# Knuth's 0-1-Principle and Beyond

Janis Voigtländer

University of Bonn, Germany (visiting NII Tokyo)

February 26th, 2010

# The Sorting Problem

Task: Given a list and an order on the type of elements of this list, produce a sorted list (with same content)!

Example:



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Example:

12	7	9	8	4	6	$\mapsto$	4	6	7	8	9	12
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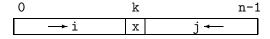
### Many Solutions:

- Quicksort
- ▶ Insertion Sort
- Merge Sort
- Bubble Sort

- 1. Choose an element x from the input list.
- 2. Partition the remaining elements into two sublists:
  - one containing all elements smaller than x, and
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- 3. Sort the two sublists recursively.
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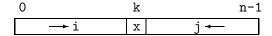
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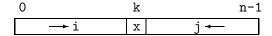
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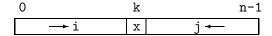
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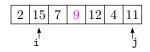


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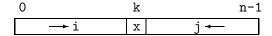
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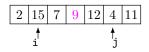




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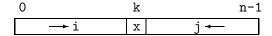
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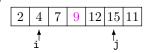




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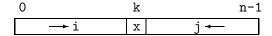
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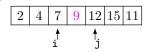




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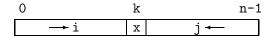
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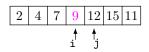




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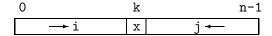
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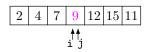




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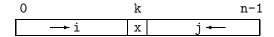
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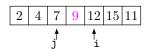




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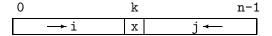
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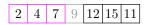




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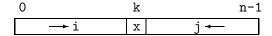
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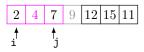




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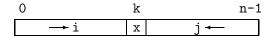
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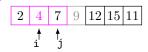




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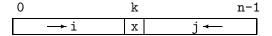
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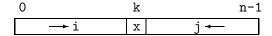
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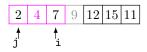




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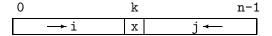
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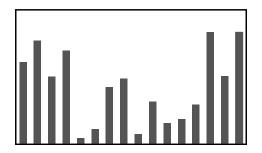
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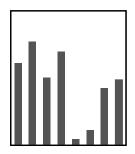
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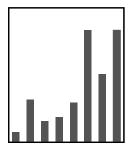
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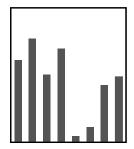


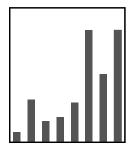
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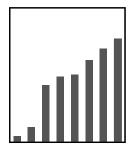


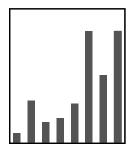
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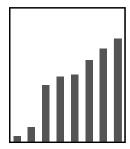


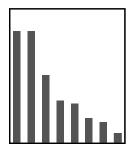
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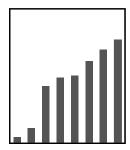


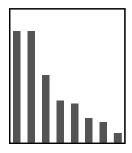
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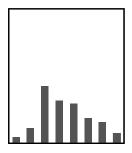


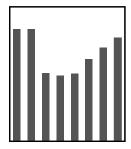
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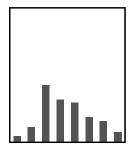


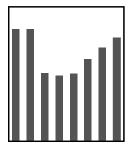
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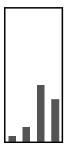


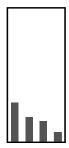
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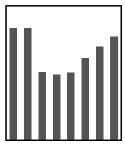




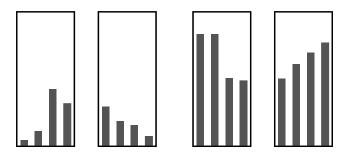
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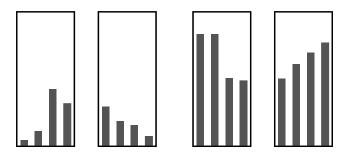




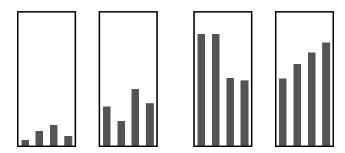
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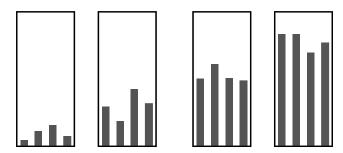
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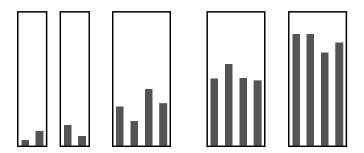
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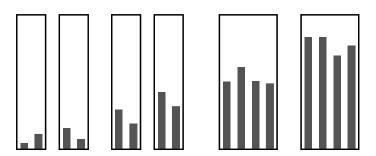
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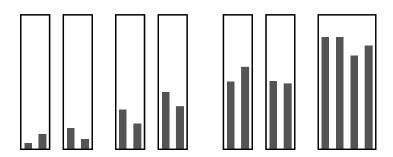
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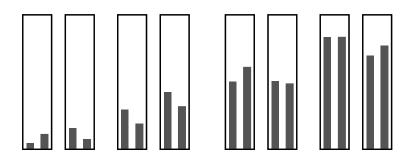
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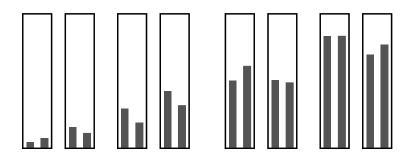
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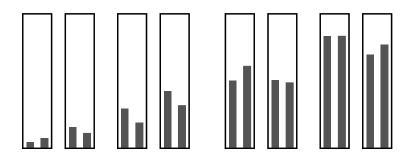
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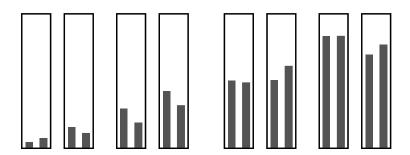
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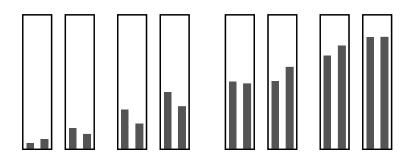
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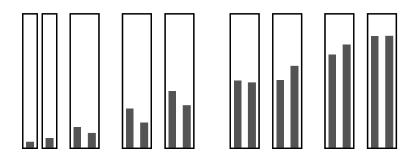
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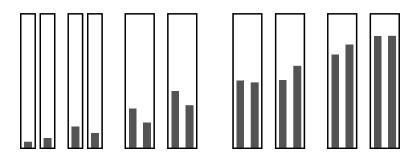
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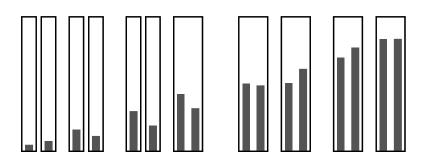
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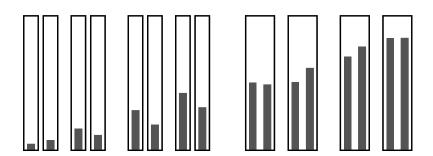
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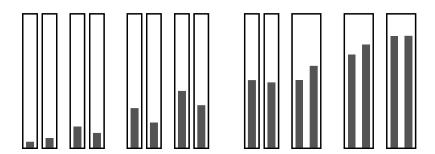
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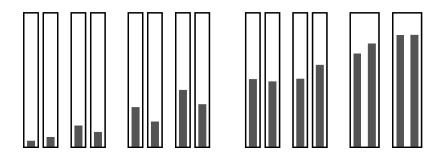
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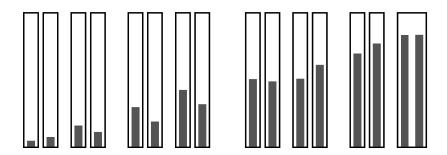
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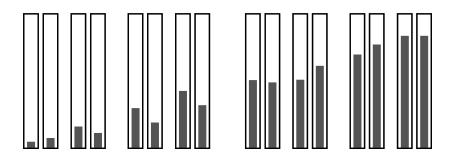
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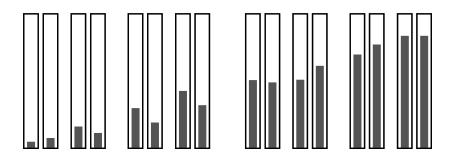
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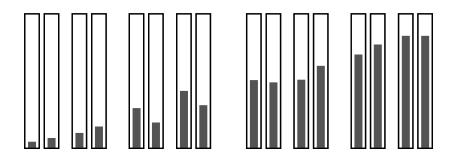
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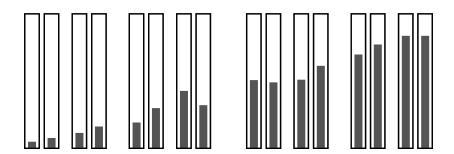
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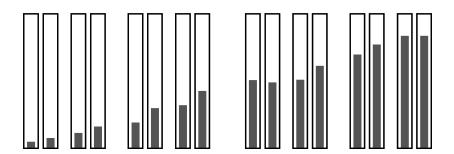
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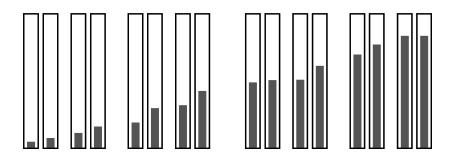
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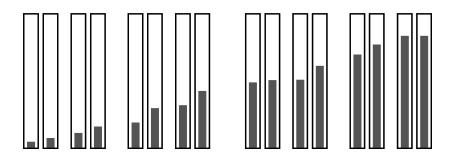
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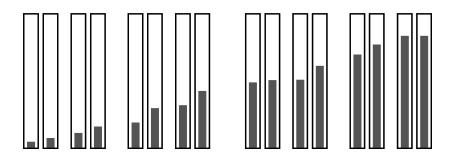
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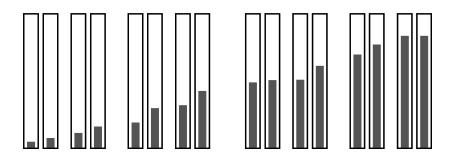
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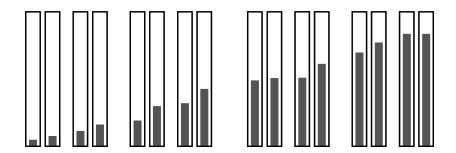
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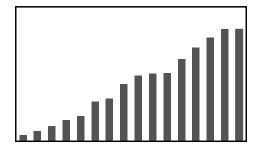
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Note: • works only for lists whose length is a power of two

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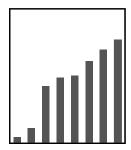
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- complexity is  $O(n \cdot \log(n)^2)$
- particularly suitable for hardware and parallel implementations

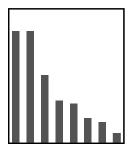
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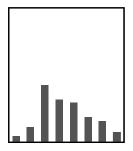
- works only for lists whose length is a power of two
- complexity is  $O(n \cdot \log(n)^2)$
- particularly suitable for hardware and parallel implementations
- correctness is not obvious

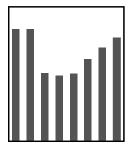
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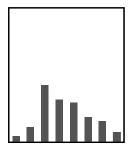


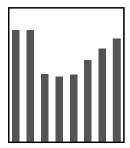
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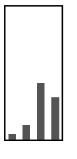


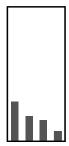
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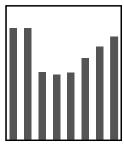




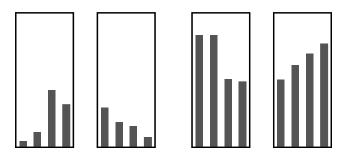
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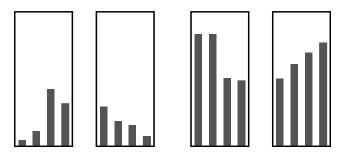




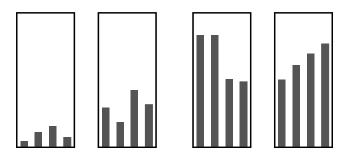
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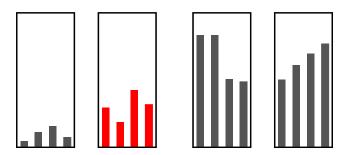
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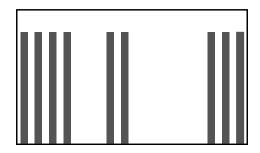
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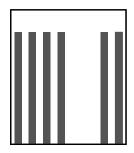
# Knuth's 0-1-Principle [Knuth 1973]

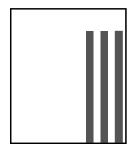
Informally: If a comparison-swap algorithm sorts Booleans correctly, it sorts integers correctly as well.

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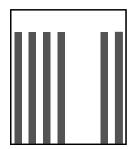


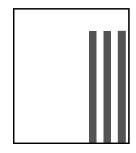
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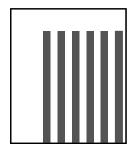


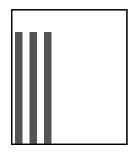
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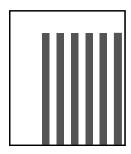


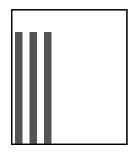
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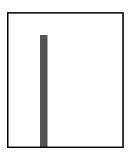


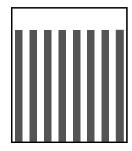
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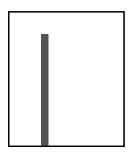


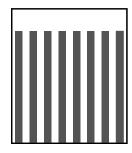
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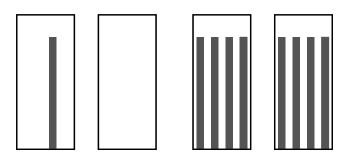


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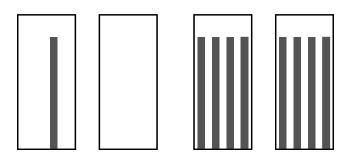




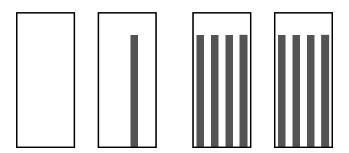
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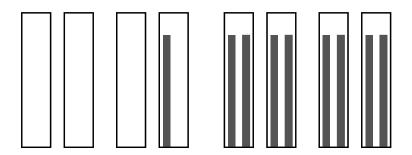
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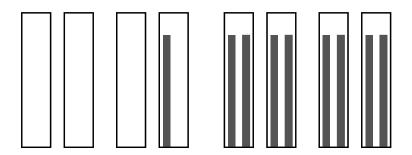
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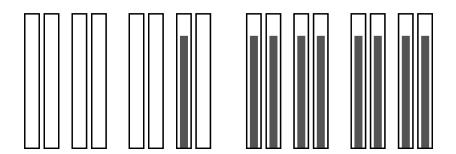
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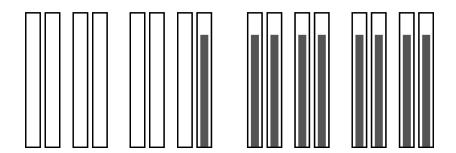
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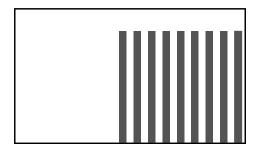
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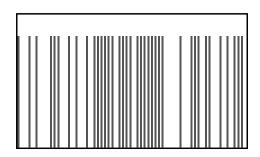
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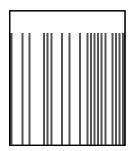
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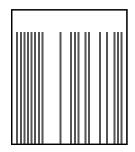


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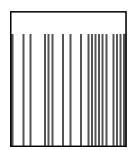


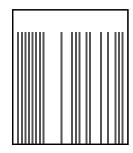
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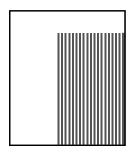


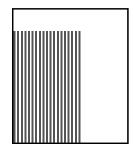
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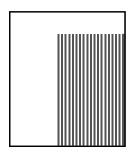


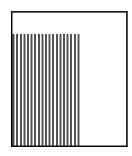
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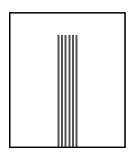


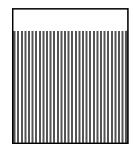
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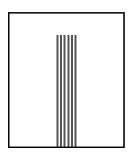


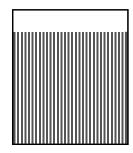
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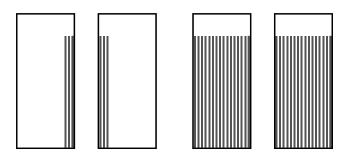


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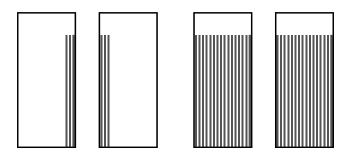




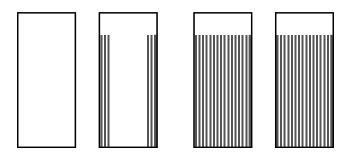
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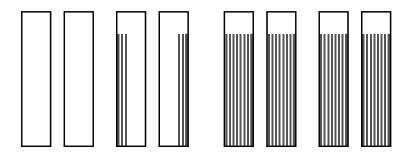
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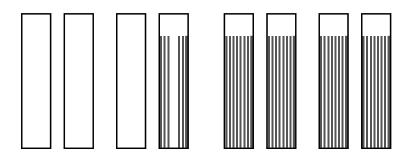
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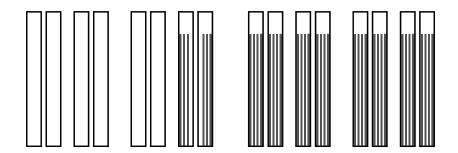
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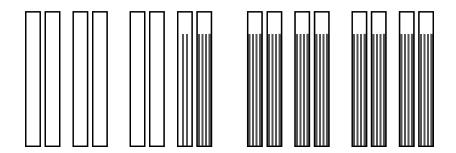
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# Knuth's 0-1-Principle [Knuth 1973]

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If for every xs :: [Bool], sort g xs gives the correct result, then for every xs :: [Int], sort f xs gives the correct result.

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If \forall xs :: [Bool], ys = sort \ g \ xs. \ P(xs, ys) \land Q(ys), then \forall xs :: [Int], ys = sort \ f \ xs. \ P(xs, ys) \land Q(ys), where P(xs, ys) := xs and ys contain the same elements in the same multiplicity Q(ys) := ys is sorted
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## Free Theorems [Reynolds 1983, Wadler 1989]

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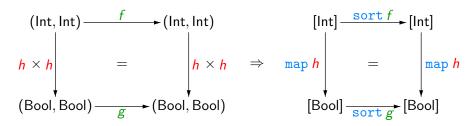
#### Free Theorems [Reynolds 1983, Wadler 1989]

Here just a magic black box.

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Input: sort::((a,a)->(a,a))->[a]->[a]
Output: forall t1,t2 in TYPES, h::t1->t2.
        forall f::(t1,t1) \to (t1,t1).
         forall g::(t2,t2) \rightarrow (t2,t2).
           (forall (x,y) in lift_\{(,)\}(h,h).
             (f x,g y) in lift_{(,)}(h,h))
           ==> (forall xs::[t1].
                 map h (sort f xs) = sort g (map h xs))
       lift_{(,)}(h,h)
        = \{((x1,x2),(y1,y2)) \mid (h x1 = y1)\}
                                 && (h x2 = y2)}
       map h [] = []
       map h (x:xs) = (h x):(map h xs)
```

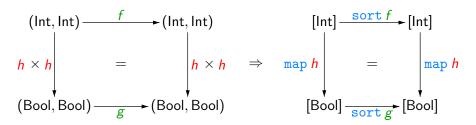
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For every sort :: ((\alpha, \alpha) \to (\alpha, \alpha)) \to [\alpha] \to [\alpha], f :: (Int, Int) \to (Int, Int), g :: (Bool, Bool) \to (Bool, Bool), and h :: Int \to Bool:
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If f and g are as defined before, then the precondition is fulfilled for any h of the form  $h \times n < \infty$  for some n :: Int.

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- ► Free theorems allow for a particularly elegant proof of this principle. (This was not my idea: [Day et al. 1999]!)
- ▶ Can we do something similar for other algorithm classes?
- ▶ Good candidates: algorithms parametrised over some operation, like  $cswap :: (\alpha, \alpha) \to (\alpha, \alpha)$  in the case of sorting.

#### Parallel Prefix Computation

Given: inputs  $x_1, \ldots, x_n$  and an associative operation  $\oplus$ 

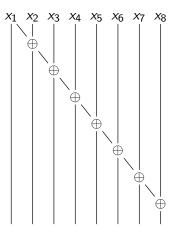
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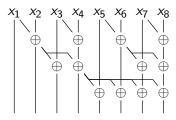
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Solution:

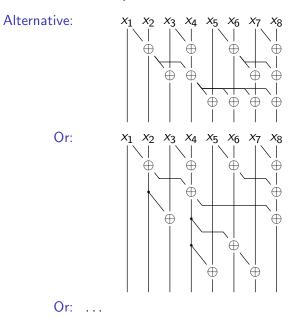


#### Parallel Prefix Computation

Alternative:



#### Parallel Prefix Computation



19

#### In Haskell

Functions of type:

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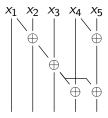
For example, à la [Sklansky 1960]:

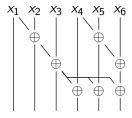
```
\begin{array}{l} \operatorname{sklansky} :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha] \\ \operatorname{sklansky} (\oplus) \ [x] = [x] \\ \operatorname{sklansky} (\oplus) \ xs = us + + vs \\ \operatorname{where} \ t &= ((\operatorname{length} \ xs) + 1) \ \text{`div'} \ 2 \\ (ys, zs) = \operatorname{splitAt} \ t \ xs \\ us &= \operatorname{sklansky} (\oplus) \ ys \\ vs &= [(\operatorname{last} \ us) \oplus v \ | \ v \leftarrow \operatorname{sklansky} (\oplus) \ zs] \end{array}
```

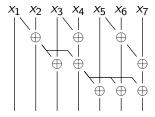


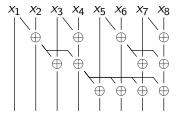


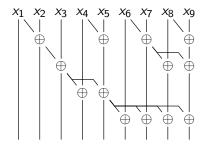


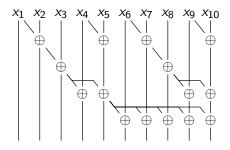


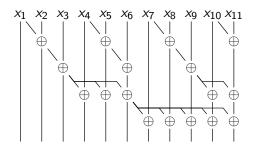


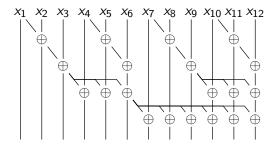


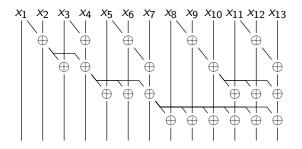


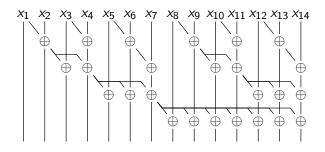


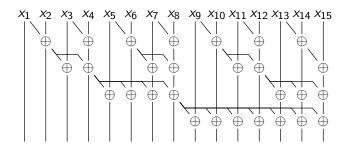


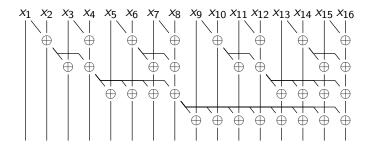


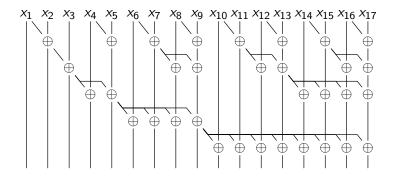


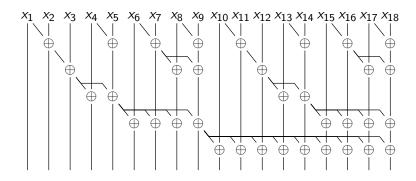


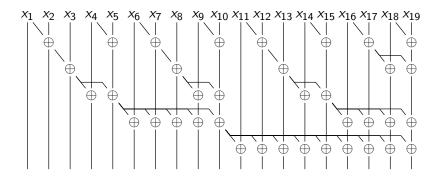


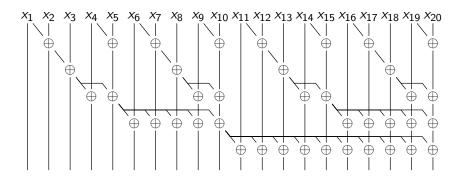










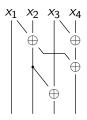


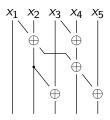
# Or, à la [Brent & Kung 1980] (code follows [Sheeran 2007])

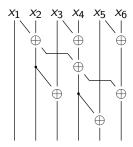
```
brentKung :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]
brentKung (\oplus) [x] = [x]
brentKung (\oplus) xs = odds (riffle (par (unriffle (evens xs))))
    where evens []
                     =[]
            evens [x] = [x]
            evens (x : y : zs) = [x, x \oplus y] + evens zs
            unriffle [] = ([],[])
            unriffle [x] = ([x], [])
            unriffle (x : y : zs) = (x : xs, y : ys)
                 where (xs, ys) = unriffle zs
            par(xs, ys) = (xs, brentKung(\oplus) ys)
            riffle ([],[]) = []
            riffle([x],[]) = [x]
            riffle(x:xs,y:ys) = x:y:riffle(xs,ys)
            odds (x : xs) = x : evens xs
```

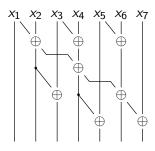


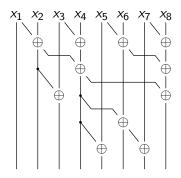


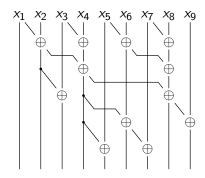


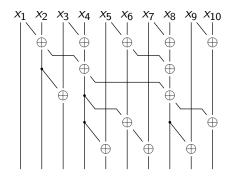


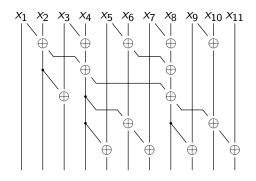


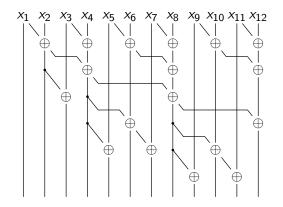


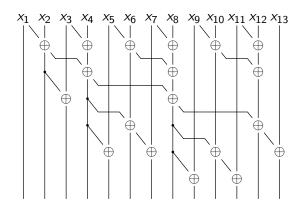


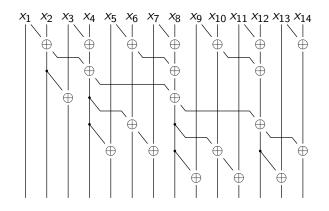


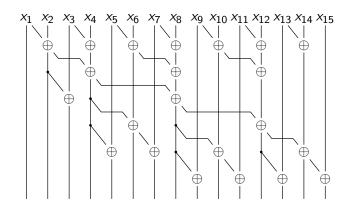


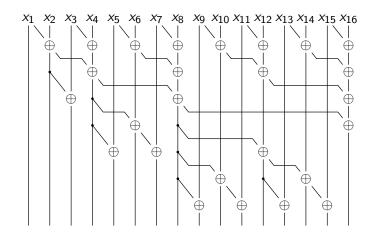


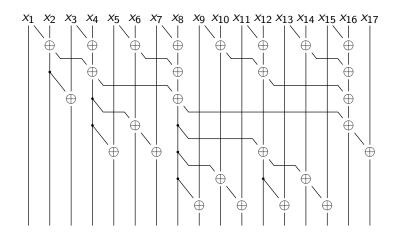


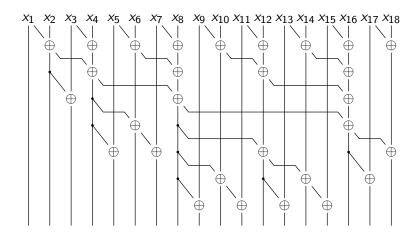


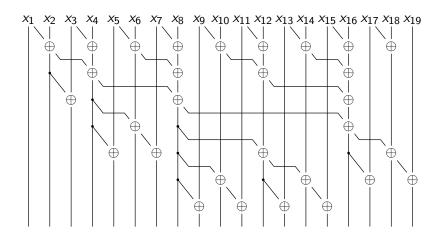


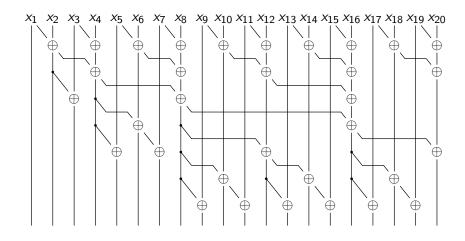


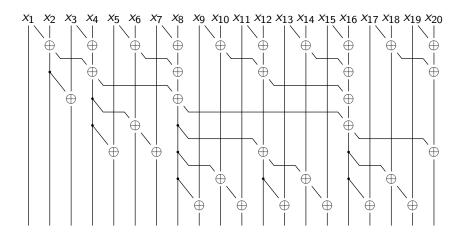












Wanted: reasoning principles, verification techniques, systematic testing approach, . . .

## Investigating Particular Instances Only

#### Knuth's 0-1-Principle

If a comparison-swap algorithm sorts correctly on the Booleans, it does so on arbitrary totally ordered value sets.

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If a parallel prefix algorithm is correct (for associative operations) on the Booleans, it is so on arbitrary value sets.

#### Unfortunately not!

```
Given: scanl1:: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]

scanl1 (\oplus) (x : xs) = go \times xs

where go \times [] = [x]

go \times (y : ys) = x : (go (x \oplus y) ys)
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```
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candidate :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]
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candidate :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]

data Three = Zero | One | Two
```

Given: 
$$\operatorname{scanl1} :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]$$
 $\operatorname{scanl1} (\oplus) (x : xs) = \operatorname{go} x xs$ 
 $\operatorname{where} \operatorname{go} x [] = [x]$ 
 $\operatorname{go} x (y : ys) = x : (\operatorname{go} (x \oplus y) ys)$ 

$$\operatorname{candidate} :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]$$

$$\operatorname{data} \operatorname{Three} = \operatorname{Zero} | \operatorname{One} | \operatorname{Two}$$

$$\operatorname{Theorem:} \text{ If for every } xs :: [\operatorname{Three}] \text{ and associative}$$
 $(\oplus) :: \operatorname{Three} \to \operatorname{Three} \to \operatorname{Three},$ 

$$\operatorname{candidate} (\oplus) xs = \operatorname{scanl1} (\oplus) xs,$$

then the same holds for every type  $\tau$ ,  $xs:[\tau]$ , and associative  $(\oplus)::\tau\to\tau\to\tau$ .

A question: What can candidate ::  $(\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]$  do, given an operation  $\oplus$  and input list  $[x_1, \dots, x_n]$  ?

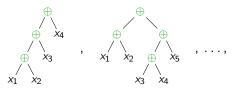
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The answer: Create an output list consisting of expressions built from  $\oplus$  and  $x_1, \dots, x_n$ . Independently of the  $\alpha$ -type!

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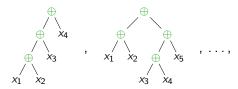
Among these expressions, there are good ones:



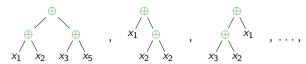
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Among these expressions, there are good ones:



#### bad ones:



Among these expressions, there are good ones:



#### bad ones:



and ones in the wrong position:

## That's How!

#### Let

$\oplus_1$	Zero	One	Two	and	$\oplus_2$	Zero	One	Two
Zero	Zero	One	Two		Zero	Zero	One	Two
	One				One	One	One	Two
Two	Two	Two	Two		Two	Two	One	Two

#### That's How!

Let

$\oplus_1$	Zero	One	Two	and	$\oplus_2$	Zero	One	Two
Zero	Zero	One	Two		Zero	Zero	One	Two
One	One	Two	Two		One	One	One	Two
Two	Two	Two	Two		Two	Two	One	Two

If candidate  $(\oplus_1)$  is correct on each list of the form

$$[(\mathsf{Zero},)^* \ \mathsf{One} \ (,\mathsf{Zero})^* \ (,\mathsf{Two})^*]$$

#### That's How!

Let

$\oplus_{1}$	Zero	One	Two	and	$\oplus_2$	Zero	One	Two
Zero	Zero	One	Two		Zero	Zero	One	Two
One	One	Two	Two		One	One	One	Two
Two	Two	Two	Two		Two	Two	One	Two

If candidate  $(\oplus_1)$  is correct on each list of the form

$$[(Zero,)^* One (,Zero)^* (,Two)^*]$$

and candidate  $(\oplus_2)$  is correct on each list of the form

$$[(Zero,)^* One, Two (,Zero)^*]$$

then candidate is correct for associative  $\oplus$  at arbitrary type.

Given: 
$$\operatorname{scanl1} :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]$$
 $\operatorname{scanl1} (\oplus) (x : xs) = \operatorname{go} x xs$ 
 $\operatorname{where} \operatorname{go} x [] = [x]$ 
 $\operatorname{go} x (y : ys) = x : (\operatorname{go} (x \oplus y) ys)$ 

$$\operatorname{candidate} :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]$$

$$\operatorname{data} \operatorname{Three} = \operatorname{Zero} | \operatorname{One} | \operatorname{Two}$$

$$\operatorname{Theorem:} \text{ If for every } xs :: [\operatorname{Three}] \text{ and associative}$$
 $(\oplus) :: \operatorname{Three} \to \operatorname{Three} \to \operatorname{Three},$ 

$$\operatorname{candidate} (\oplus) xs = \operatorname{scanl1} (\oplus) xs,$$

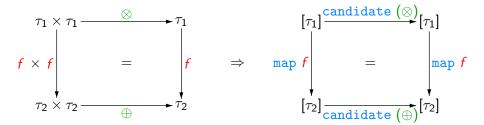
then the same holds for every type  $\tau$ ,  $xs:[\tau]$ , and associative  $(\oplus)::\tau\to\tau\to\tau$ .

### Using a Free Theorem (Generator)

```
Input: candidate :: (a \rightarrow a \rightarrow a) \rightarrow [a] \rightarrow [a]
Output: forall t1,t2 in TYPES, f :: t1 -> t2.
          forall g :: t1 -> t1 -> t1.
            forall h :: t2 -> t2 -> t2.
               (forall x :: t1. forall y :: t1.
                  f(g x y) = h(f x)(f y)
               ==> (forall z :: [t1].
                       map f (candidate g z)
                        = candidate h (map f z))
```

#### Rephrased

For every choice of types  $\tau_1, \tau_2$  and functions  $f :: \tau_1 \to \tau_2$ ,  $(\otimes) :: \tau_1 \to \tau_1 \to \tau_1$ , and  $(\oplus) :: \tau_2 \to \tau_2 \to \tau_2$ :



Given: 
$$\operatorname{scanl1} :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]$$
 $\operatorname{scanl1} (\oplus) (x : xs) = \operatorname{go} x xs$ 
 $\operatorname{where} \operatorname{go} x [] = [x]$ 
 $\operatorname{go} x (y : ys) = x : (\operatorname{go} (x \oplus y) ys)$ 

$$\operatorname{candidate} :: (\alpha \to \alpha \to \alpha) \to [\alpha] \to [\alpha]$$

$$\operatorname{data} \operatorname{Three} = \operatorname{Zero} | \operatorname{One} | \operatorname{Two}$$

$$\operatorname{Theorem:} \text{ If for every } xs :: [\operatorname{Three}] \text{ and associative}$$
 $(\oplus) :: \operatorname{Three} \to \operatorname{Three},$ 

$$\operatorname{candidate} (\oplus) xs = \operatorname{scanl1} (\oplus) xs,$$

$$\operatorname{then the same holds for every type} \tau, xs :: [\tau], \text{ and}$$

associative  $(\oplus) :: \tau \to \tau \to \tau$ .

31

```
Proposition 1: If candidate (\oplus_1) is correct on each list of the form [(\mathsf{Zero},)^*] One (\mathsf{Zero})^* (\mathsf{Two})^* and candidate (\oplus_2) is correct on each list of the form [(\mathsf{Zero},)^*] One, [\mathsf{Two},] One, [\mathsf{Two},] then for every [\mathsf{Ive}] one, [\mathsf{Ive}] is [\mathsf{Ive}] one, [\mathsf{Ive}]
```

Proposition 1: If candidate  $(\oplus_1)$  is correct on each list of the form  $[(\mathsf{Zero},)^*]$  One  $(\mathsf{Zero})^*$   $(\mathsf{Two})^*$  and candidate  $(\oplus_2)$  is correct on each list of the form  $[(\mathsf{Zero},)^*]$  One,  $\mathsf{Two}$   $(\mathsf{Zero})^*$ , then for every  $n \geq 0$ ,

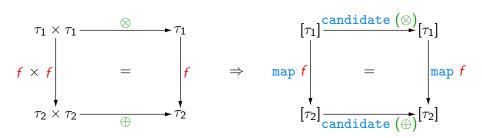
candidate (++) [[k] |  $k \leftarrow [0..n]$ ] = [[0..k] |  $k \leftarrow [0..n]$ ] (\*).

Proposition 2: If for every  $n \ge 0$ , (\*) holds, then candidate is correct for associative  $\oplus$  at arbitrary type.

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candidate 
$$(++)$$
 [[k] |  $k \leftarrow [0..n]$ ] = [[0..k] |  $k \leftarrow [0..n]$ ] (\*).

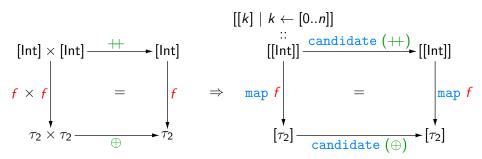
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#### What Else?

► For parallel prefix computation, formalisation available in Isabelle/HOL [Böhme 2007].

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► There is still an interesting story to tell behind how "0-1-2",  $\oplus_1$ ,  $\oplus_2$ , ... were found.

For which other algorithm classes can one play the same trick?

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Theorems for free!

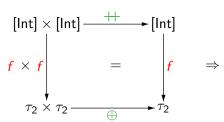
In Functional Programming Languages and Computer Architecture, Proceedings, pages 347–359. ACM Press, 1989.

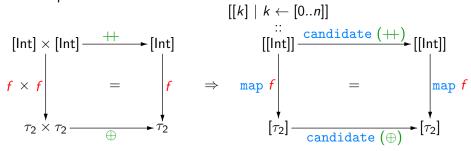
Let  $xs := [\tau_2]$  with length (n+1).

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$$f = foldl1 (\oplus) \circ map (xs!!)$$

the precondition of

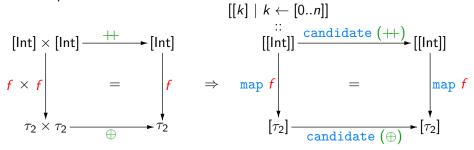




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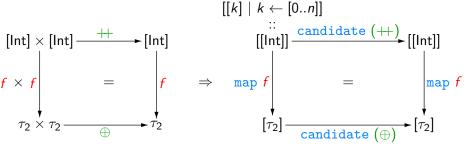


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Hence, then:

$$\begin{array}{l} \operatorname{map} f \left( \operatorname{candidate} \left( + \right) \left[ \left[ k \right] \mid k \leftarrow [0..n] \right] \right) \\ = \operatorname{candidate} \left( \oplus \right) \left( \operatorname{map} f \left[ \left[ k \right] \mid k \leftarrow [0..n] \right] \right) \end{array}$$

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