

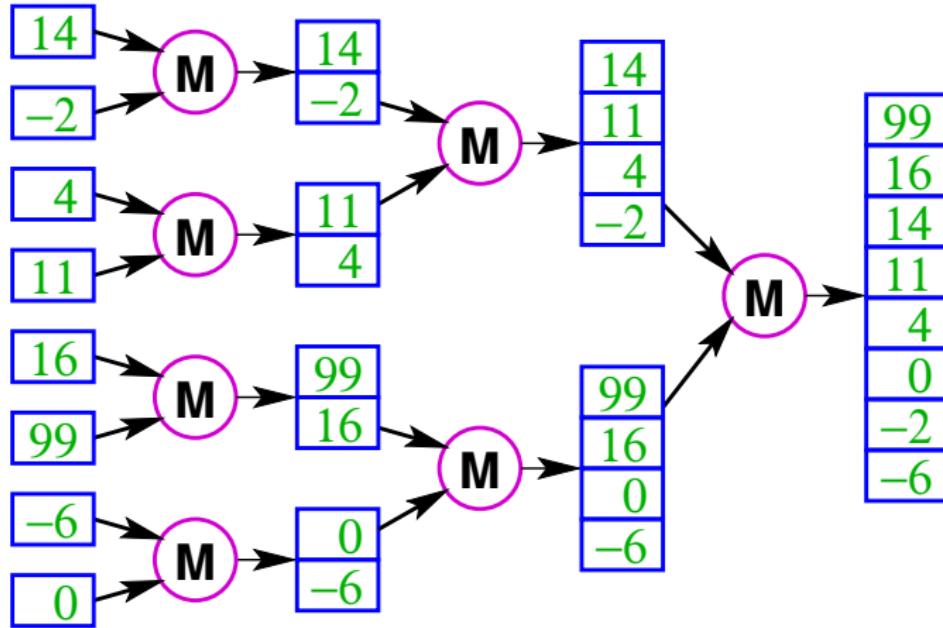
Sorting Networks

Mark Greenstreet

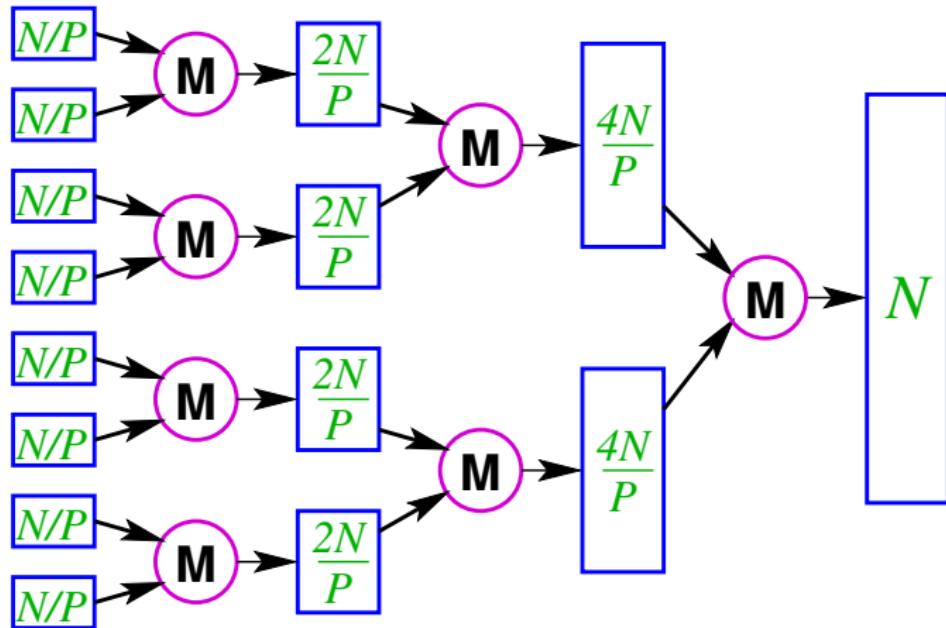
CpSc 418 – Mar. 9, 2016

- Parallelizing mergesort and/or quicksort
- Sorting Networks
- The 0-1 Principle
- Summary

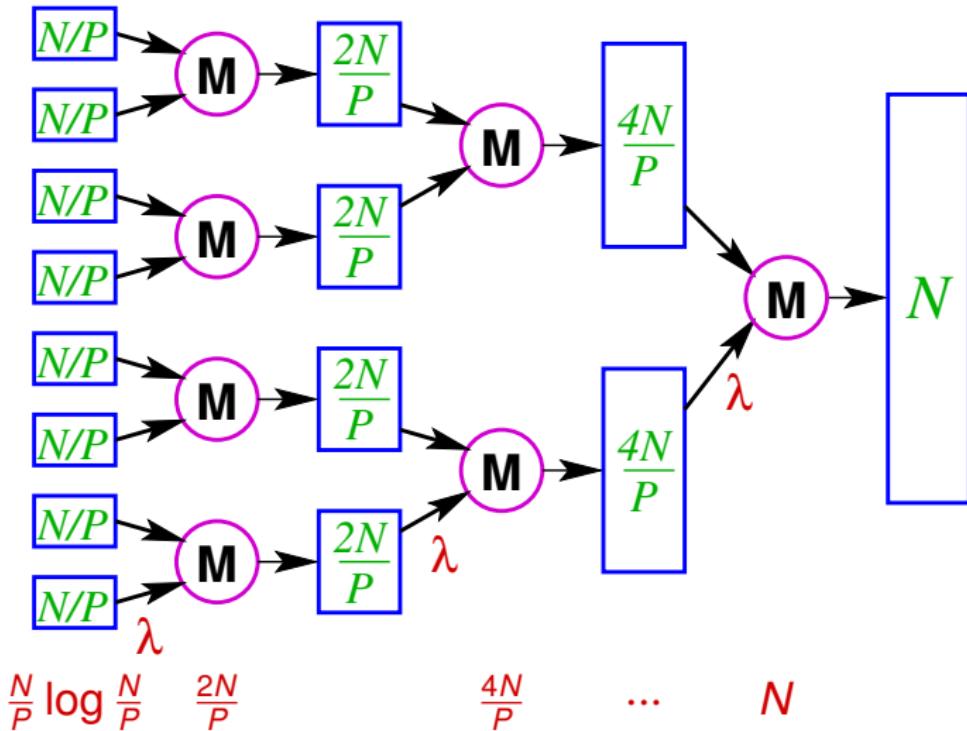
Parallelizing Mergesort



Parallelizing Mergesort



Parallelizing Mergesort



$$\frac{N}{P} \log \frac{N}{P}$$

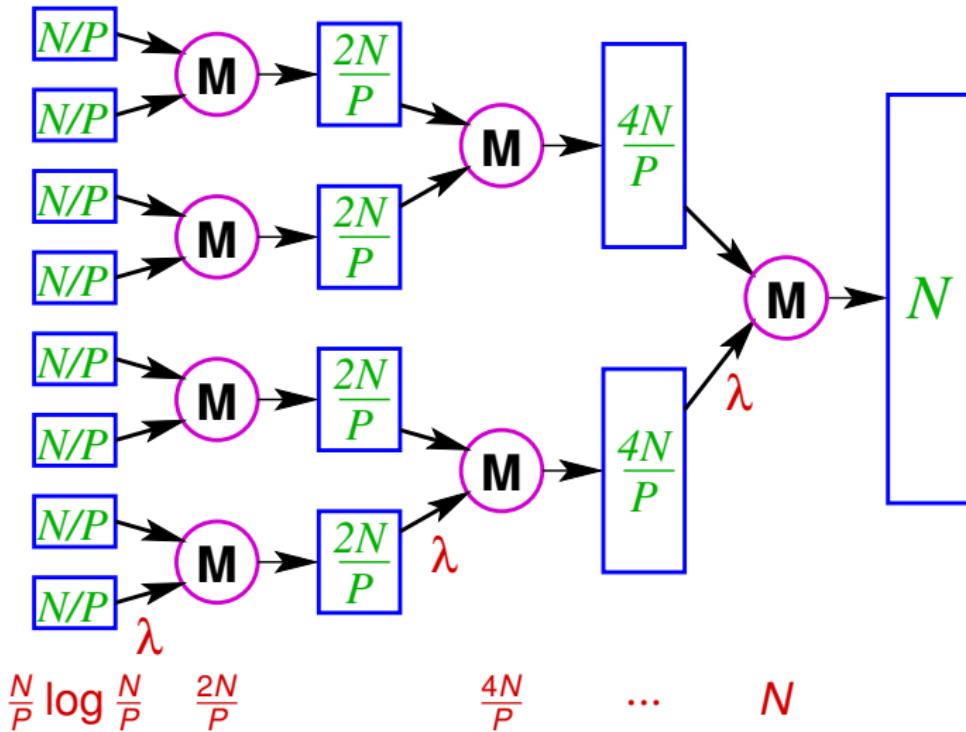
$$\frac{2N}{P}$$

$$\frac{4N}{P}$$

...

$$N$$

Parallelizing Mergesort



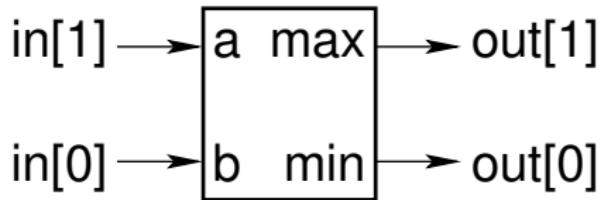
$$\text{Total time: } \frac{N}{P} (\log N + 2(P - 1) - \log P) + (\log P)\lambda$$

Parallelizing Quicksort

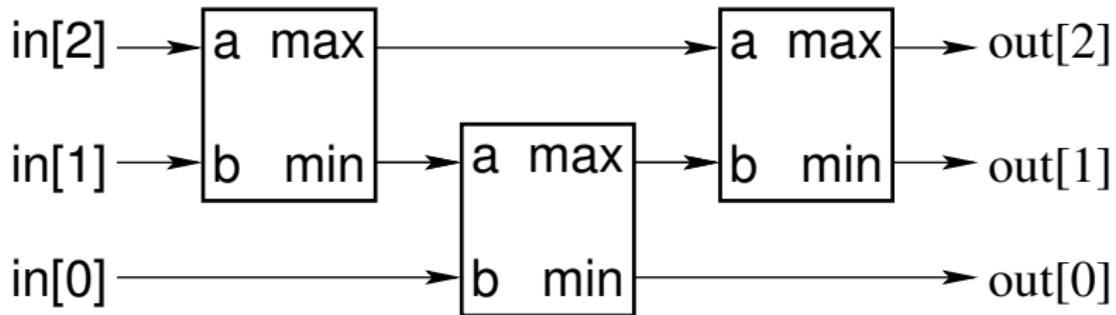
How would you write a parallel version of quicksort?

Sorting Networks

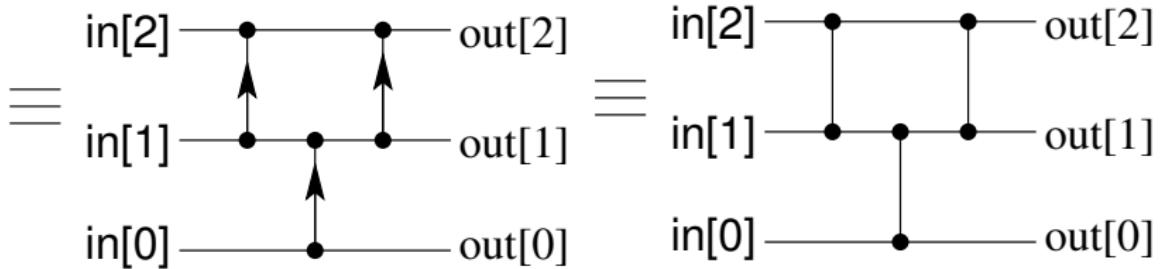
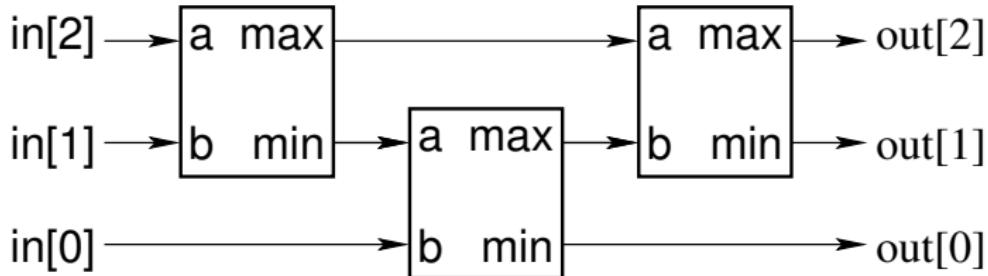
Sorting Network for 2-elements



A Sorting Network for 3-elements

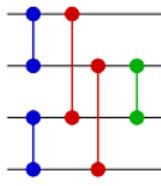


Sorting Networks – Drawing

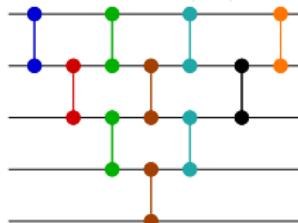


Sorting Networks – Examples

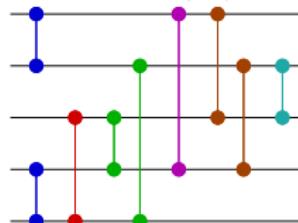
sort-4



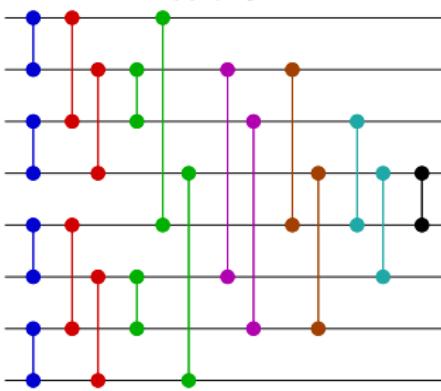
sort-5 (v1)



sort-5 (v2)



sort-8



Operations of
the same color
can be performed
in parallel.

See: <http://pages.ripco.net/~jgamble/nw.html>

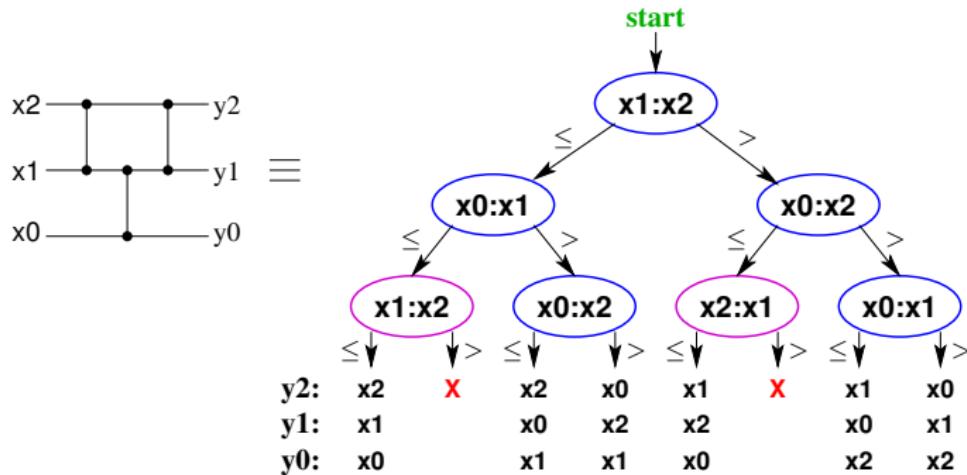
Sorting Networks: Definition

Structural version:

- A sorting network is an acyclic network consisting of compare-and-swap modules.
- I'll give an "inductive" version that makes this more rigorous on [slide 10](#).

Sorting Networks: Definition

Decision-tree version:



- Let v be an arbitrary vertex of a decision tree, and let x_i and x_j be the variables compared at vertex v .
- A decision tree is a sorting network iff for every such vertex, the left subtree is the same as the right subtree with x_i and x_j exchanged.

The 0-1 Principle

If a sorting network correctly sorts all inputs consisting only of 0s and 1s, then it correctly sorts inputs consisting of arbitrary (comparable) values.

- The 0-1 principle doesn't hold for arbitrary algorithms:
 - ▶ Consider the following linear-time “sort”
 - ▶ In linear time, count the number of zeros, nz , in the array.
 - ▶ Set the first nz elements of the array to zero.
 - ▶ Set the first remaining elements to one.
 - ▶ This correctly sorts any array consisting only of 0s and 1s, but does not correctly sort other arrays.
- By restricting our attention to sorting networks, we can use the 0-1 principle.

Sorting Networks: Inductive Definition

An N-input sorting network is either:

The identity function,

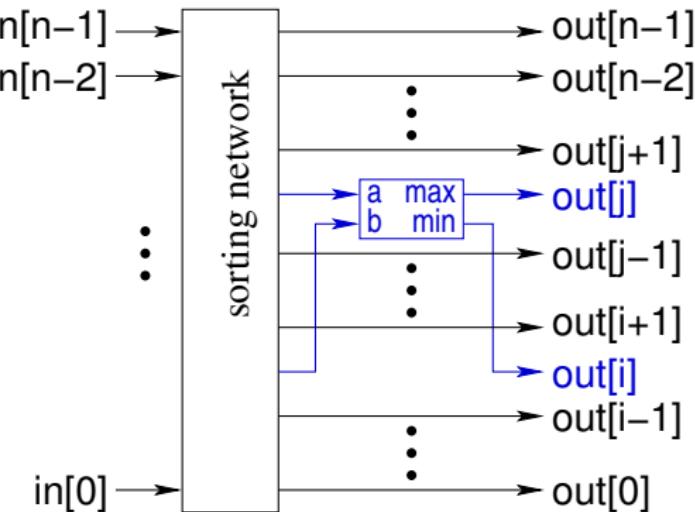
$$\text{in}[n-1] \rightarrow \text{out}[n-1]$$

$$\text{in}[n-2] \rightarrow \text{out}[n-2]$$

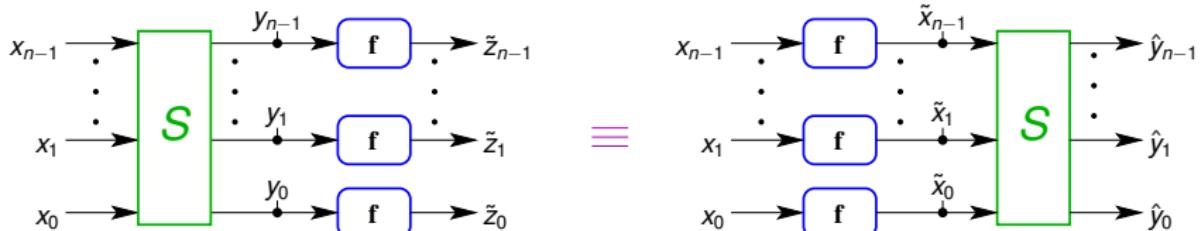
⋮

$$\text{in}[0] \rightarrow \text{out}[0]$$

or a sorting network composed with a compare-and-swap element



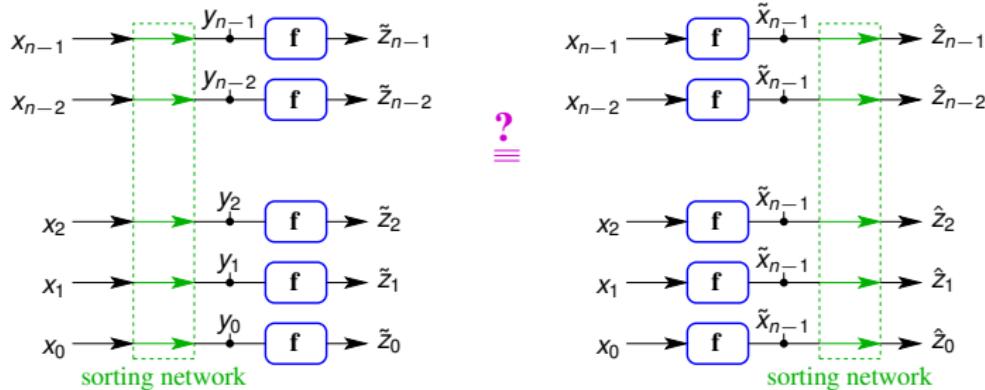
Monotonicity Lemma



Lemma: sorting networks commute with monotonic functions.

- Let S be a sorting network with n inputs and N outputs.
 - I'll write x_0, \dots, x_{n-1} to denote the inputs of S .
 - I'll write y_0, \dots, y_{n-1} to denote the outputs of S .
- Let f be a monotonic function.
 - If $x \leq y$, then $f(x) < f(y)$.
- The monotonicity lemma says
 - applying S and then f produces the same result as
 - applying f and then S .

Monotonicity Lemma – proof, Base Case

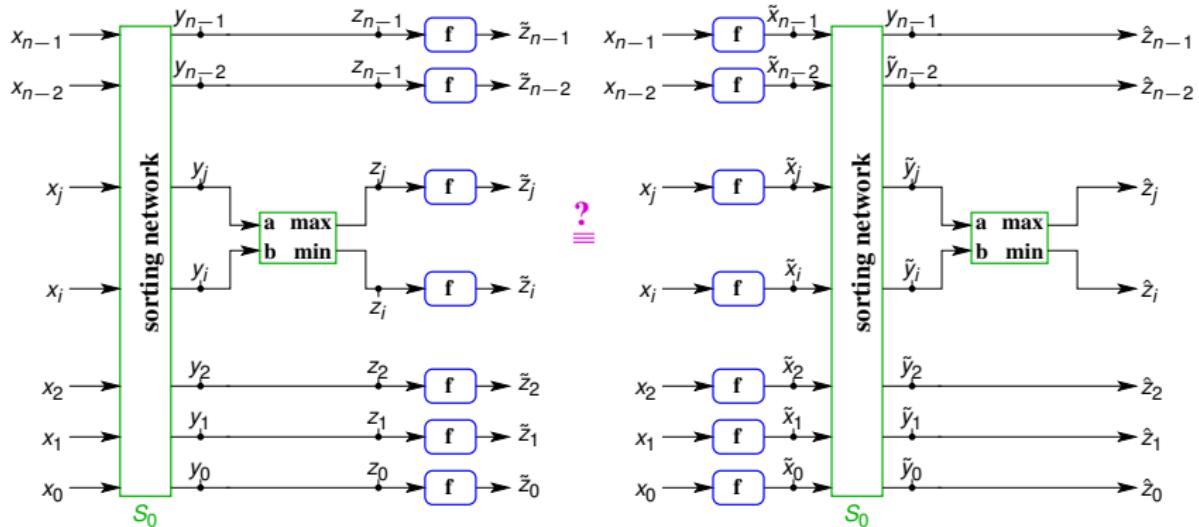


The sorting network, S , is the identity function.

$$f \bullet S = f \bullet \text{ident} = f = \text{ident} \bullet f = S \bullet f$$

Monotonicity Lemma – proof, Induction Step

Induction step: Let S_0 be a sorting network, and append a compare-and-swap to outputs i and j .



Monotonicity Lemma – proof, Induction Details

- All outputs other than i and j are unaffected by adding the new compare-and-swap module.
 - ▶ The claim follows directly from the induction hypothesis.
- For outputs i and j , we just note that the compare-and-swap operation commutes with f because f is monotonic.

$$\begin{array}{ll} y_i = \min(x_i, x_j); & w_i = f(x_i); \\ y_j = \max(x_i, x_j); & w_j = f(x_j); \\ z_i = f(y_i); & z_i = \min(w_i, w_j); \\ z_j = f(y_j); & z_j = \max(w_i, w_j); \end{array}$$

≡

The 0-1 Principle

If a sorting network correctly sorts all inputs consisting only of 0s and 1s, then it correctly sorts inputs of any values.

I'll prove the contrapositive.

- If a sorting network does not correctly sort inputs of any values, then it does not correctly sort all inputs consisting only of 0s and 1s.
- Let S be a sorting network, let x be an input vector, and let $y = S(x)$, such that there exist i and j with $i < j$ such that $y_i > y_j$.

- Let $f(x) = \begin{cases} 0, & \text{if } x < y_i \\ 1, & \text{if } x \geq y_i \end{cases}$

$$\tilde{y} = S(f(x))$$

- By the definition of f , $f(x)$ is an input consisting only of 0s and 1s.
- By the monotonicity lemma, $\tilde{y} = f(y)$. Thus,

$$\tilde{y}_i = f(y_i) = 1 > 0 = f(y_j) = \tilde{y}_j$$

- Therefore, S does not correctly sort an input consisting only of 0s and 1s.
- \square

Summary

- Sequential sorting algorithms don't parallelize in an "obvious" way because they tend to have sequential bottlenecks.
 - ▶ Later, we'll see that we can combine ideas from sorting networks and sequential sorting algorithms to get practical, parallel sorting algorithms.
- Sorting networks are a restricted class of sorting algorithms
 - ▶ Based on compare-and-swap operations.
 - ▶ They parallelize well.
 - ▶ They don't have control-flow branches – this makes them attractive for architectures with large branch-penalties.
- The zero-one principle:
 - ▶ If a sorting-network sorts all inputs of 0s and 1s correctly, then it sorts all inputs correctly.
 - ▶ This allows many sorting networks to be proven correct by counting arguments.

Preview

April 1: Bitonic Sort – the algorithm

April 4: Bitonic Sort – the code

April 6: Map Reduce

Reading: [MapReduce: Simplified Data Processing on Large Clusters](#)

April 8: PReach: Parallel Model Checking

Reading: [Industrial Strength Distributed Explicit State Model Checking](#)

But of course, we'll adjust this as we go.

Review

- Why don't traditional, sequential sorting algorithms parallelize well?
- Try to parallelize another sequential sorting algorithm such as heap sort? What issues do you encounter?
- I claimed that `max` and `min` can be computed without branches. We could work out the hardware design for a compare-and-swap module. Instead, consider an algorithm that takes two "words" as arguments – each word is represented as a list of characters. The algorithm is supposed to output the two words, but in alphabetical order. For example:

```
compareAndSwap ("cat", "dog") -> {"cat", "dog"};
compareAndSwap ("dog", "cat") -> {"cat", "dog"};
compareAndSwap (X, Y) when X <= Y -> {X, Y};
compareAndSwap (X, Y) -> {Y, X}.
```

Show that `compareAndSwap` can be implemented as a scan operation.