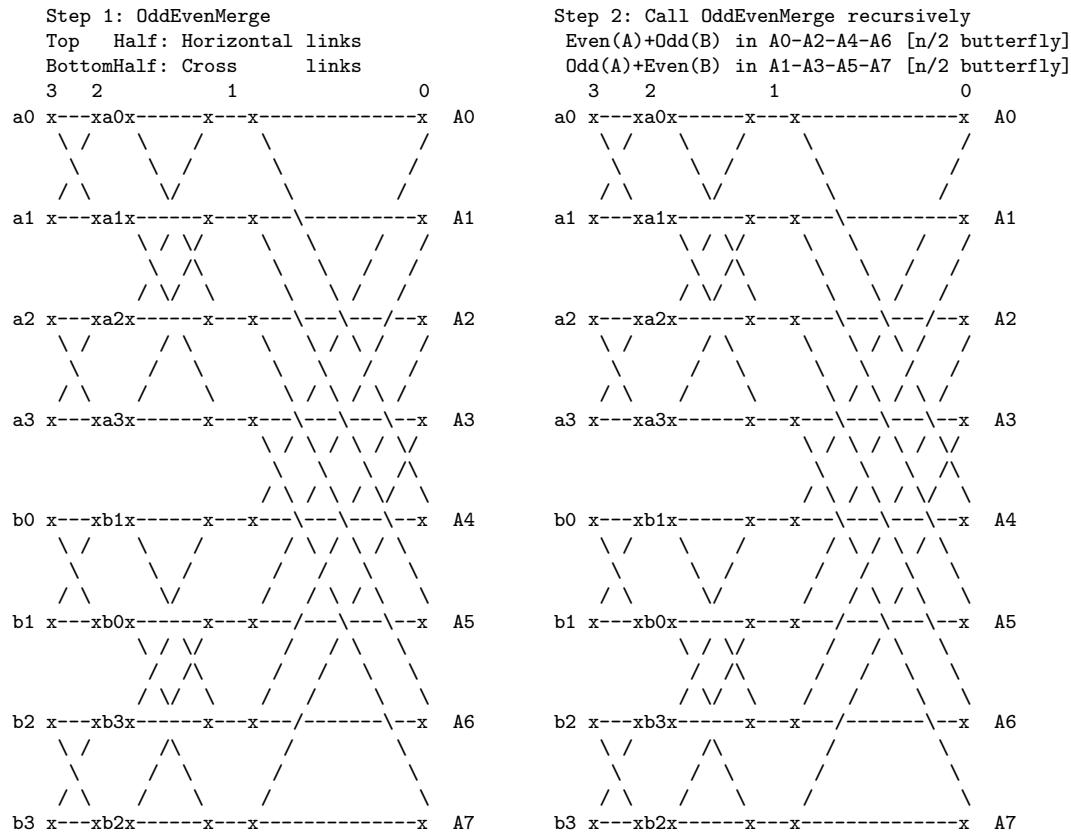
Theorem OE. Odd-even merge-sort works as claimed.

Proof. A proof that OE merge-sort works utilizes the 0-1 sorting lemma. By induction let us assume that OE merge-sort works for sizes less than or equal to $n - 1$.

Therefore in order to sort n keys, we split them into 2 halves of size $n/2$ each. By the inductive hypothesis, o-e merge-sort sorts independently the two halves. It remains to be shown that the merging algorithm so described merges the two sorted sequences and the theorem is proved. \square .

Odd-even merge-sort

Implementation on the butterfly of the merging algorithm

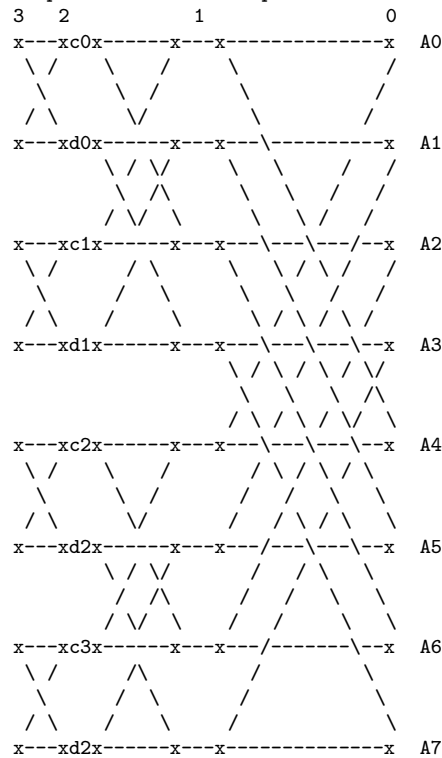


Step 1: Level 3 to Level 2 for 8-butterfly: Prepare odd-even sequences.
 Step 2: Level 2 to Level 0 back to Level 2 : Recursive merging.

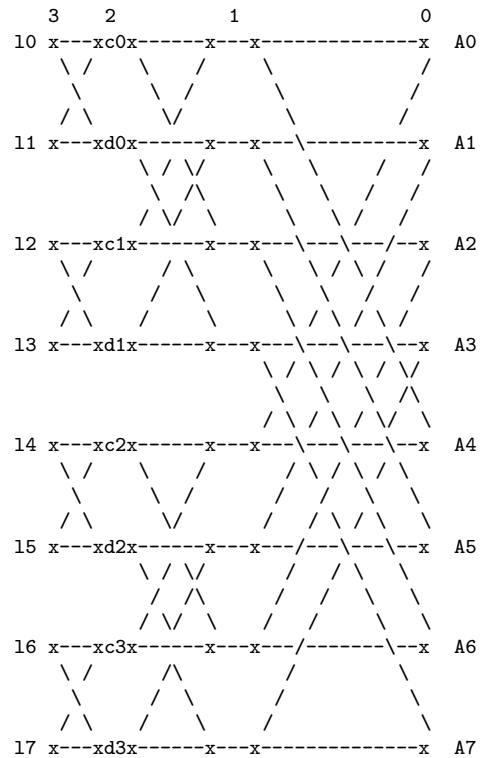
Odd-even merge-sort

Implementation on the butterfly of the merging algorithm: 2

Step 3: The C/D are in level 2
 Use leftmost cross links to
 compare $c_i:d_i$ and fix position



Step 4: Done



Step 3: Leve 2 back to Level 3: Compare c_i to d_i to complete merging.

Step 4: Done. Output at level $\lg n$ (i.e. level 3 for 8-butterfly).

Merging algorithm on the butterfly: Proof of correctness

Merging Phase

Proof is by construction. Use induction.

Base case. A 2-input butterfly merges two keys (easy by inspection).

Inductive Hypothesis. an $n/2$ -input butterfly merges two sorted sequences of size $n/4$ each. A merging operation starts from the left (level $\lg n - 1$) where the input resides, proceeds to the right (level 0) and returns to the left of a reverted butterfly, where the output will become available.

Inductive Step. Use 2 $n/2$ butterflies in the form of an n -butterfly to merge two $n/2$ -key sorted sequences.

Let the butterfly be in reverse order ($\lg n$ -level leftmost level, 0-level rightmost level).

Let a_0, a_1, \dots be the input to the top $n/2$ rows and b_0, b_1, \dots be the input to the bottom $n/2$ rows.

The top half uses the level edges to transfer input keys to the next level $\lg n - 1$. Output is even-odd indexed input on even-odd indexed lines of the butterfly. The bottom half uses the cross edges and output is switched i.e. even-odd indexed input resides on odd-even indexed lines of the butterfly.

Eliminate level $\lg n$. We view the remainder as two $n/2$ -butterflies. The two butterflies of size $n/2$ each have their inputs intermixed. The topmost butterfly has inputs $even(A)$ and $odd(B)$ and the bottommost butterfly has inputs $odd(A)$ and $even(B)$.

The two separate butterflies merge by induction their inputs.

After the merging step.

At level $\lg n - 1$, after the merging had been performed separately in the topmost and bottommost butterflies, let the outputs be c_0, c_1, \dots and d_0, d_1, \dots already intermixed. The crossed edges are utilized to perform the pairwise comparisons in step 4 of the algorithm.

Odd-even merge-sort Implementation on the butterfly of the sorting algorithm

So far we have described how to perform merging on an n -butterfly. The odd-even sorting network (or algorithm on the butterfly) has not yet been presented.

Sorting phase.

In order to sort n keys we input the keys on level $\lg n$ of a reverse butterfly (leftmost level is $\lg n$, rightmost level is 0).

We split the n keys into $n/2$ pairs of sublists of size 1 and 1, and merge them independently using only the last two levels of the butterfly (i.e. working $\lg n \rightarrow \lg n - 1 \rightarrow \lg n$ in 2 steps). The first two levels can be considered as a set of $n/2$ 2-row butterflies.

As a result of this phase we have $n/2$ sorted sequences of 2 keys. We will pair them and thus obtain $n/4$ sorted sequences of 4 keys and so on.

We split the derived $n/2$ sublists of size 2 into $n/4$ pairs of sublists each of size 2 and merge them independently using the last three levels of the butterfly (i.e. $\lg n \rightarrow \lg n - 1 \rightarrow \lg n - 2 \rightarrow \lg n - 1 \rightarrow \lg n$), in 4 steps.

We split the derived $n/4$ sublists of size 4 into $n/8$ pairs of sublists each of size 4 and merge them independently using the last four levels of the butterfly (i.e. $\lg n \rightarrow \lg n - 1 \rightarrow \lg n - 2 \rightarrow \lg n - 3 \rightarrow \lg n - 2 \rightarrow \lg n - 1 \rightarrow \lg n$) in 6 steps.

In general in round i we merge $n/2^i$ pairs of sublists of size 2^{i-1} each that requires $2i$ steps. Total parallel time is

$$\sum_{i=1}^{\lg n} 2i = \lg n(\lg n + 1)$$

The algorithm can be modified to work in half as many rounds by observing that the first $\lg n$ steps move keys to the right for the purpose of mixing them and no actual work is performed.