

# Knuth's 0-1-Principle and Beyond

Janis Voigtländer

University of Bonn

October 18th, 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)!

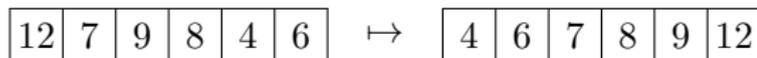
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**Many Solutions:**

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

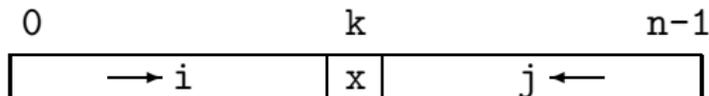
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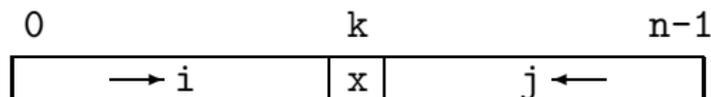
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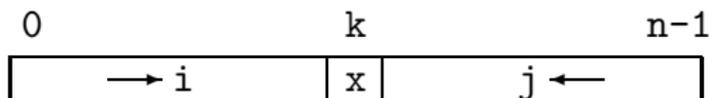
Example:

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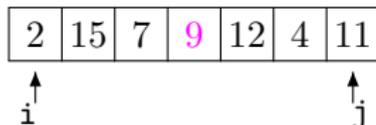
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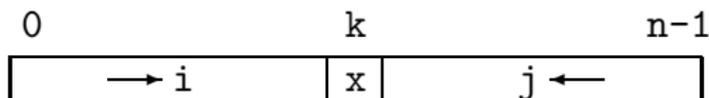




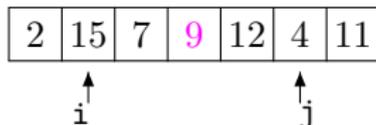
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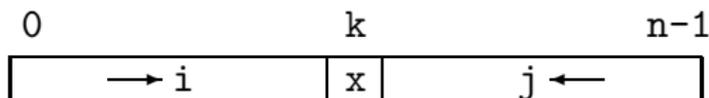
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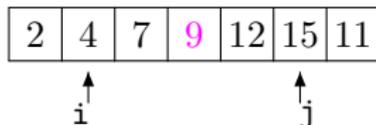
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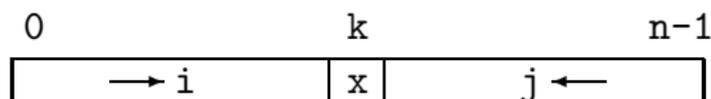
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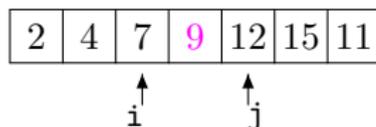
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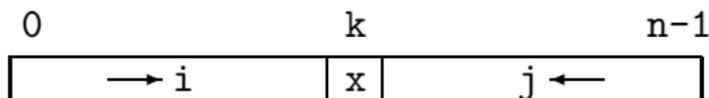
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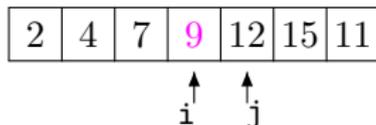
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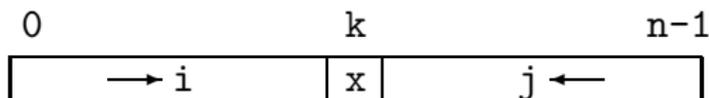




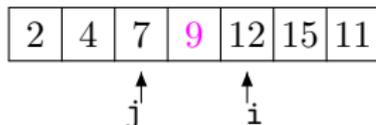
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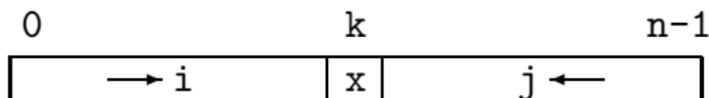
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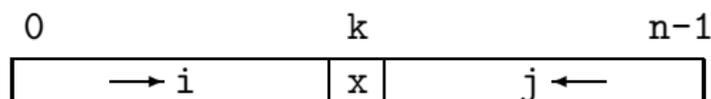
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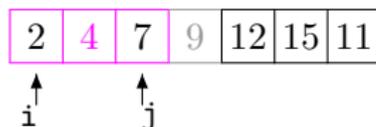
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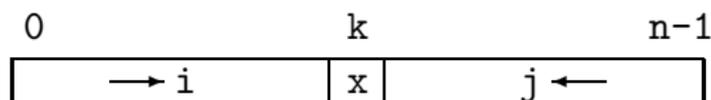
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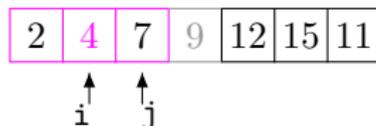
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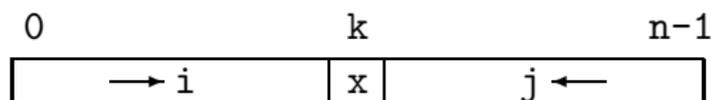




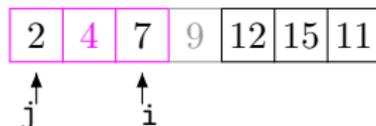
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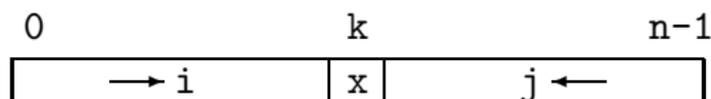
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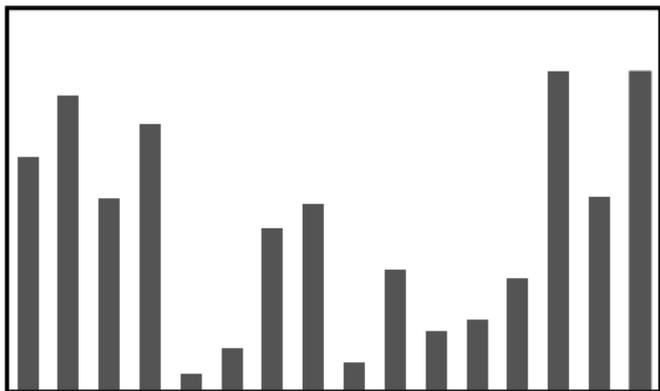
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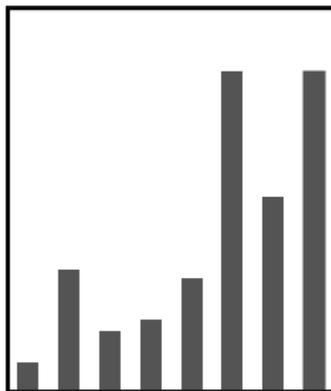
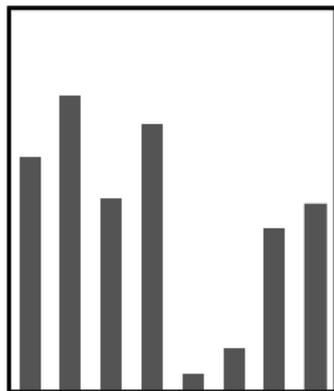
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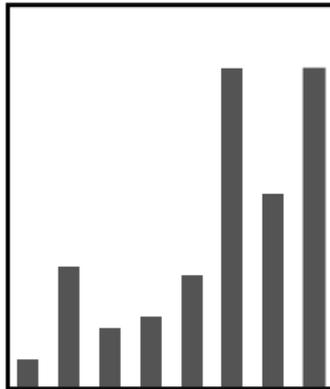
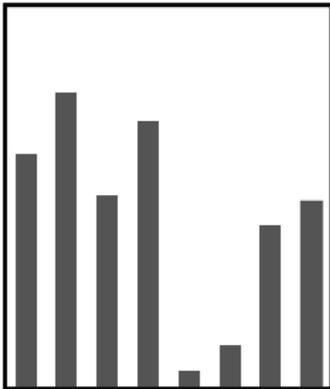
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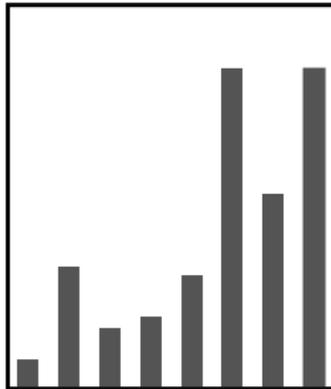
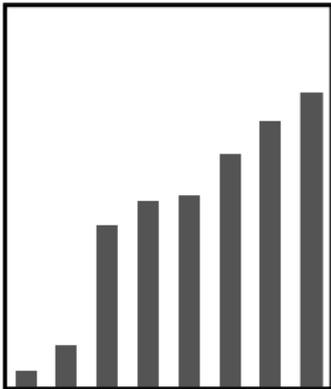
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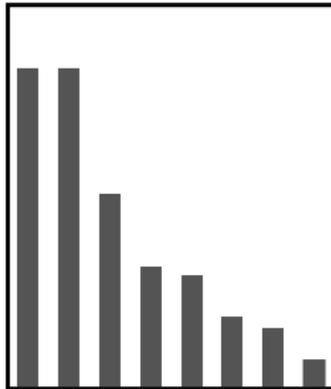
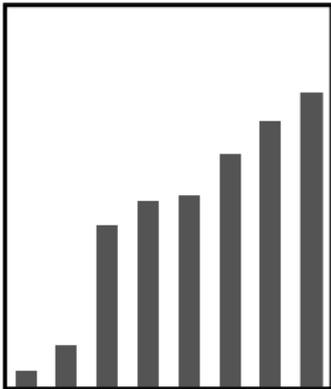
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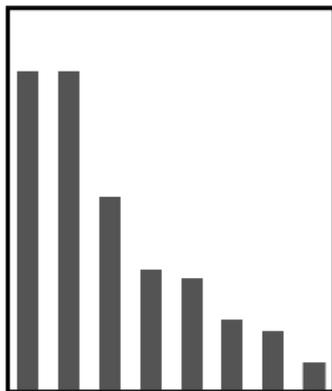
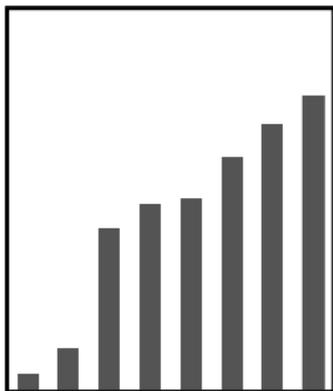
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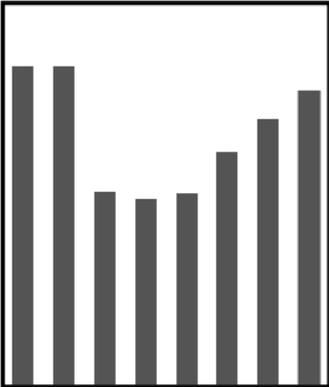
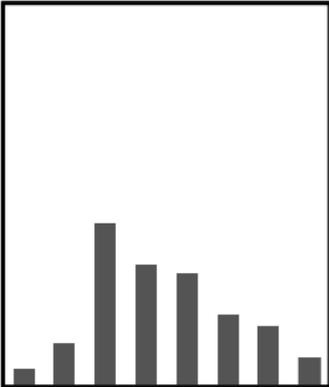
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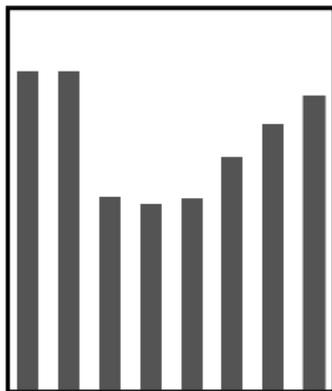
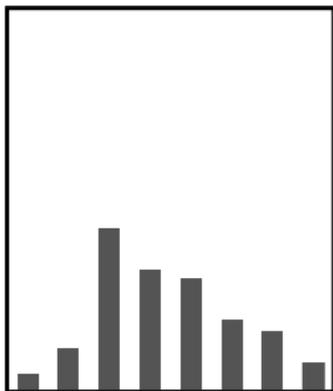
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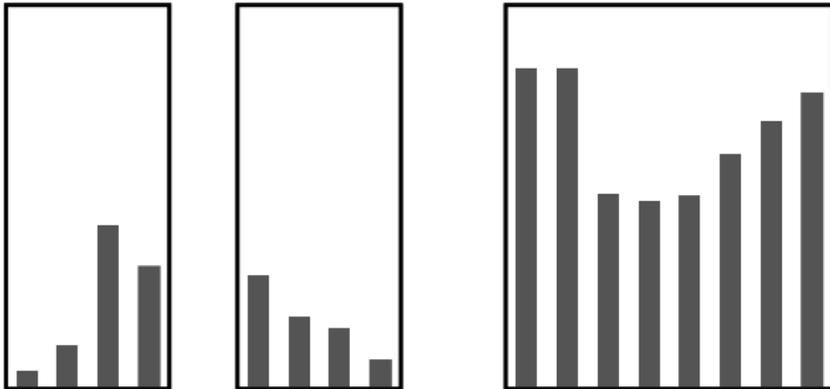
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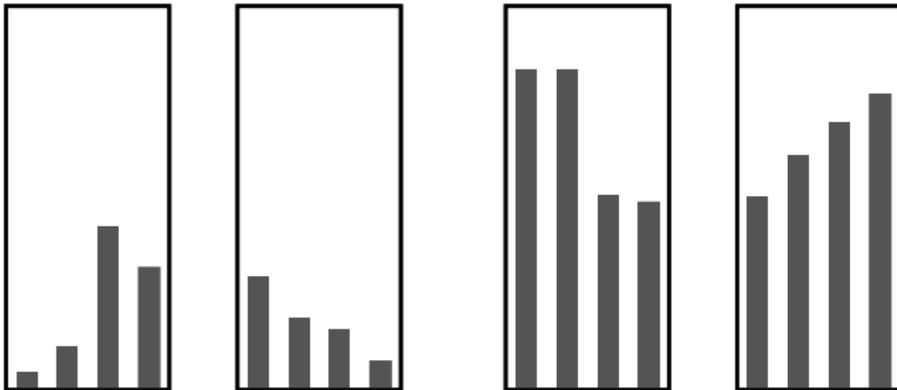
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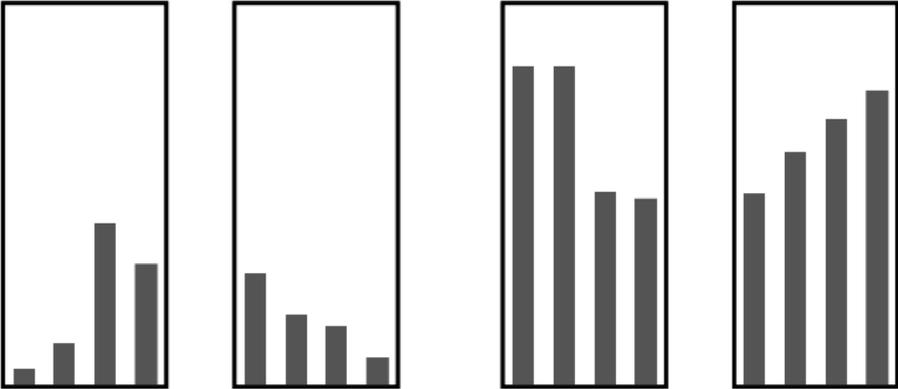
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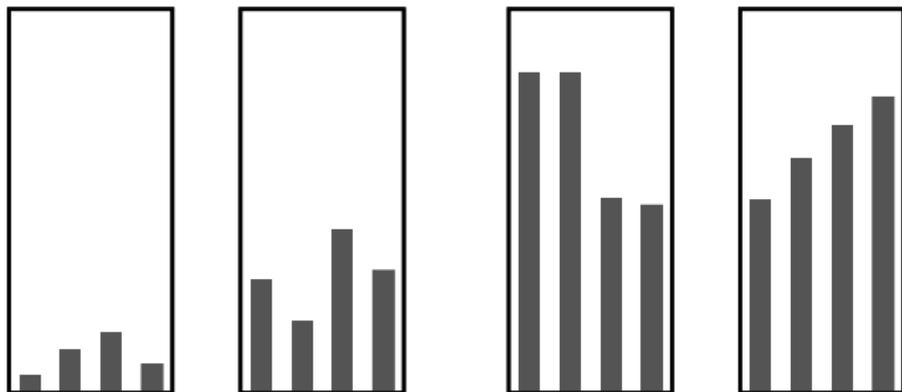
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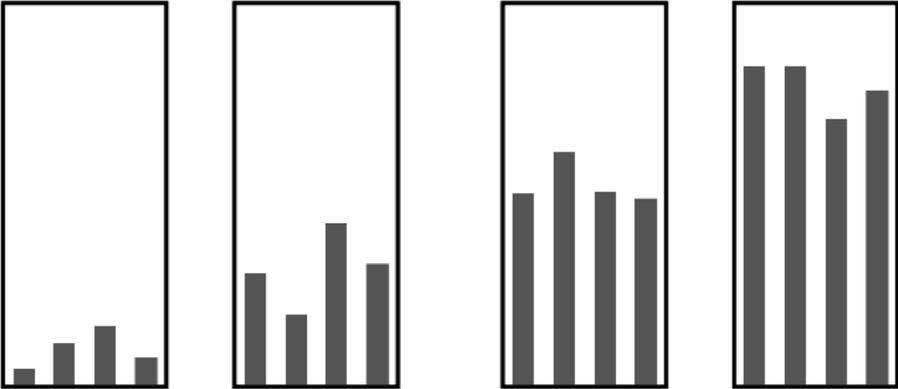
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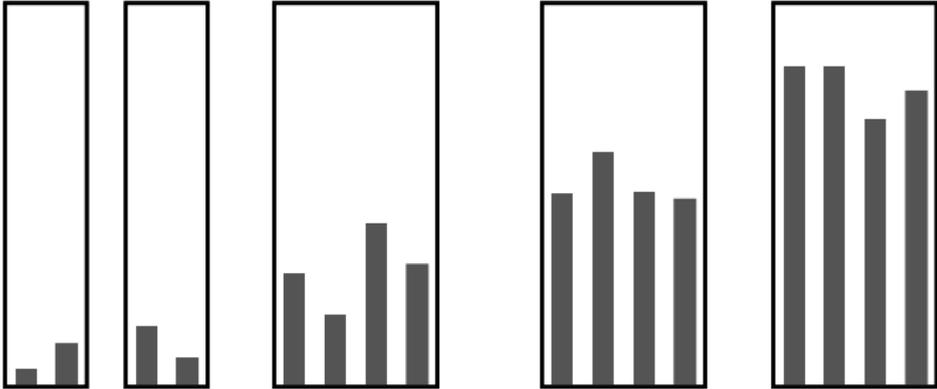
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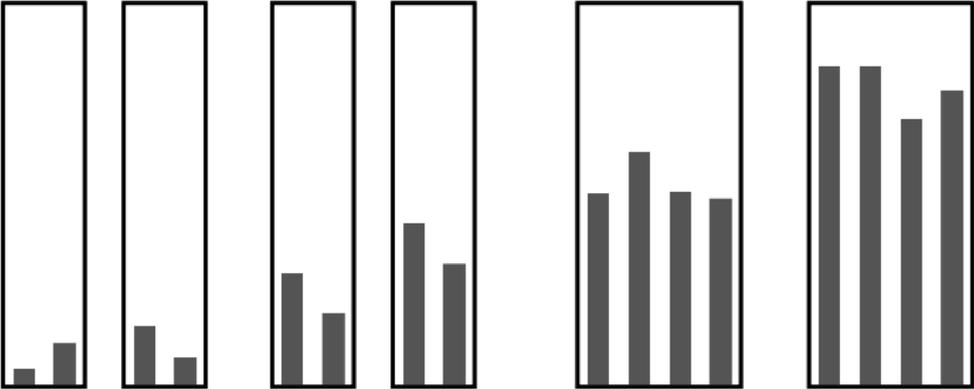
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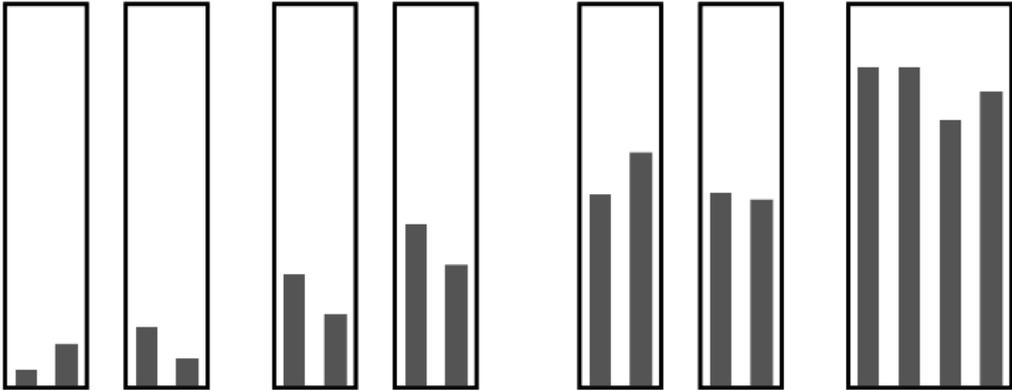
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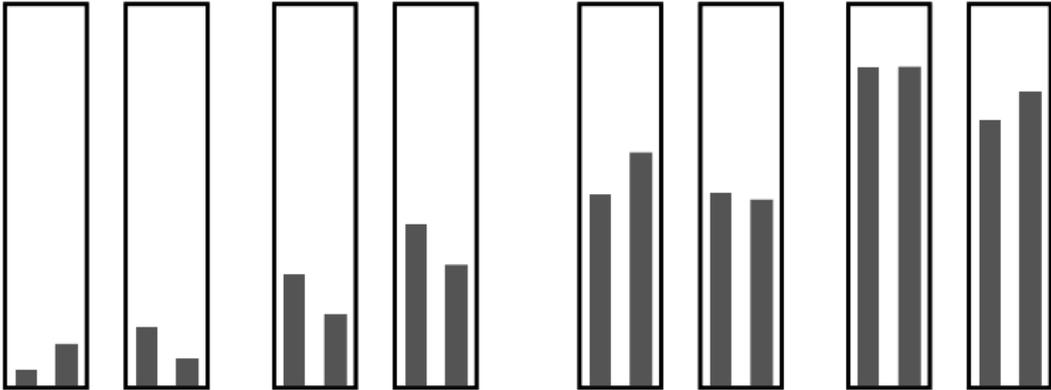
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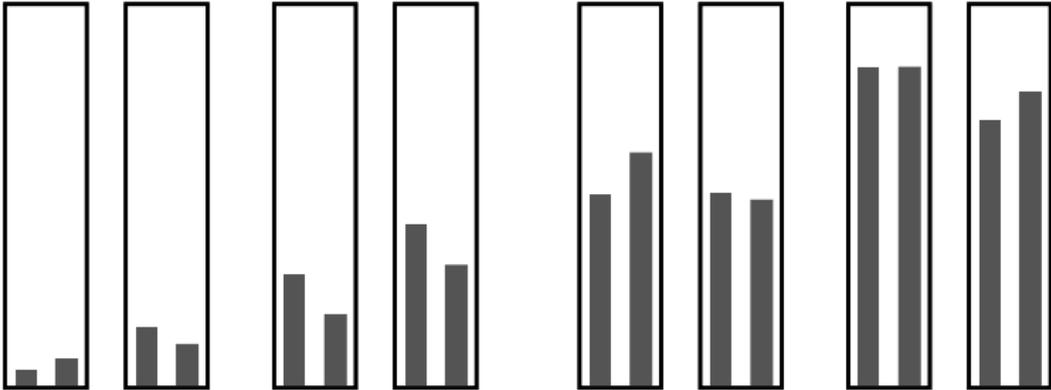
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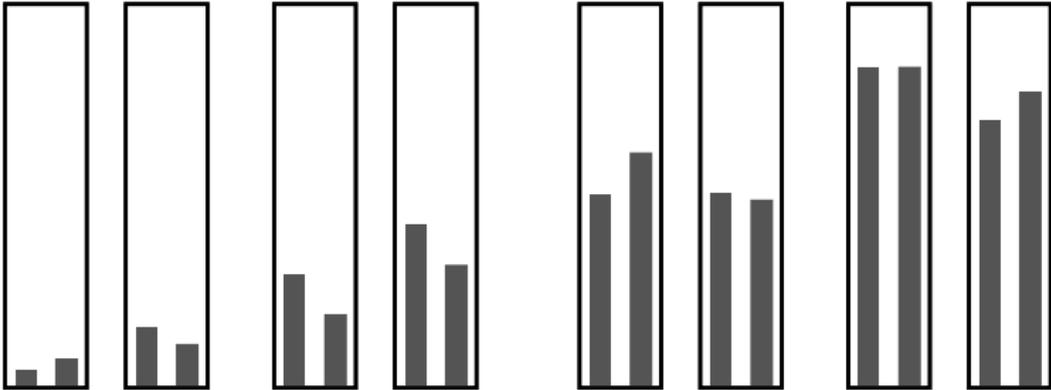
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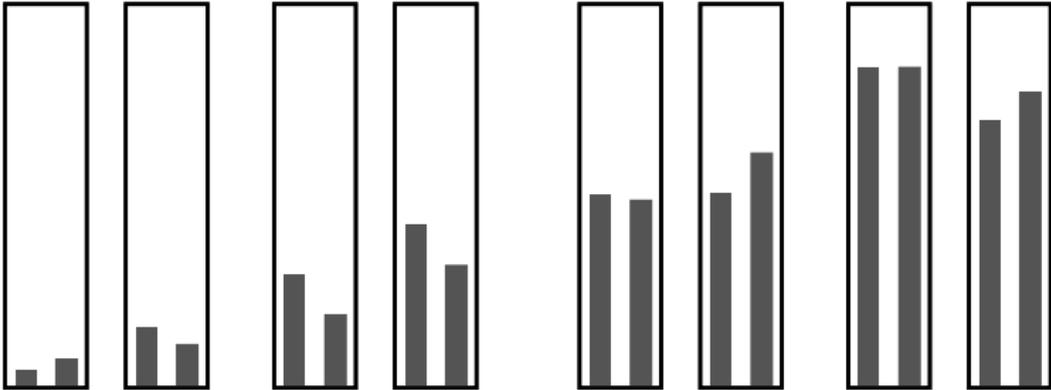
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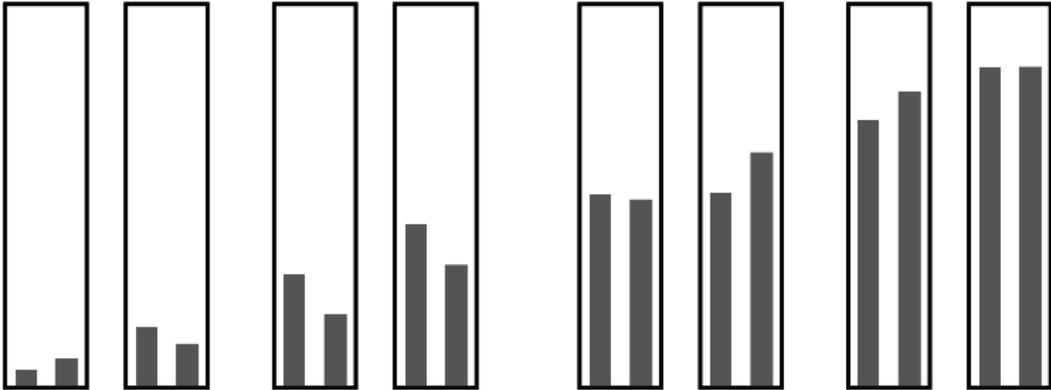
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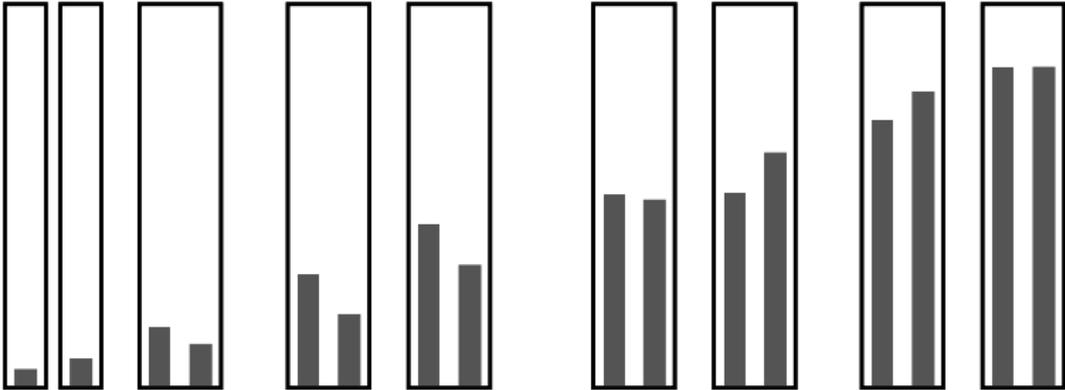
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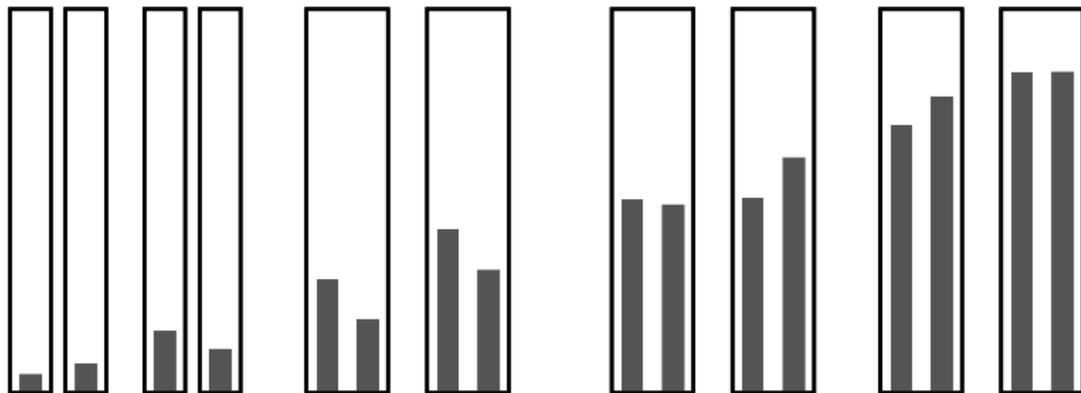
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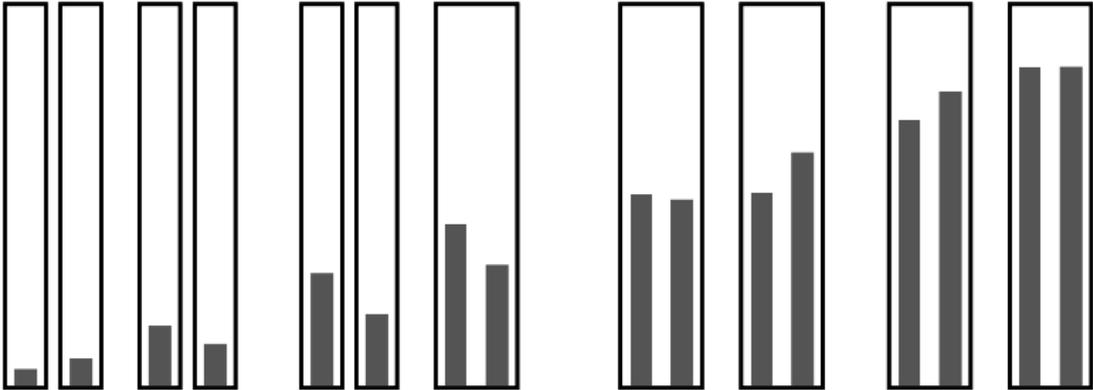
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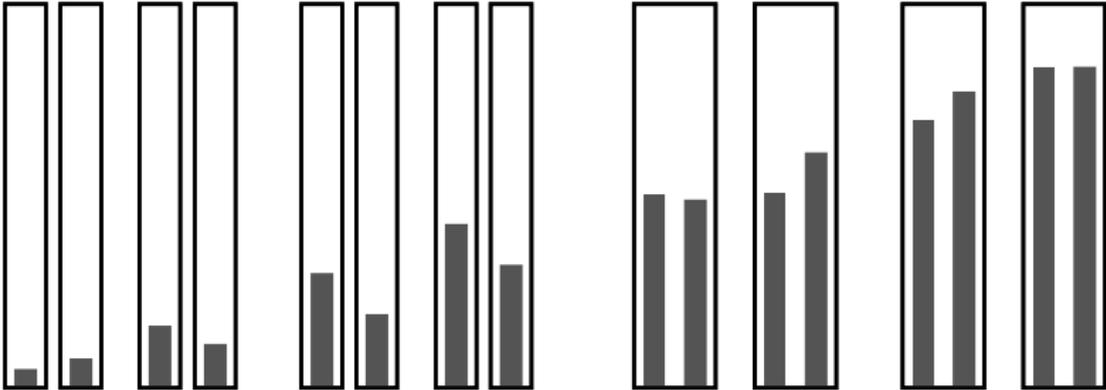
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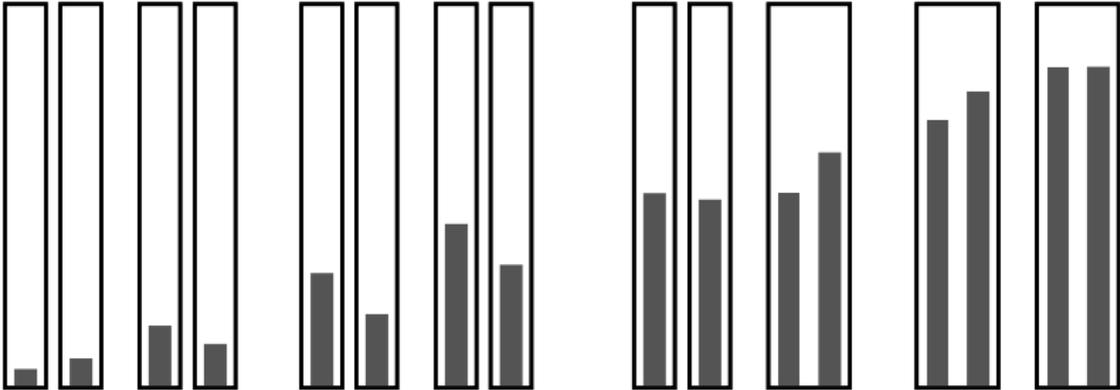
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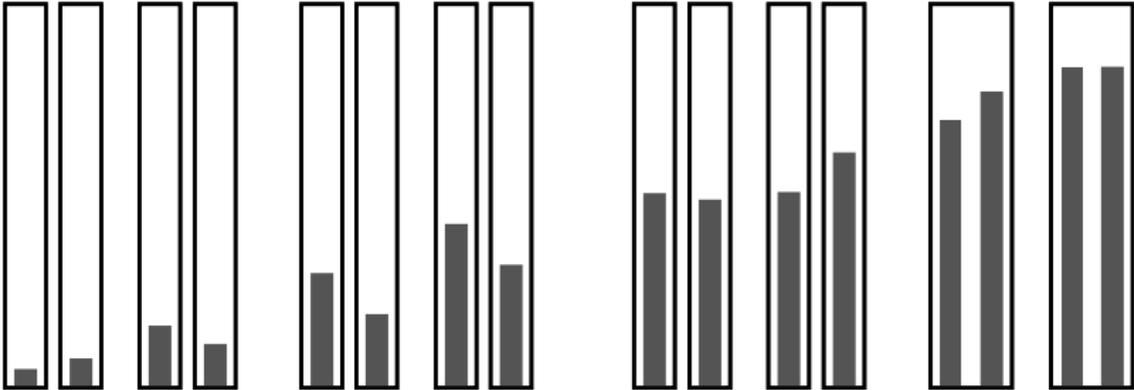
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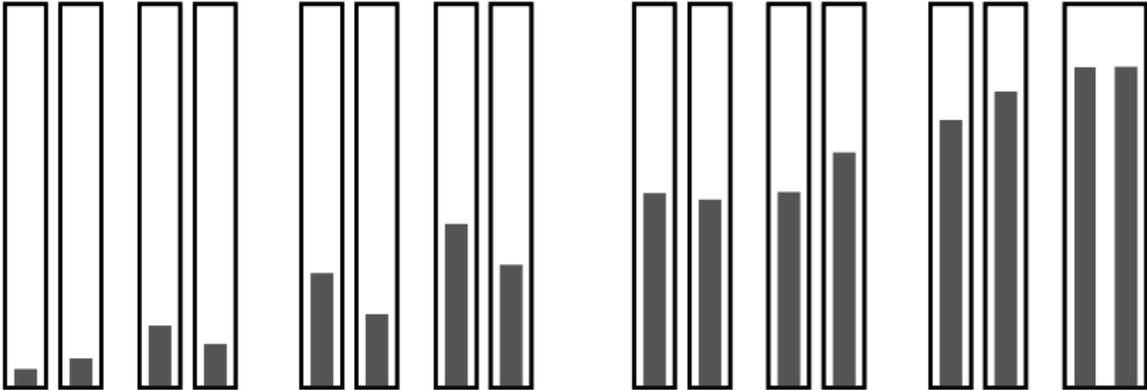
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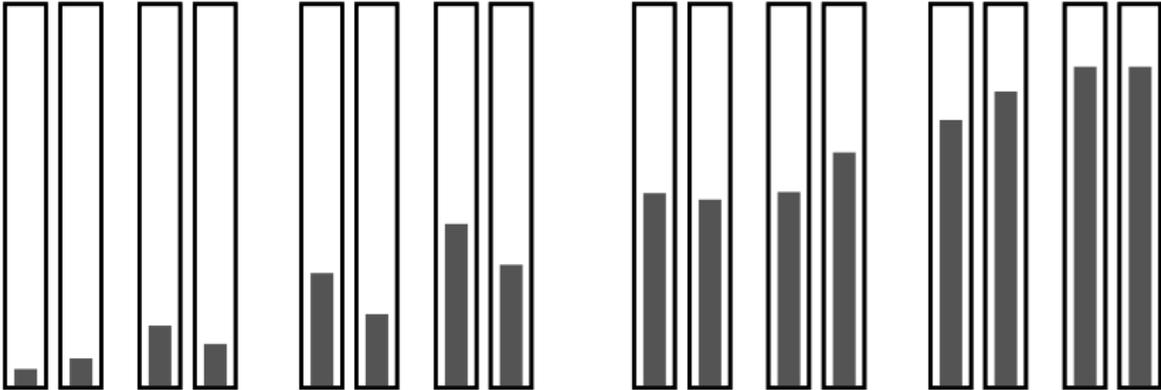
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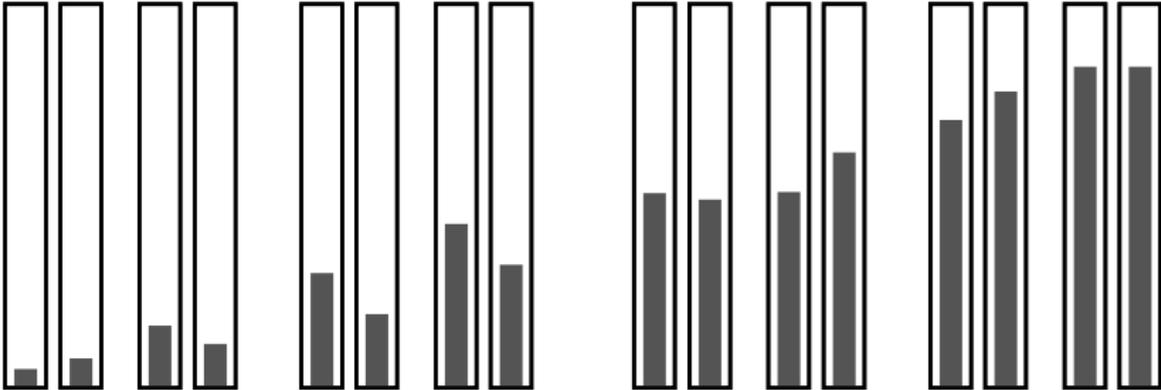
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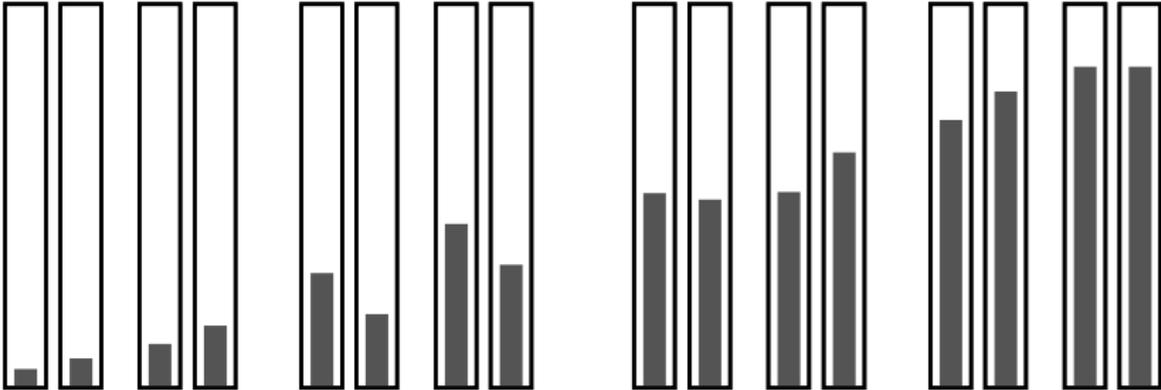
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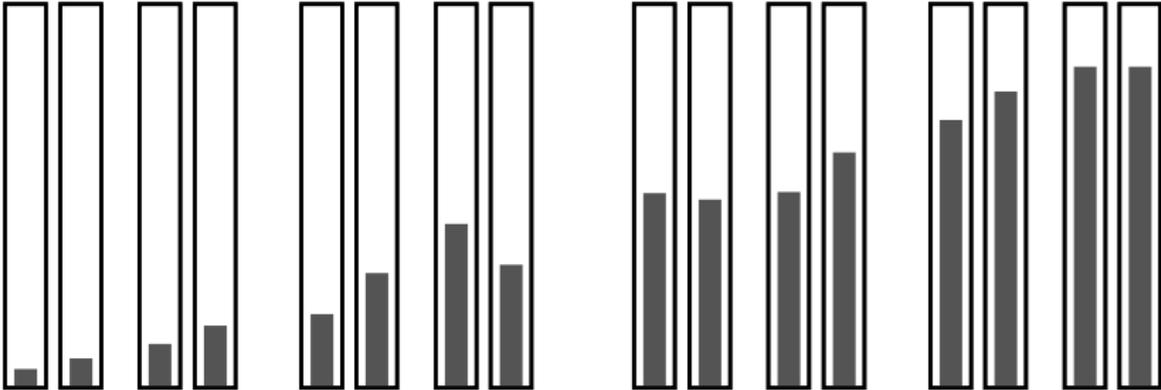
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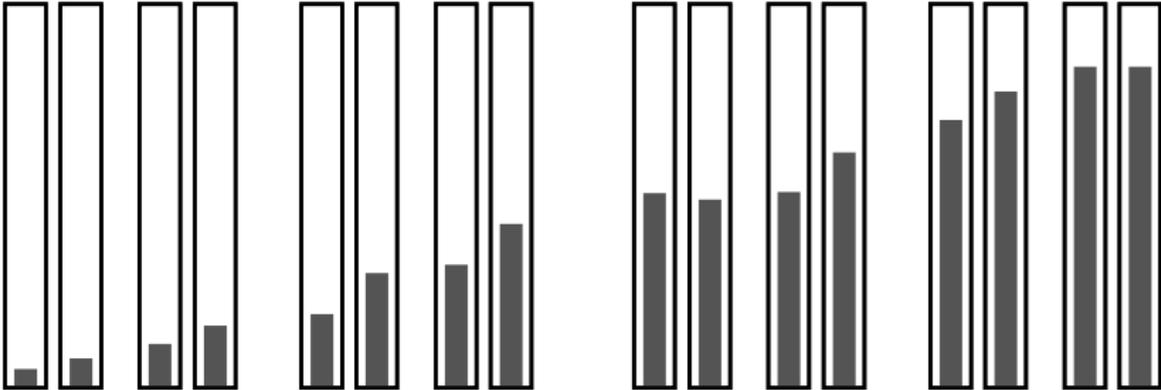
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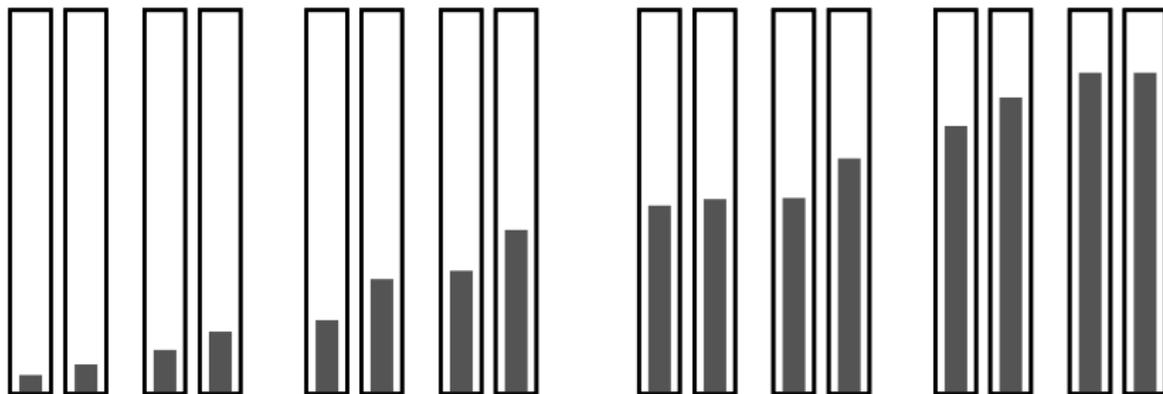
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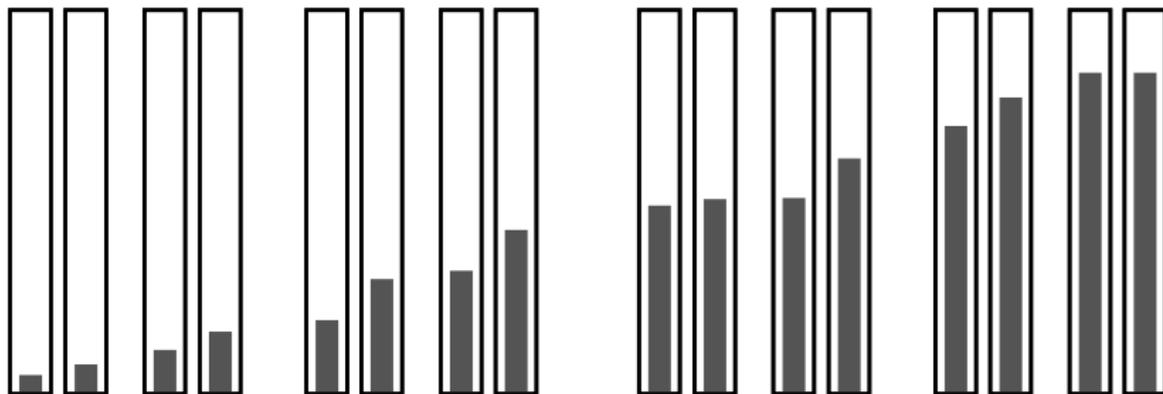
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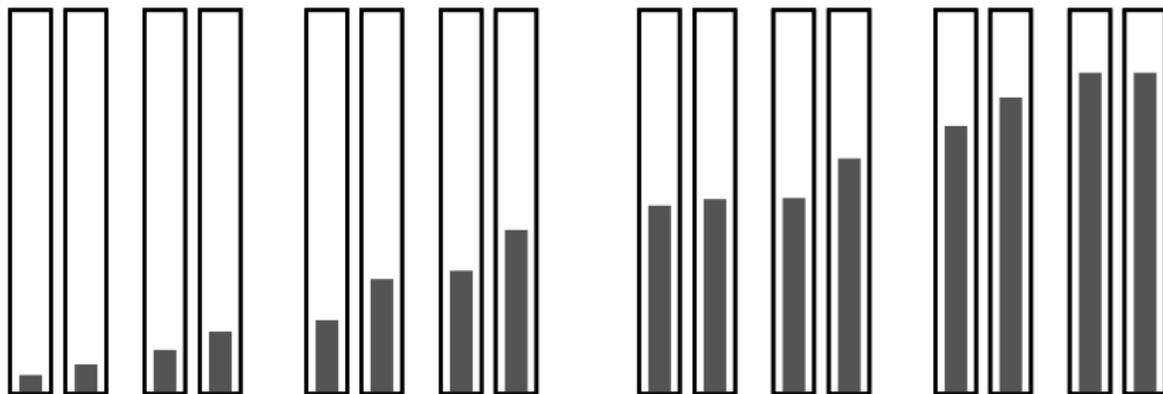
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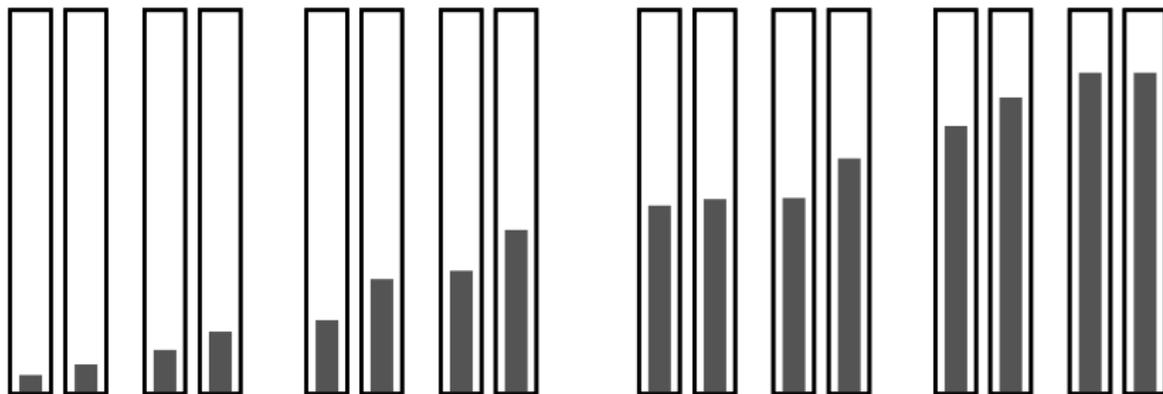
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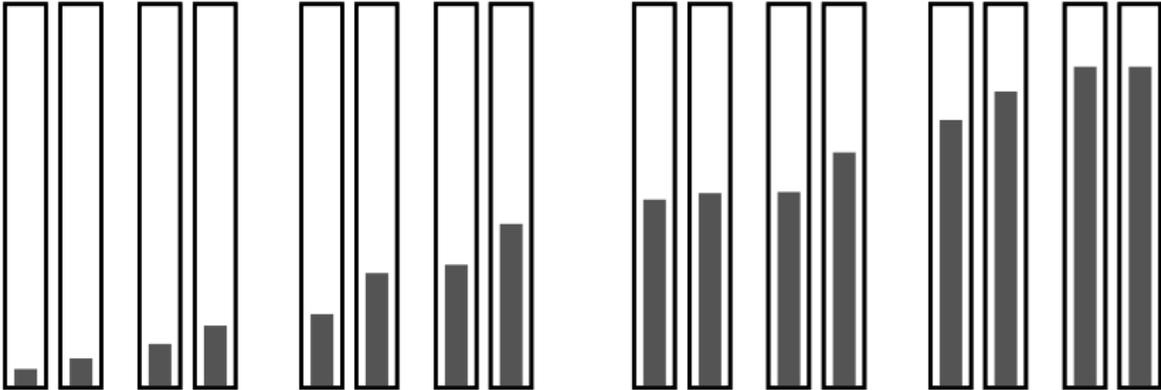
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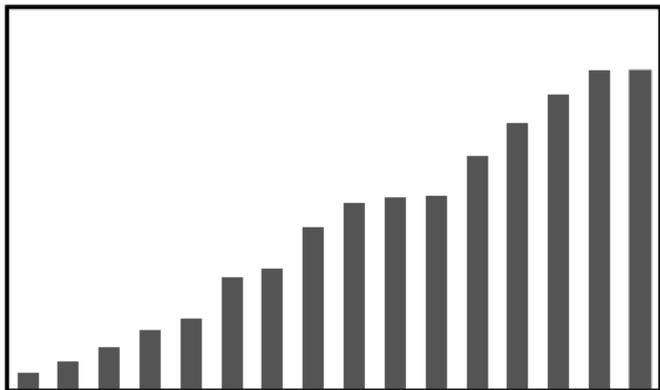
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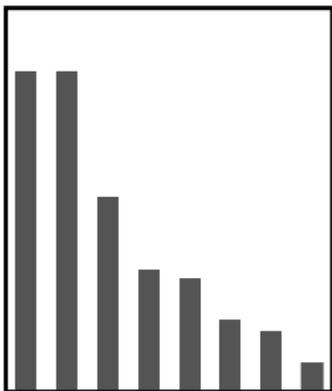
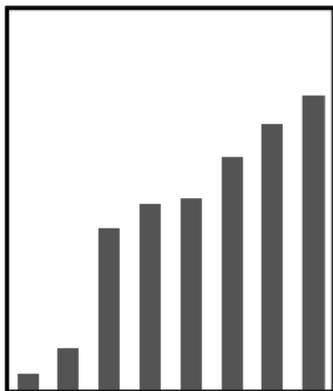
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  - ▶ particularly suitable for hardware and parallel implementations
  - ▶ correctness is not obvious

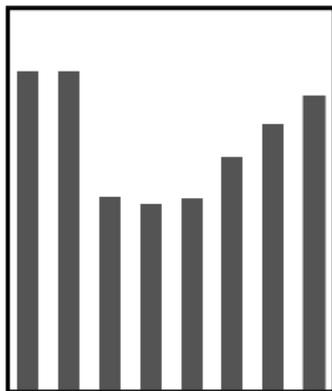
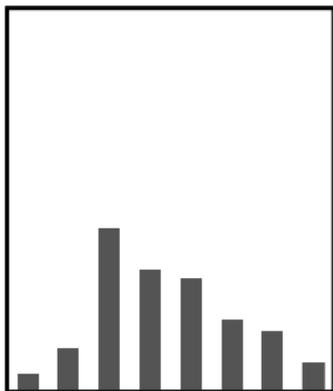
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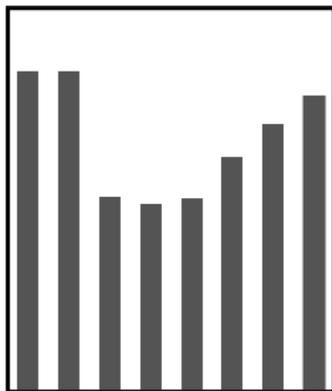
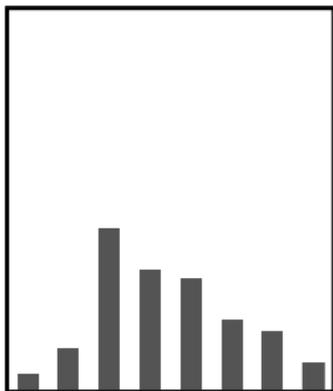
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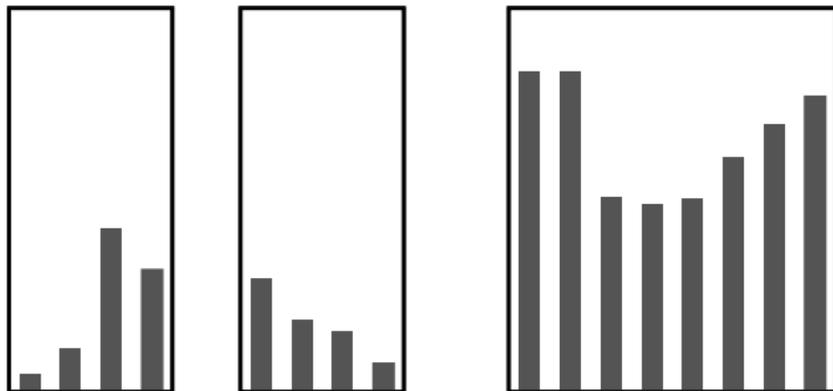
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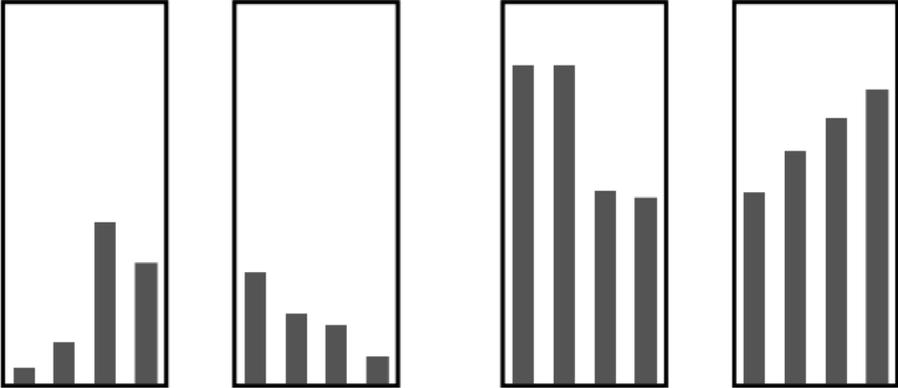
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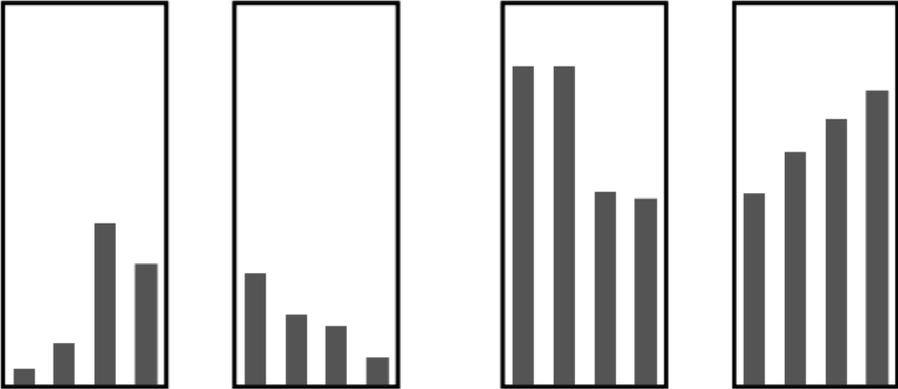
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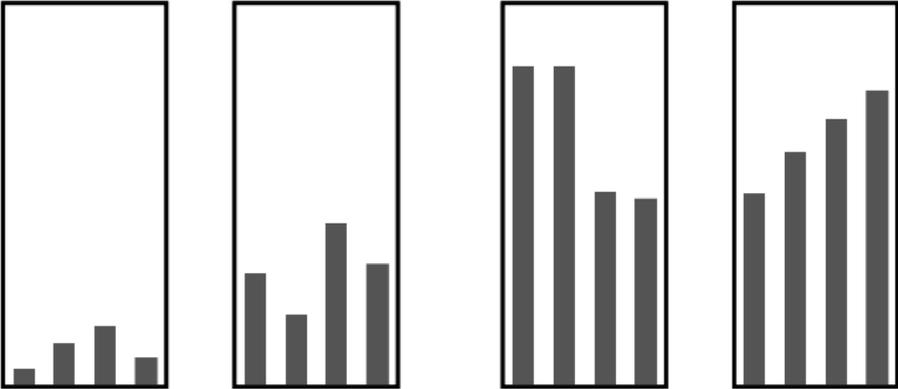
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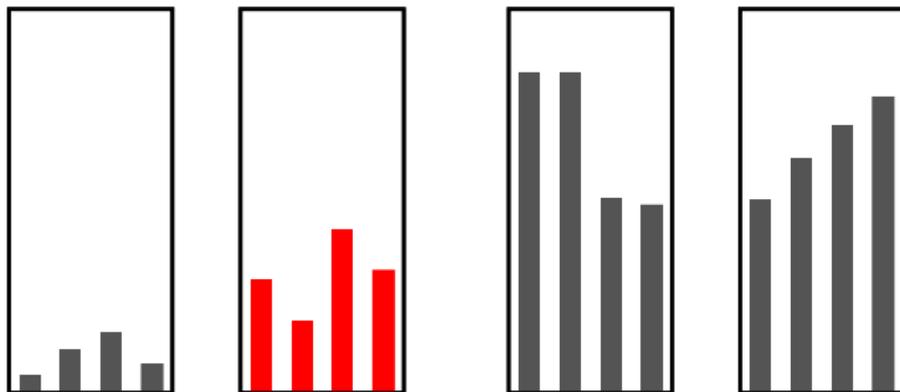
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## Knuth's 0-1-Principle [Knuth 1973]

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

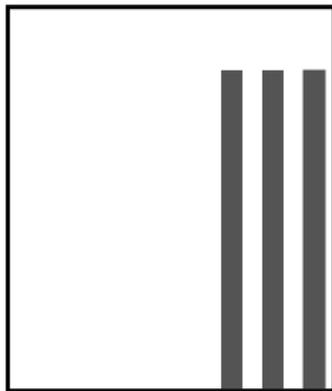
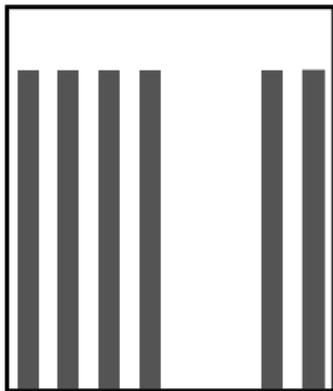
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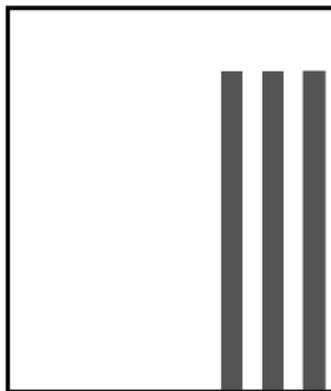
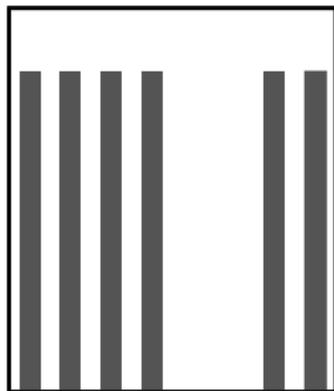
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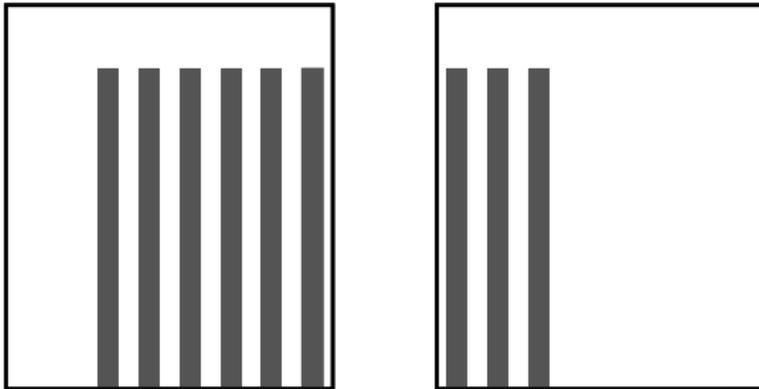
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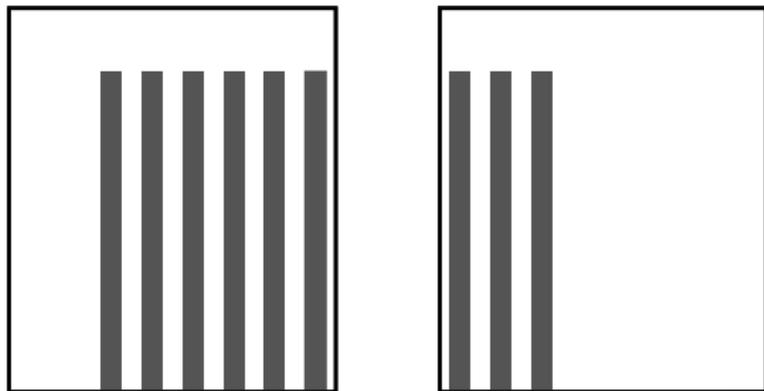
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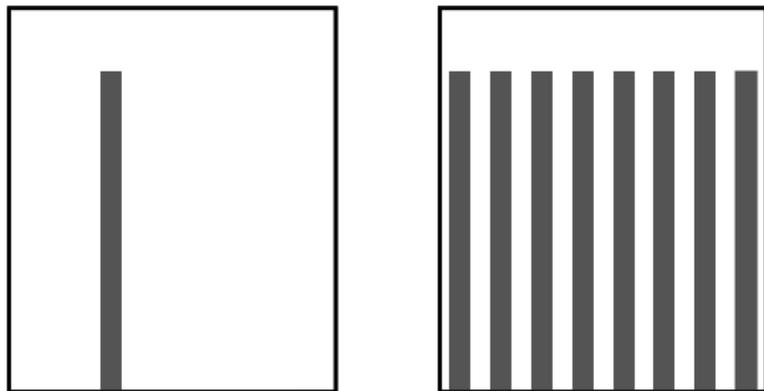
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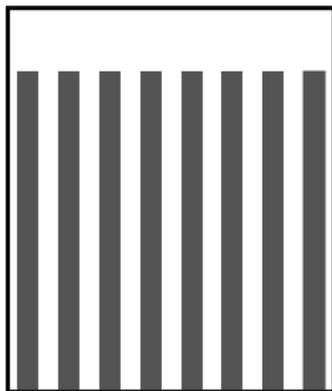
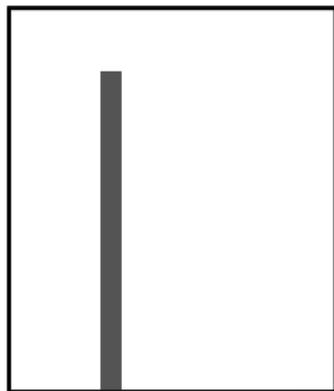
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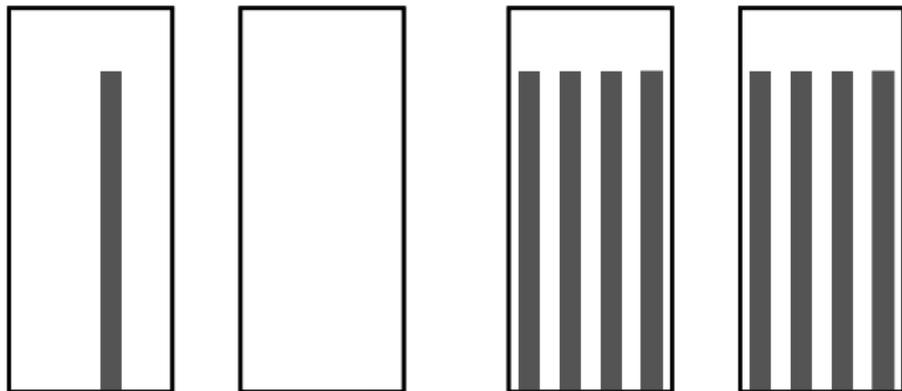
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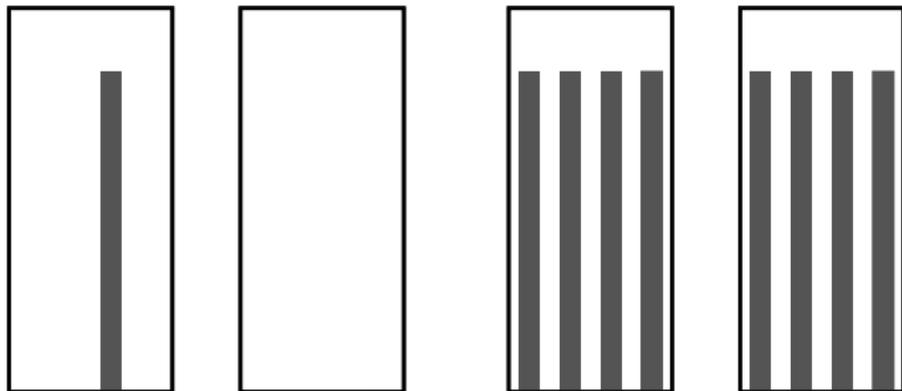
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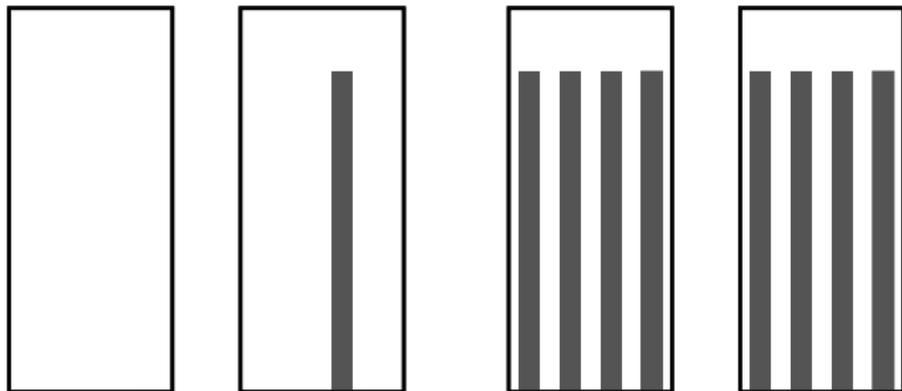
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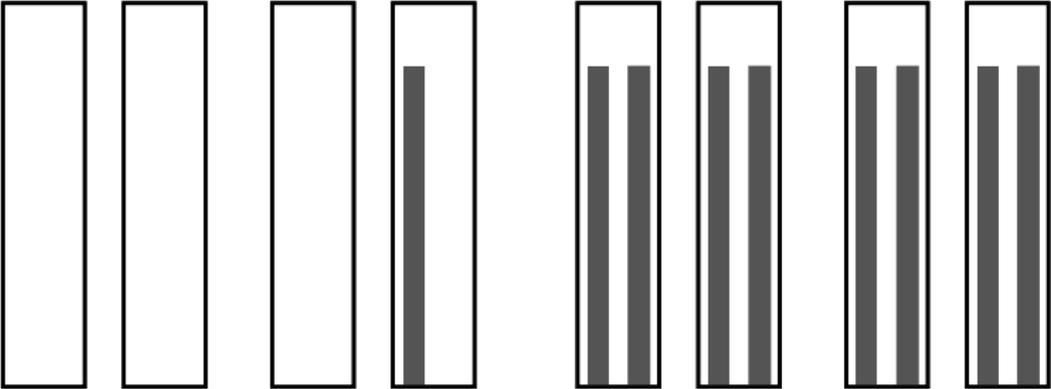
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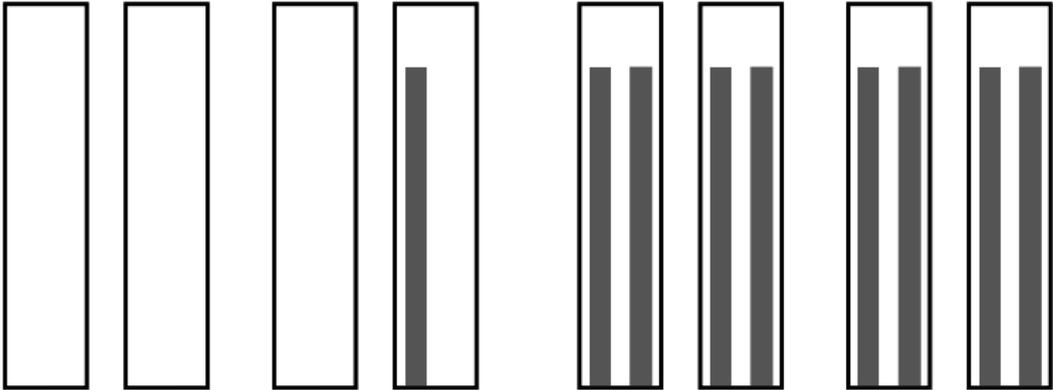
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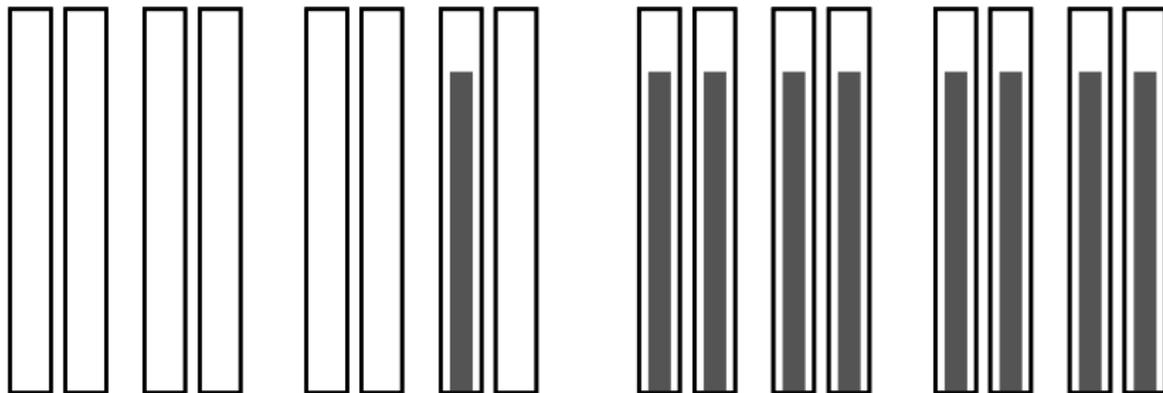
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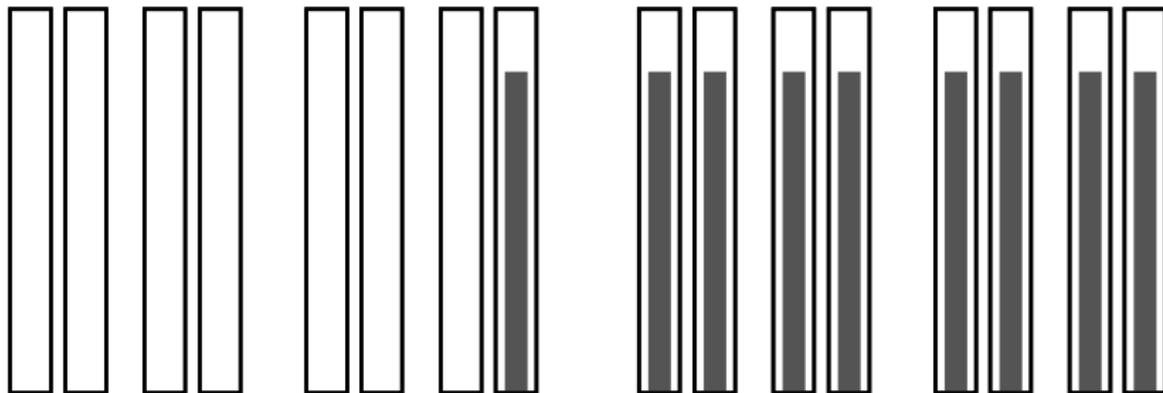
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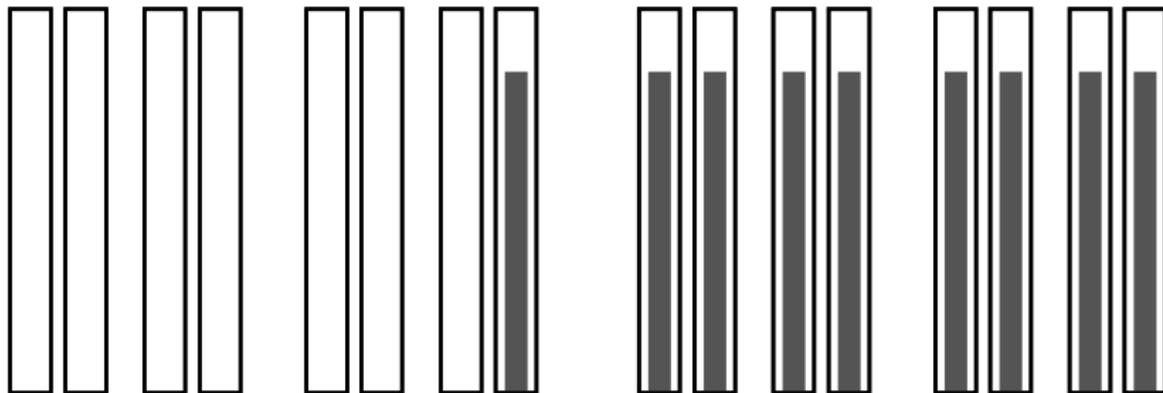
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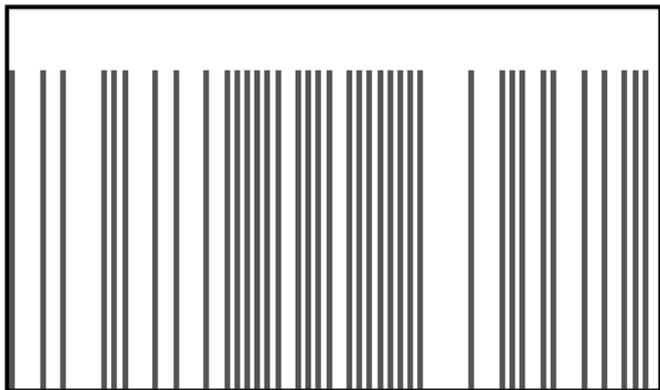
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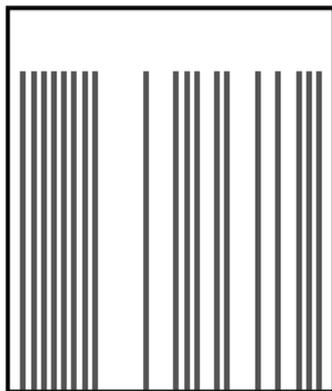
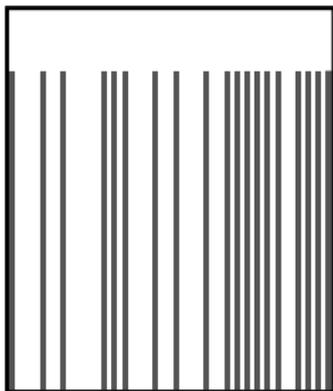
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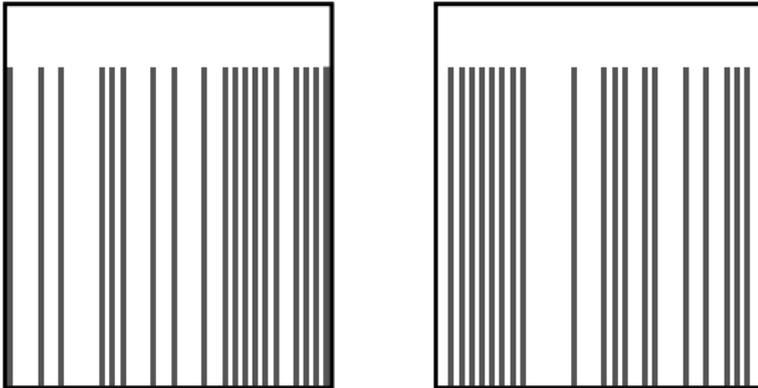
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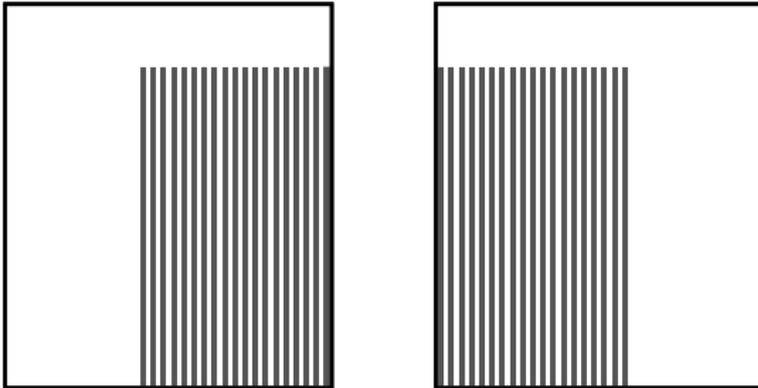
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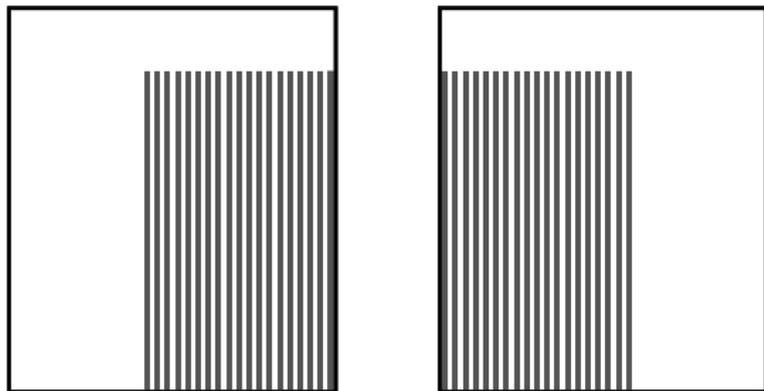
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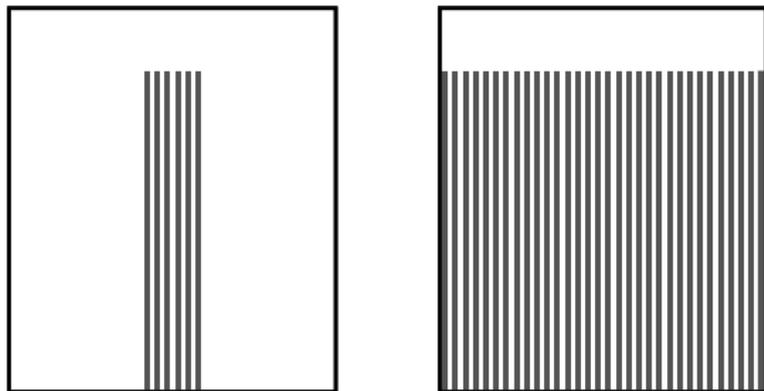
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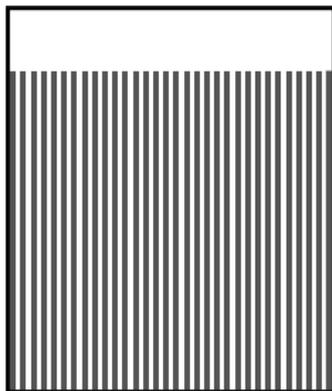
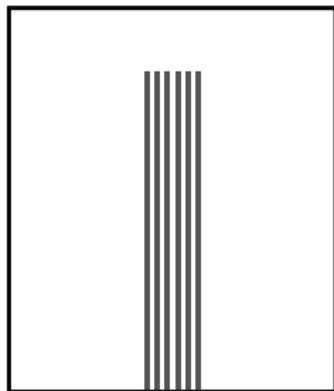
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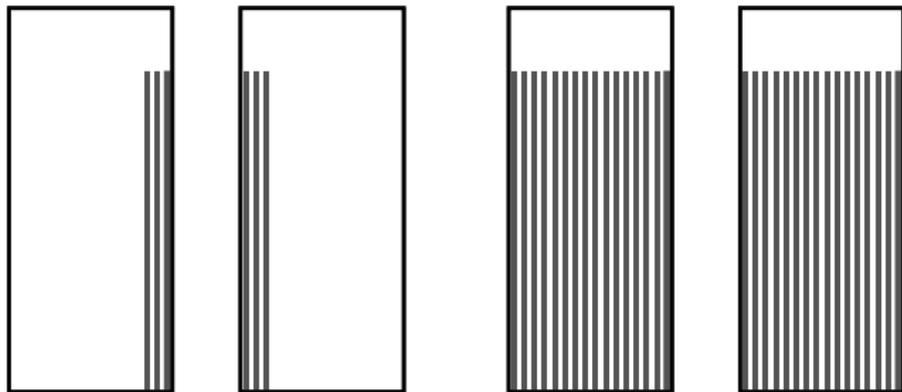
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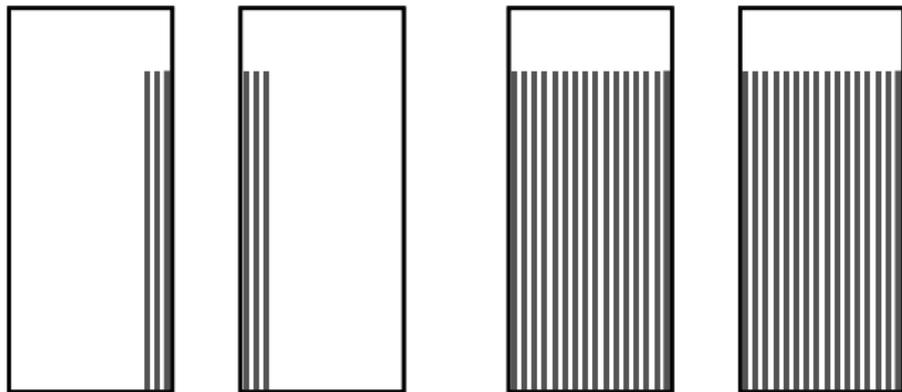
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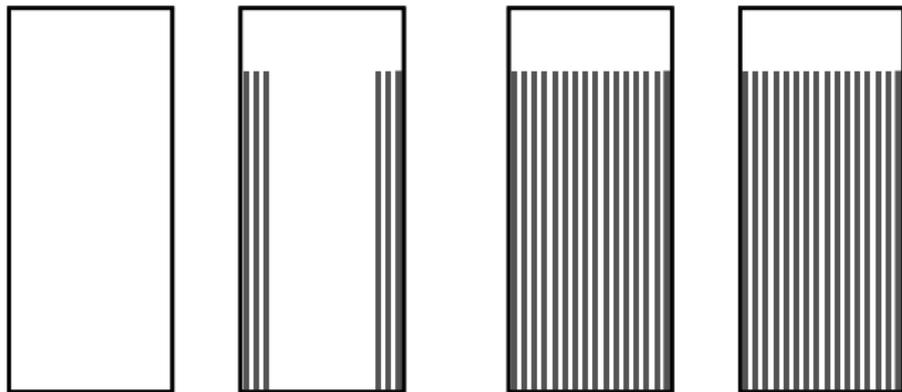
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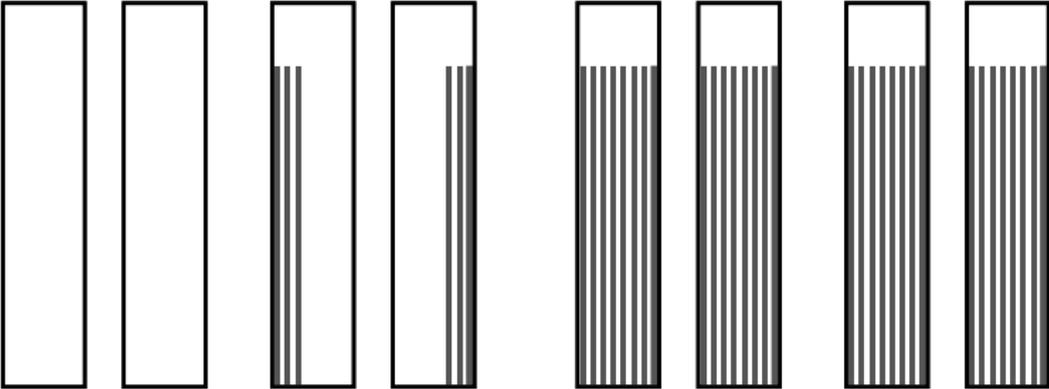
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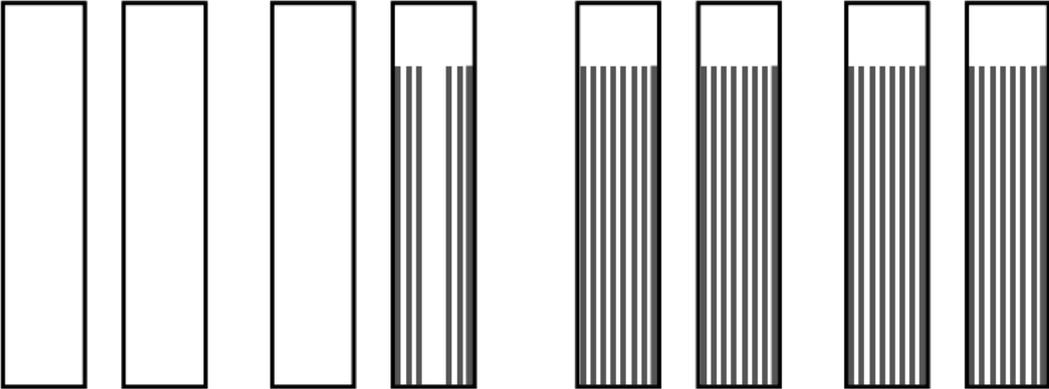
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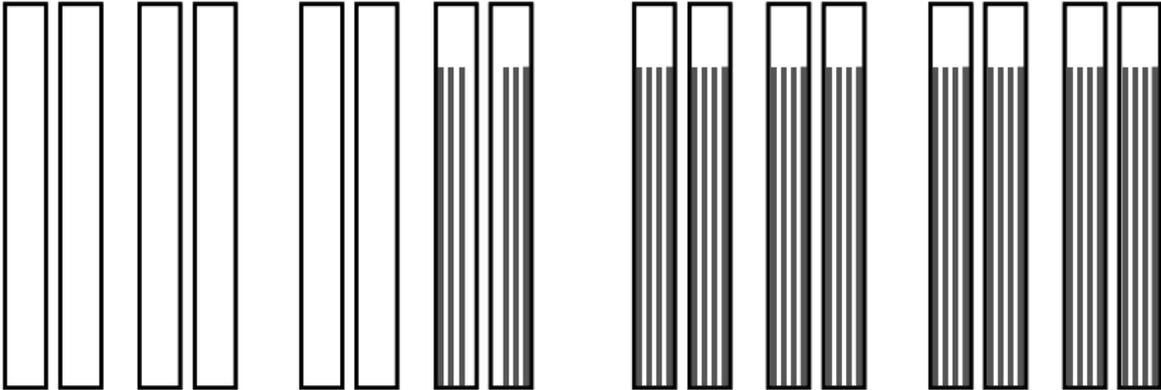
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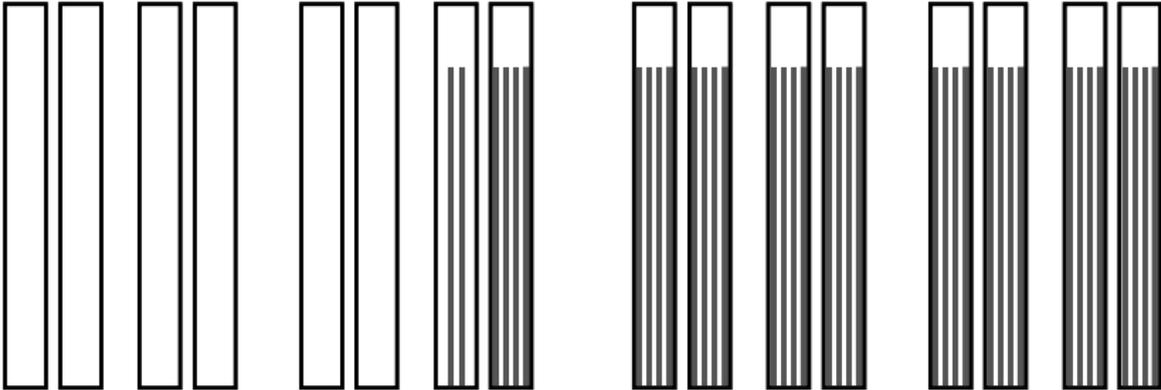
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If for every `xs :: [Bool]`, `sort g xs` gives the correct result, then for every `xs :: [Int]`, `sort f xs` gives the correct result.

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## Using the Free Theorems Generator

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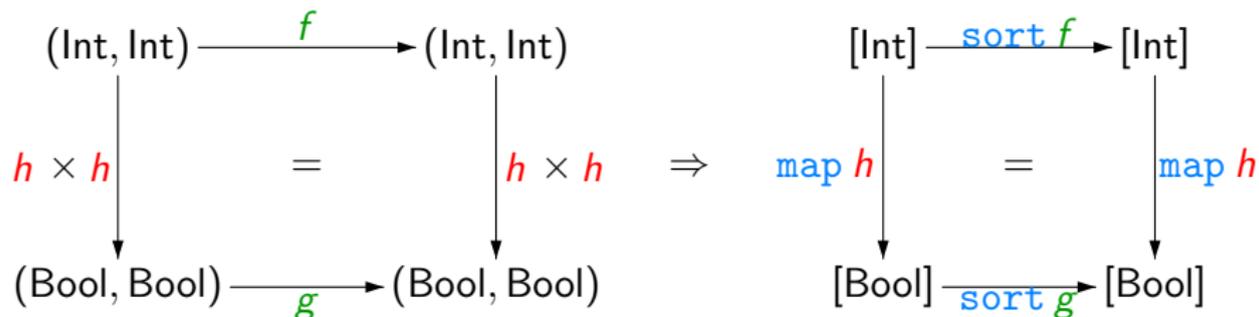
**Input:** `sort :: ((a,a)->(a,a))->[a]->[a]`

**Output:** `forall t1,t2 in TYPES, h::t1->t2.  
forall f::(t1,t1)->(t1,t1).  
forall g::(t2,t2)->(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)} | (h x1 = y1)
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## More Specific (and Intuitive)

For every  $\text{sort} :: ((\alpha, \alpha) \rightarrow (\alpha, \alpha)) \rightarrow [\alpha] \rightarrow [\alpha]$ ,  
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$$\begin{array}{ccc} (\text{Int}, \text{Int}) & \xrightarrow{f} & (\text{Int}, \text{Int}) \\ \downarrow h \times h & = & \downarrow h \times h \\ (\text{Bool}, \text{Bool}) & \xrightarrow{g} & (\text{Bool}, \text{Bool}) \end{array} \Rightarrow \begin{array}{ccc} [\text{Int}] & \xrightarrow{\text{sort } f} & [\text{Int}] \\ \downarrow \text{map } h & = & \downarrow \text{map } h \\ [\text{Bool}] & \xrightarrow{\text{sort } g} & [\text{Bool}] \end{array}$$

If  $f$  and  $g$  are as defined before, then the precondition is fulfilled for any  $h$  of the form  $h \ x = n < x$  for some  $n :: \text{Int}$ .

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To prove:  $\forall xs :: [\text{Int}], ys = \text{sort } f \text{ } xs. Q(ys)$

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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.

**Formally:** Use Haskell. Let

`sort` :: (( $\alpha$ ,  $\alpha$ )  $\rightarrow$  ( $\alpha$ ,  $\alpha$ ))  $\rightarrow$  [ $\alpha$ ]  $\rightarrow$  [ $\alpha$ ]

`f` :: (Int, Int)  $\rightarrow$  (Int, Int)

`f` (x, y) = if x > y then (y, x) else (x, y)

`g` :: (Bool, Bool)  $\rightarrow$  (Bool, Bool)

`g` (x, y) = (x && y, x || y)

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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- ▶ 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  $cswap :: (\alpha, \alpha) \rightarrow (\alpha, \alpha)$  in the case of sorting.

## Parallel Prefix Computation

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

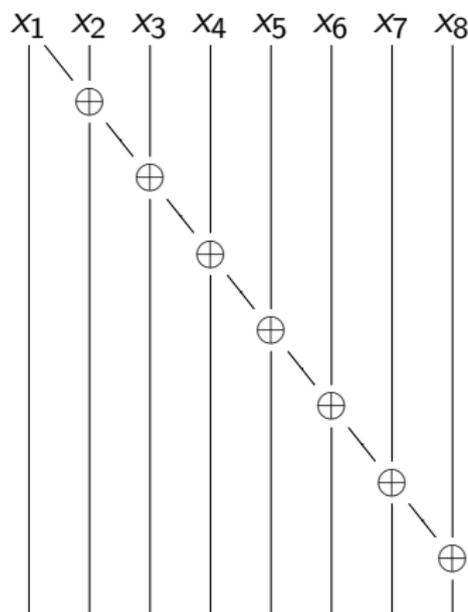
**Task:** compute the values  $x_1, x_1 \oplus x_2, \dots, x_1 \oplus x_2 \oplus \dots \oplus x_n$

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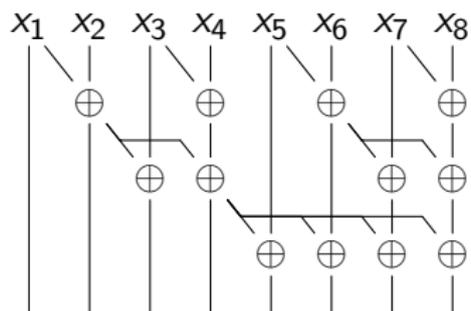
**Task:** compute the values  $x_1, x_1 \oplus x_2, \dots, x_1 \oplus x_2 \oplus \dots \oplus x_n$

**Solution:**



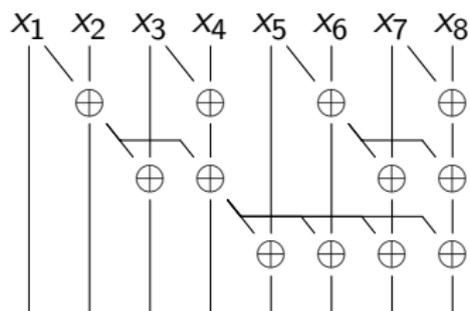
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Alternative:

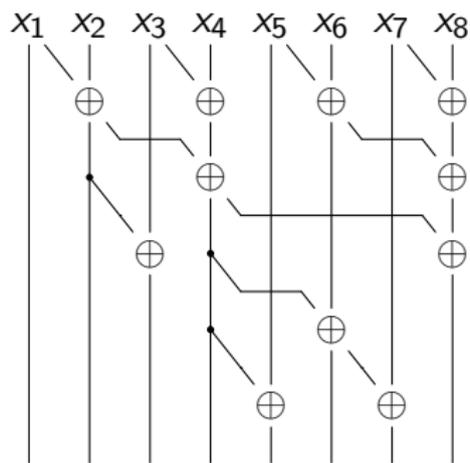


# Parallel Prefix Computation

Alternative:



Or:



Or: ...

# In Haskell

Functions of type:

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scanl1 :: ( $\alpha \rightarrow \alpha \rightarrow \alpha$ )  $\rightarrow$  [ $\alpha$ ]  $\rightarrow$  [ $\alpha$ ]
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For example, à la [Sklansky 1960]:

```
sklansky :: ( $\alpha \rightarrow \alpha \rightarrow \alpha$ )  $\rightarrow$  [ $\alpha$ ]  $\rightarrow$  [ $\alpha$ ]
```

```
sklansky ( $\oplus$ ) [x] = [x]
```

```
sklansky ( $\oplus$ ) xs = us ++ vs
```

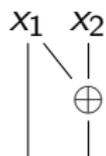
```
  where t      = ((length xs) + 1) 'div' 2
```

```
        (ys, zs) = splitAt t xs
```

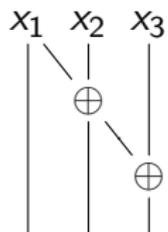
```
        us      = sklansky ( $\oplus$ ) ys
```

```
        vs      = [(last us)  $\oplus$  v | v  $\leftarrow$  sklansky ( $\oplus$ ) zs]
```

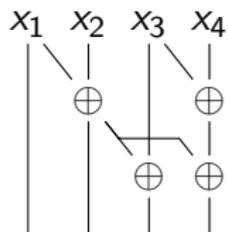
# Sklansky's Method Visualised



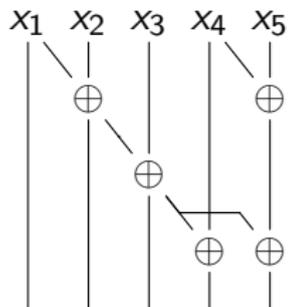
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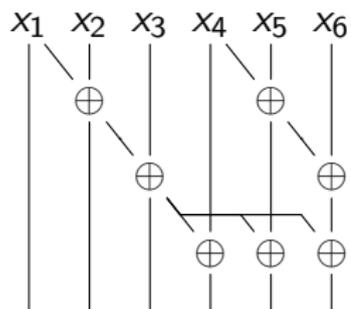
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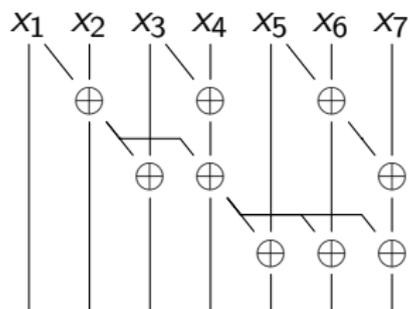
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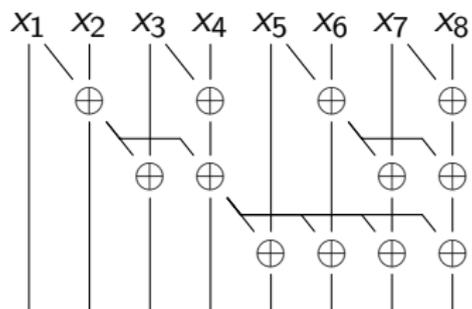
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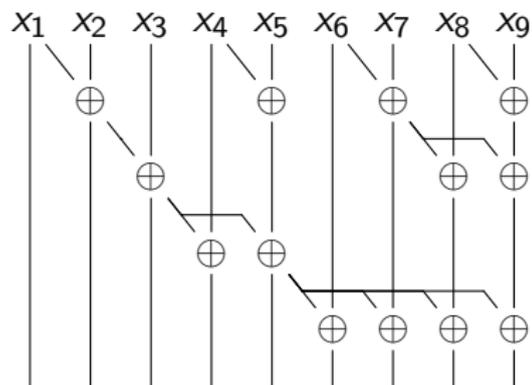
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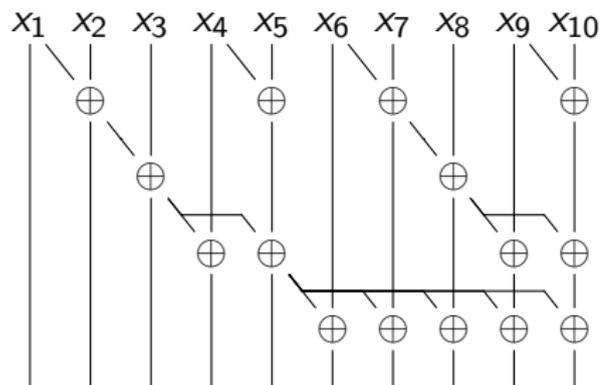
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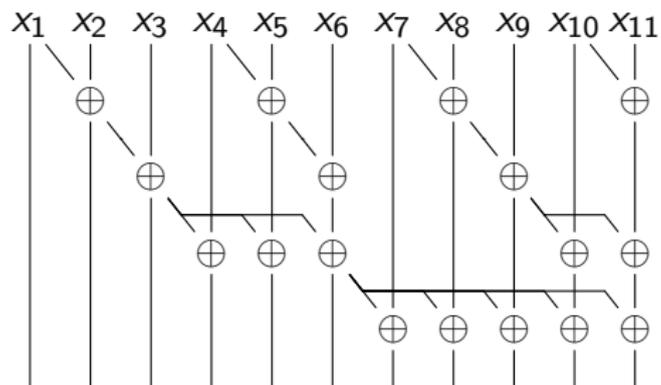
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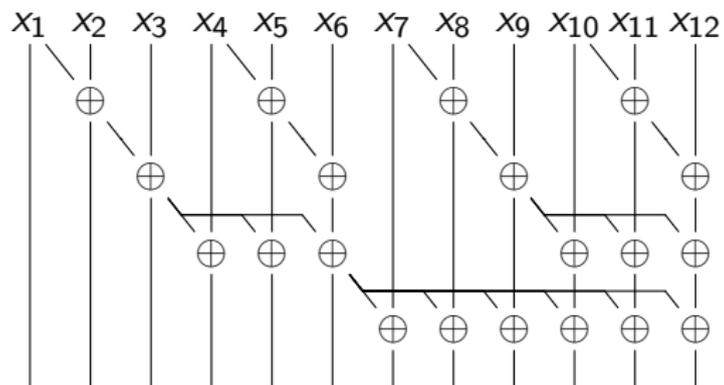
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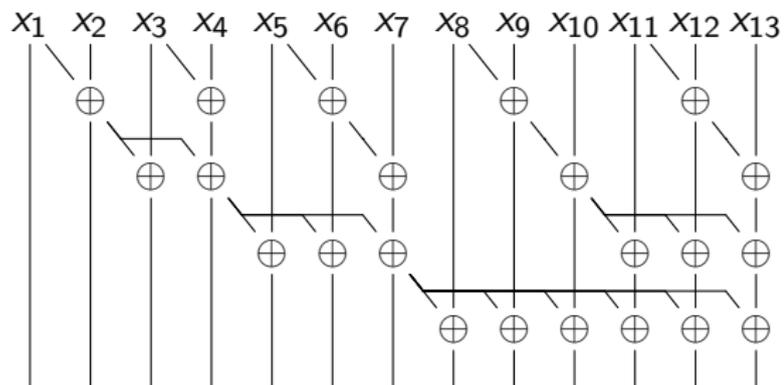
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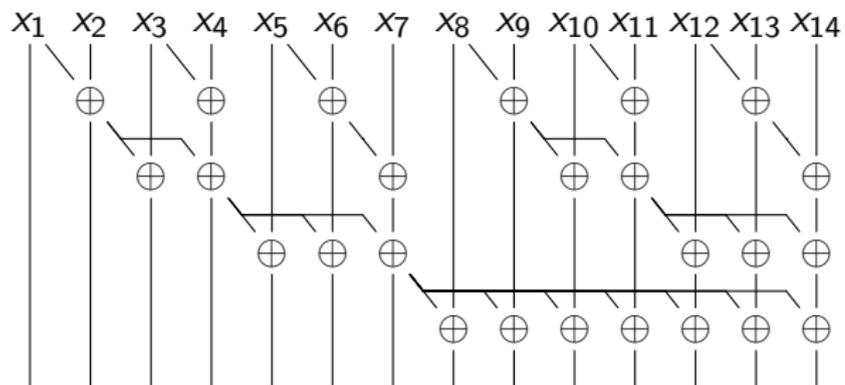
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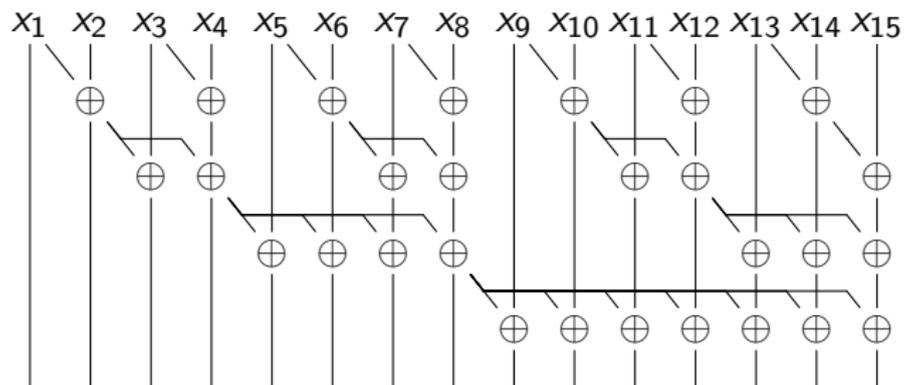
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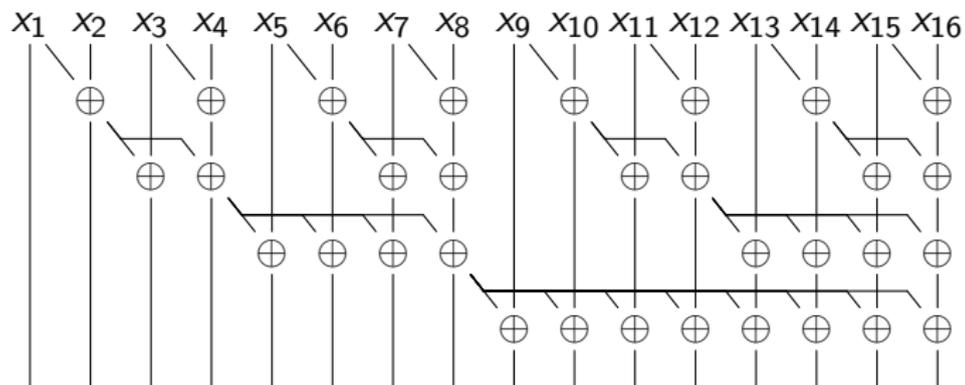
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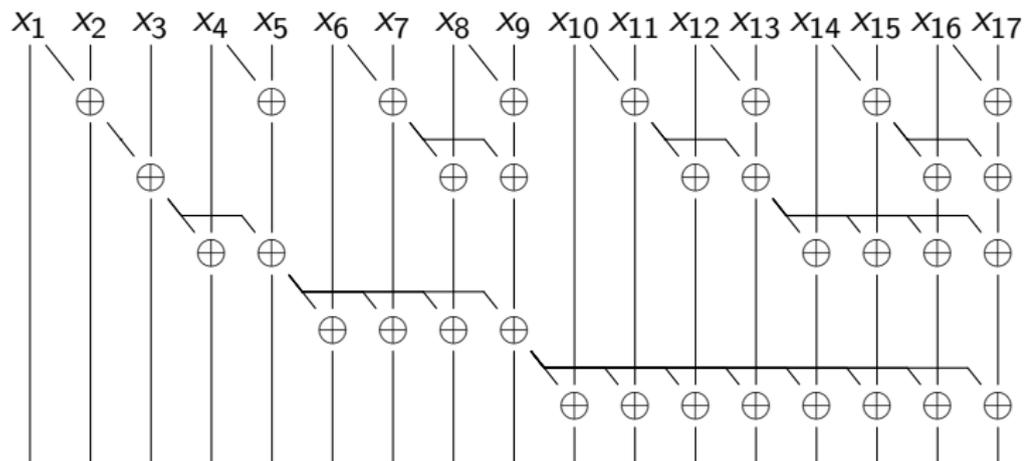
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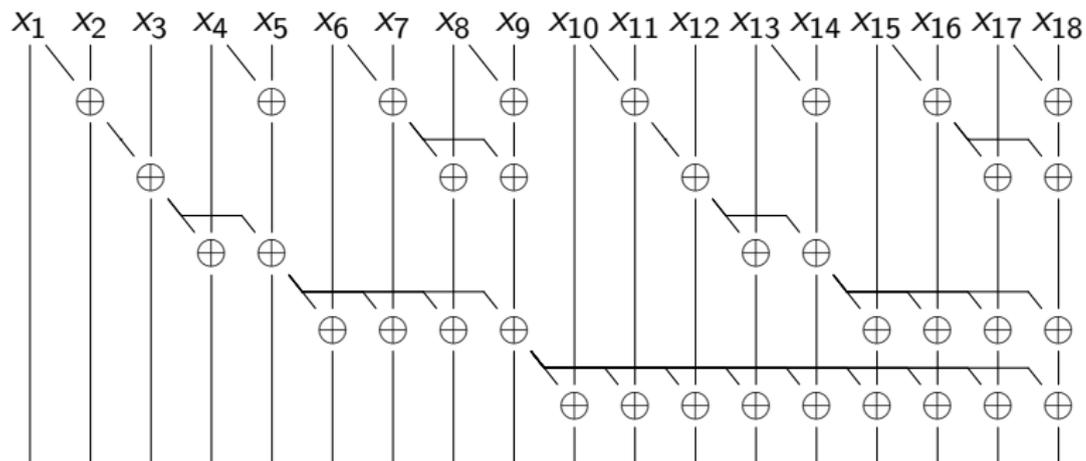
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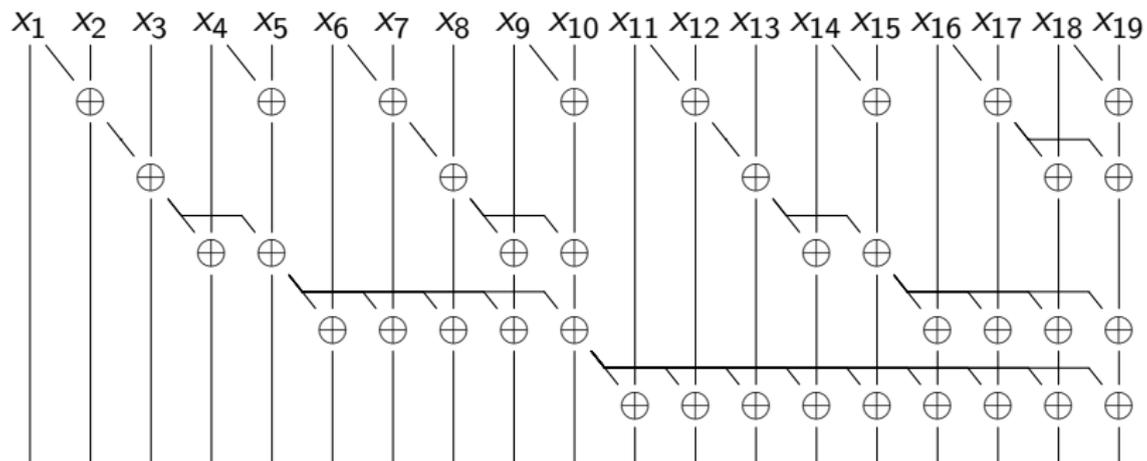
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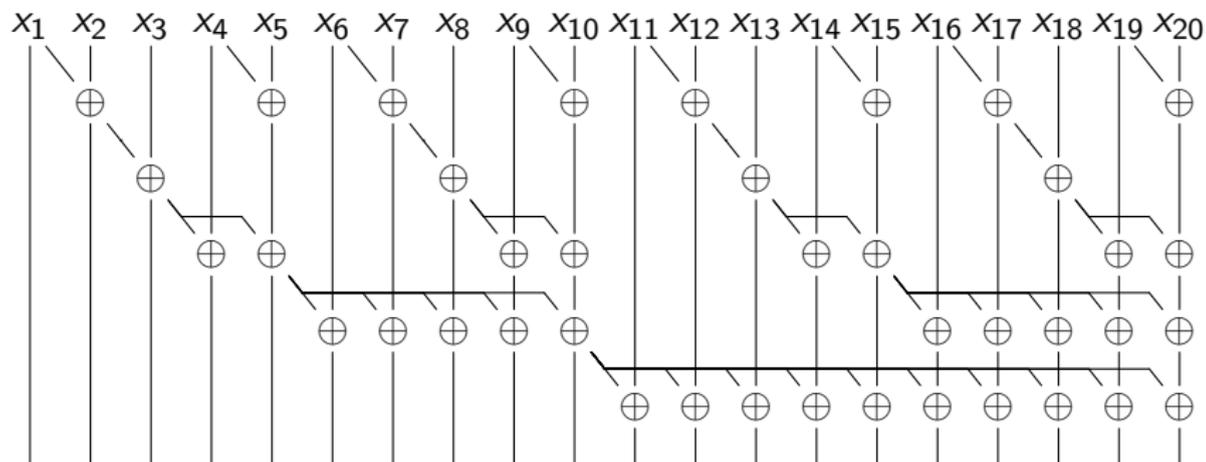
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# Or, à la [Brent & Kung 1980] (code follows [Sheeran 2007])

`brentKung` ::  $(\alpha \rightarrow \alpha \rightarrow \alpha) \rightarrow [\alpha] \rightarrow [\alpha]$

`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**  $(xs, ys) = unriffle zs$

$par (xs, ys) = (xs, brentKung (\oplus) ys)$

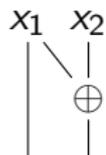
$riffle ([], []) = []$

$riffle ([x], []) = [x]$

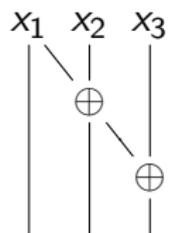
$riffle (x : xs, y : ys) = x : y : riffle (xs, ys)$

$odds (x : xs) = x : evens xs$

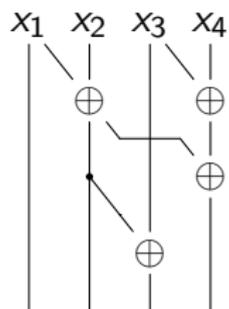
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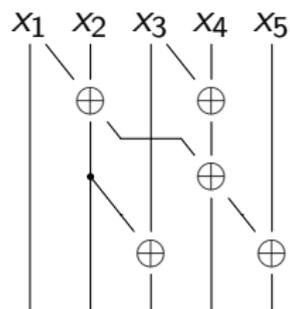
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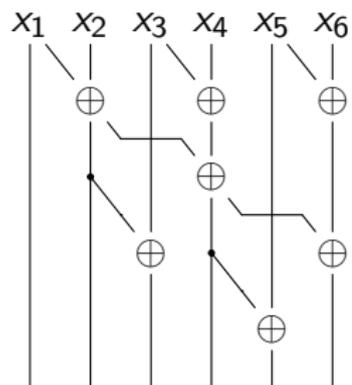
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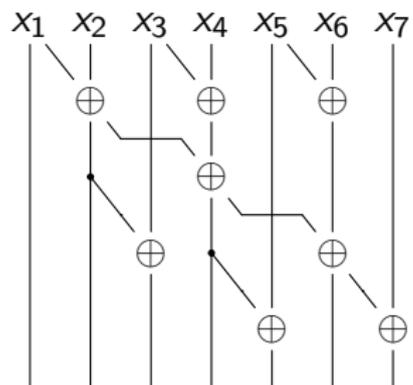
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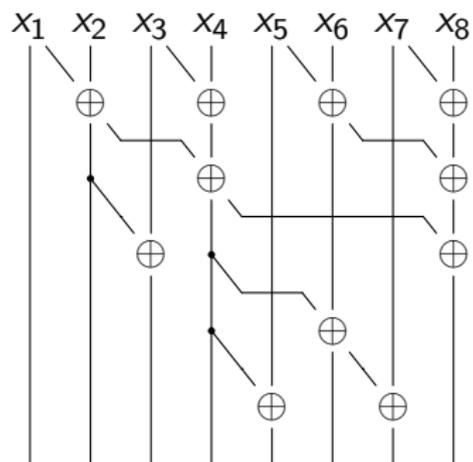
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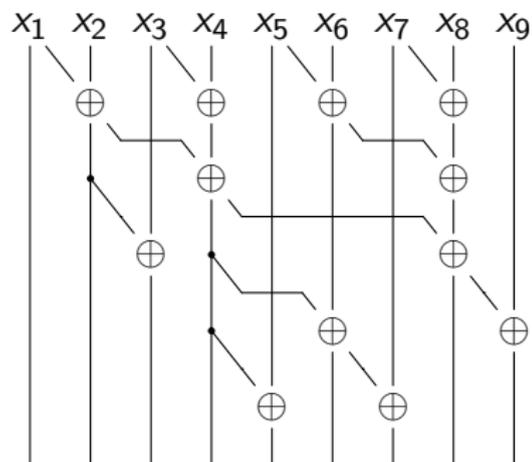
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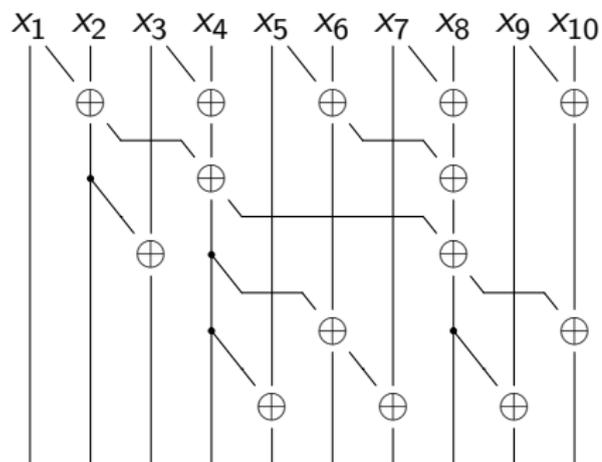
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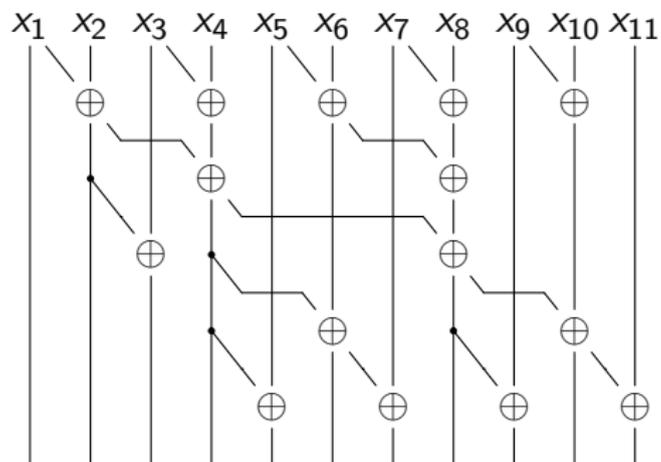
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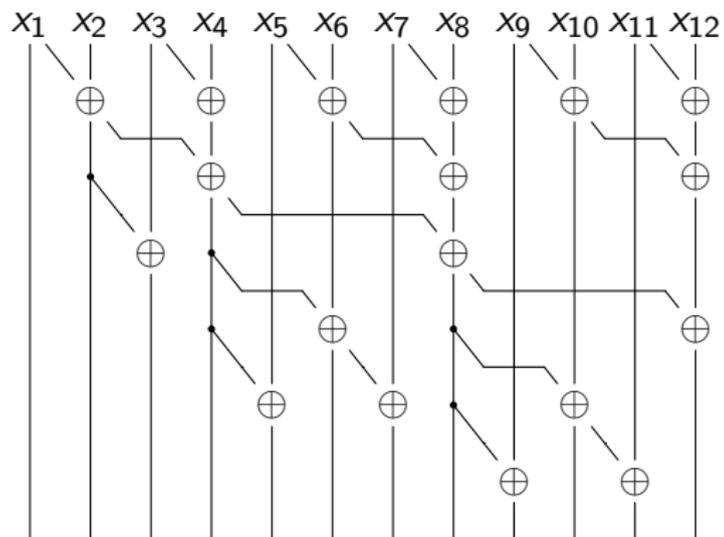
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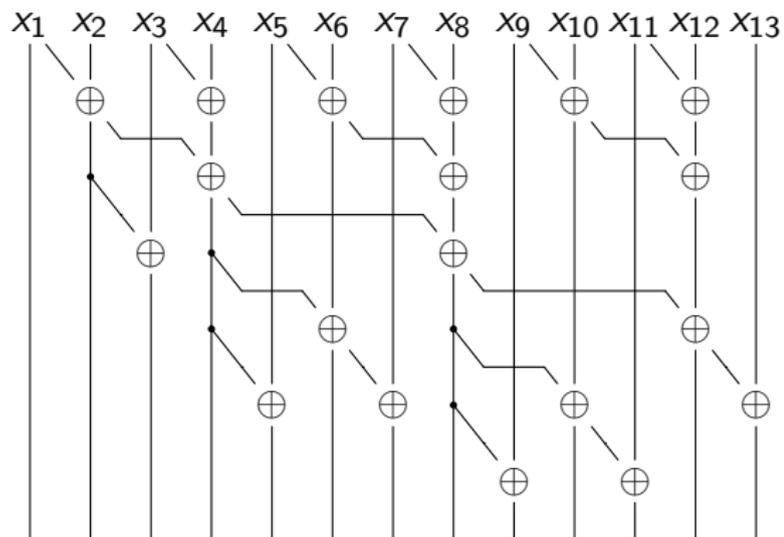
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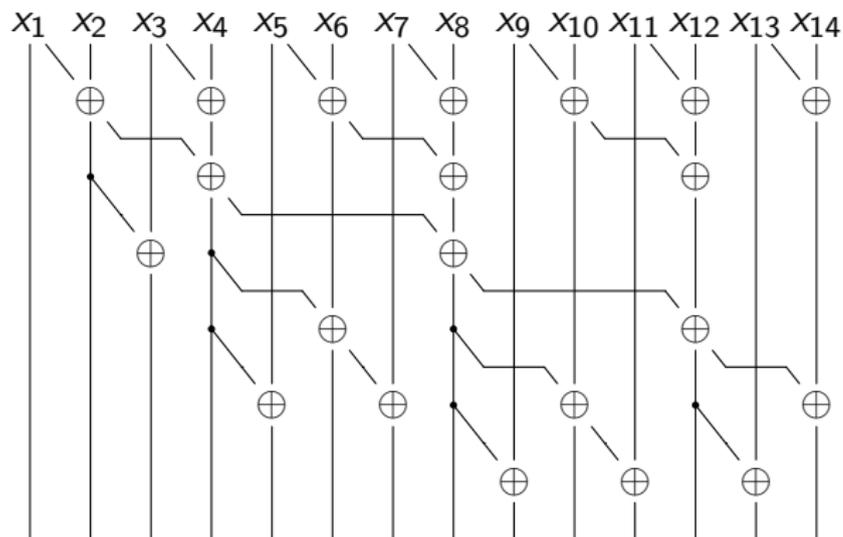
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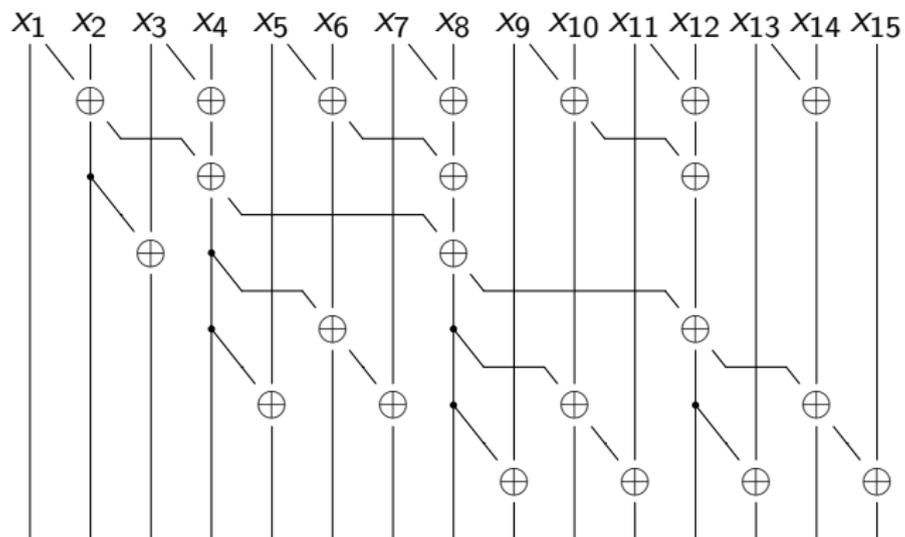
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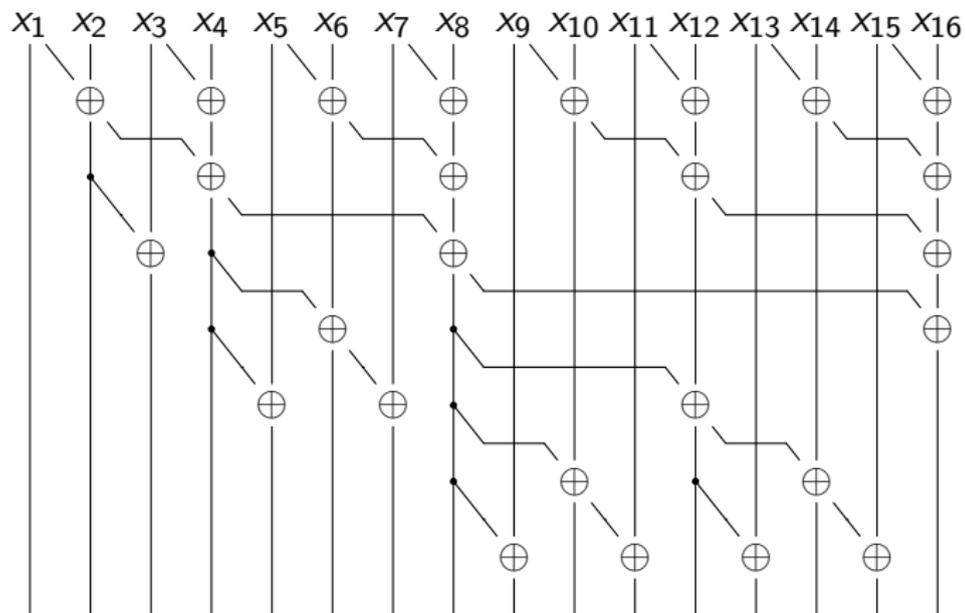
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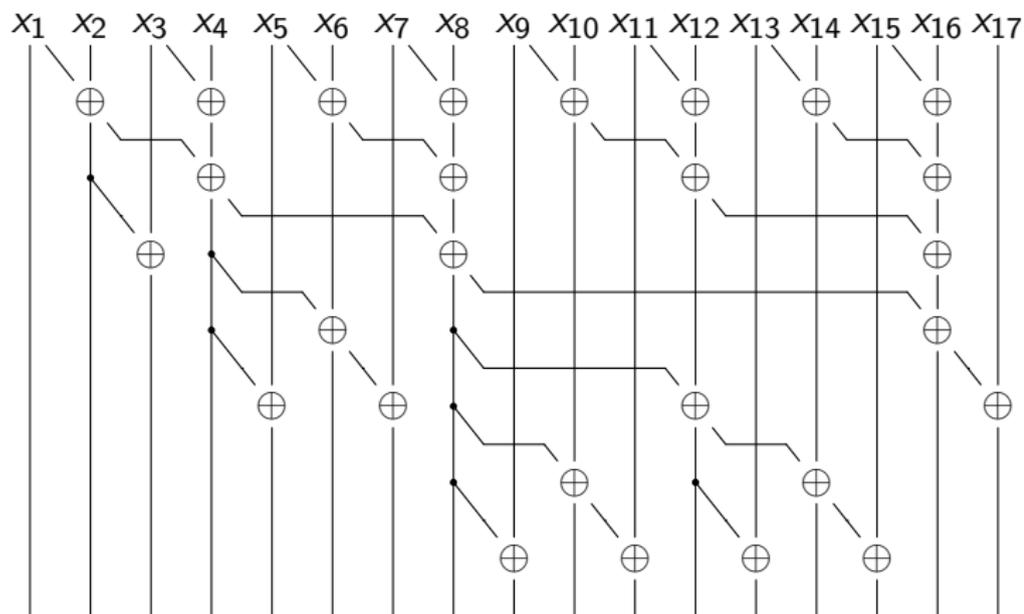
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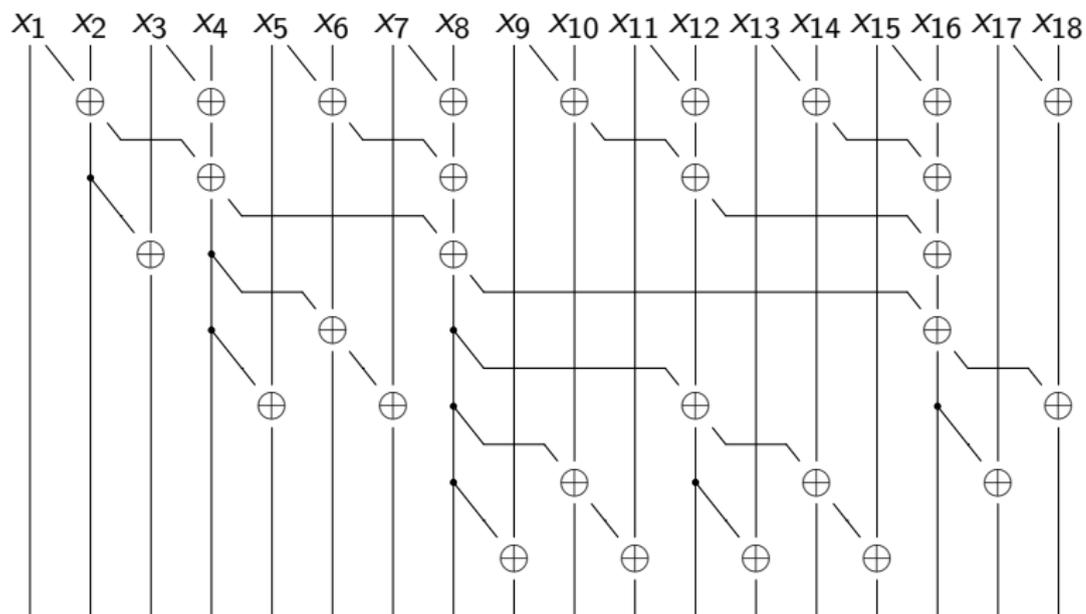
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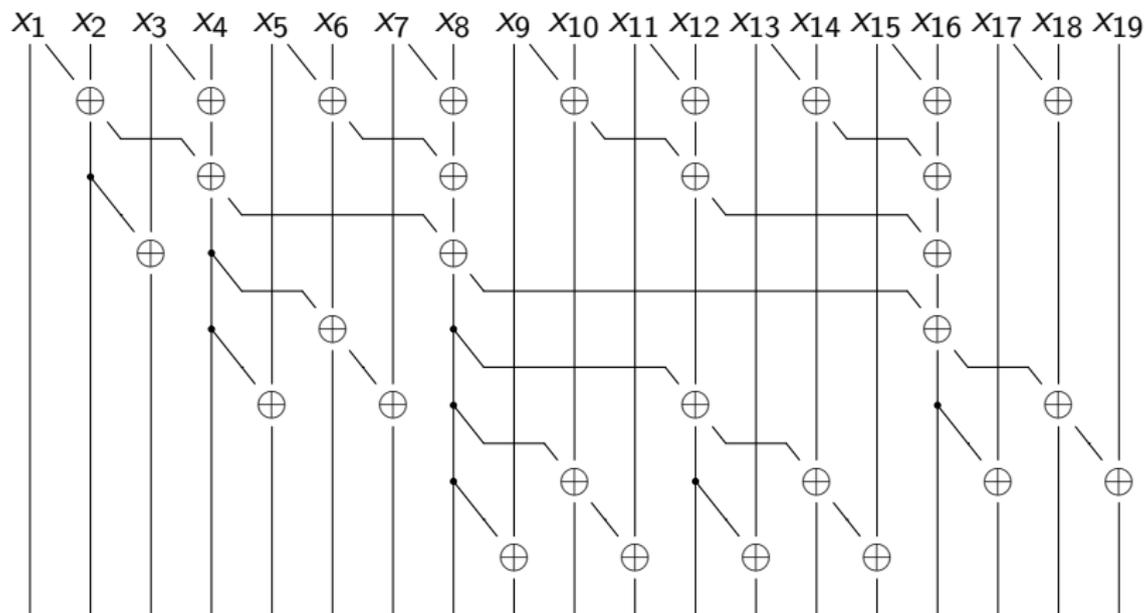
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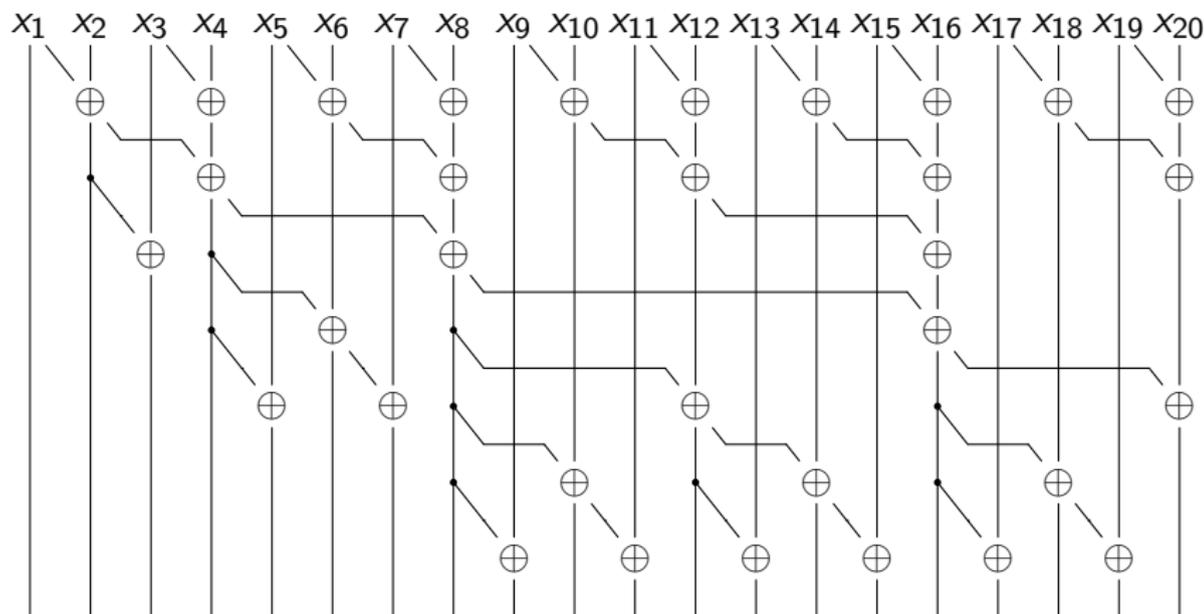
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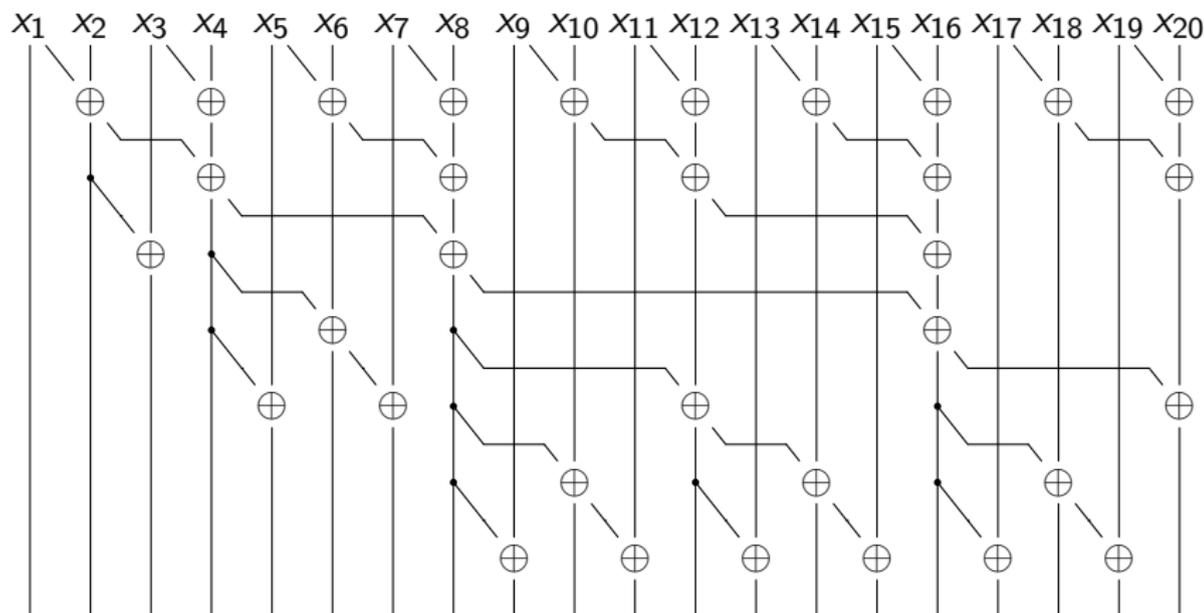
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# Brent & Kung's Method Visualised



## Brent & Kung's Method Visualised



**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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## A Knuth-like 0-1-Principle ?

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

Unfortunately not !

## A Knuth-like 0-1-2-Principle [V. 2008]

Given: `scanl1` ::  $(\alpha \rightarrow \alpha \rightarrow \alpha) \rightarrow [\alpha] \rightarrow [\alpha]$

`scanl1` ( $\oplus$ ) (x : xs) = go x xs

**where** go x [] = [x]

go x (y : ys) = x : (go (x  $\oplus$  y) ys)

## A Knuth-like 0-1-2-Principle [V. 2008]

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**data** Three = Zero | One | Two

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          go x (y : ys) = x : (go (x  $\oplus$  y) ys)

`candidate` ::  $(\alpha \rightarrow \alpha \rightarrow \alpha) \rightarrow [\alpha] \rightarrow [\alpha]$

**data** Three = Zero | One | Two

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

`candidate` ( $\oplus$ ) xs = `scanl1` ( $\oplus$ ) xs ,

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

## Why 0-1-2? And How?

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

## Why 0-1-2? And How?

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

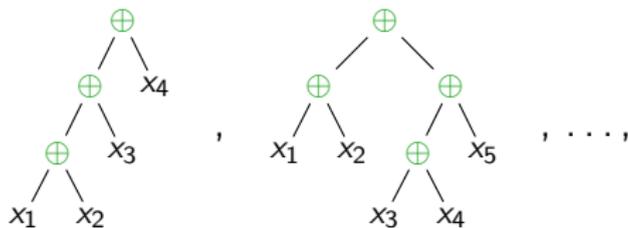
**The answer:** Create an output list consisting of expressions built from  $\oplus$  and  $x_1, \dots, x_n$ . **Independently of the  $\alpha$ -type !**

## Why 0-1-2? And How?

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Among these expressions, there are **good** ones:

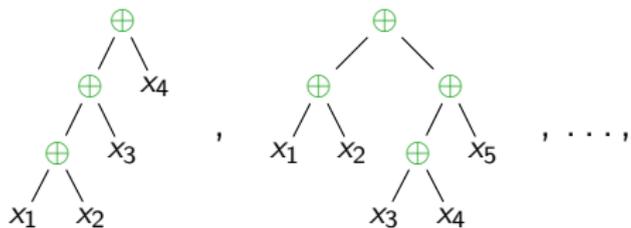


## Why 0-1-2? And How?

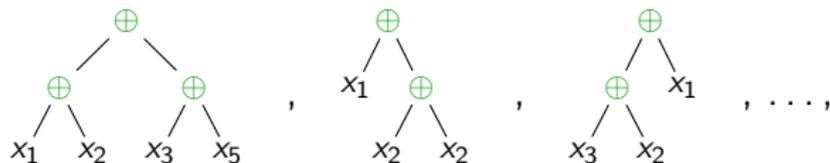
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Among these expressions, there are **good** ones:

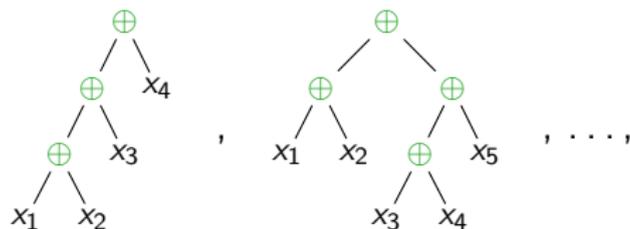


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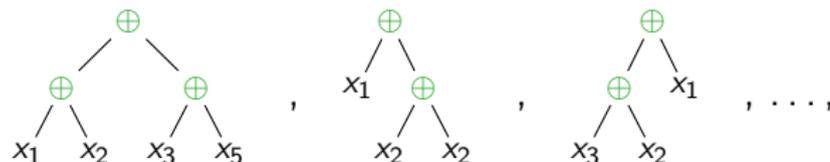


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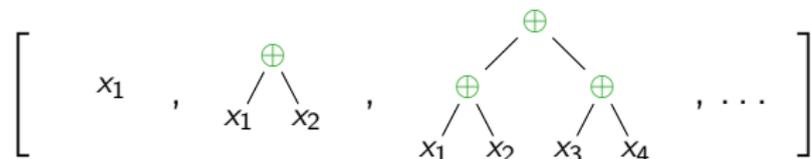
Among these expressions, there are **good** ones:



**bad** ones:



and ones in the wrong **position**:



# That's How!

Let

$\oplus_1$	Zero	One	Two
Zero	Zero	One	Two
One	One	Two	Two
Two	Two	Two	Two

and

$\oplus_2$	Zero	One	Two
Zero	Zero	One	Two
One	One	One	Two
Two	Two	One	Two

# That's How!

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

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

# That's How!

Let

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

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

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

## A Knuth-like 0-1-2-Principle [V. 2008]

Given: `scanl1` ::  $(\alpha \rightarrow \alpha \rightarrow \alpha) \rightarrow [\alpha] \rightarrow [\alpha]$   
`scanl1` ( $\oplus$ ) (x : xs) = go x xs  
    **where** go x [] = [x]  
          go x (y : ys) = x : (go (x  $\oplus$  y) ys)

`candidate` ::  $(\alpha \rightarrow \alpha \rightarrow \alpha) \rightarrow [\alpha] \rightarrow [\alpha]$

**data** Three = Zero | One | Two

**Theorem:** If for every xs :: [Three] and associative  
( $\oplus$ ) :: Three  $\rightarrow$  Three  $\rightarrow$  Three,

`candidate` ( $\oplus$ ) xs = `scanl1` ( $\oplus$ ) xs ,

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

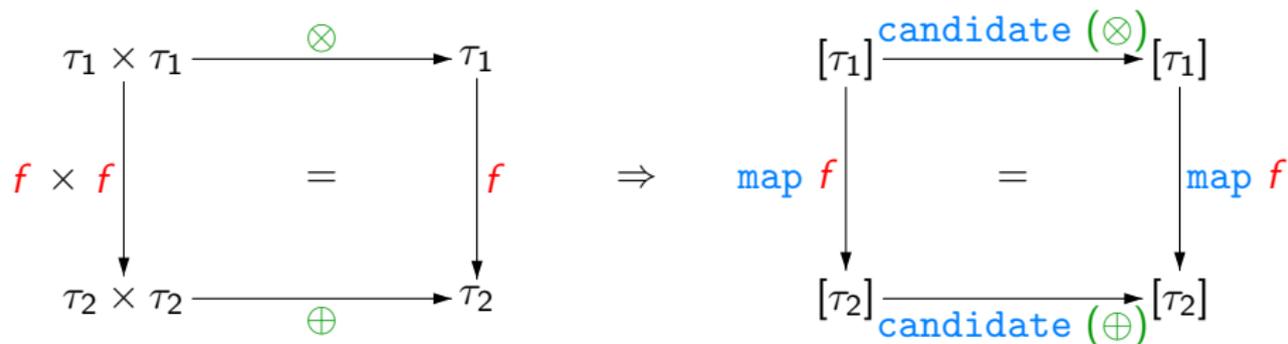
## Using the Free Theorems Generator

**Input:** `candidate :: (a -> a -> a) -> [a] -> [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  $f :: \tau_1 \rightarrow \tau_2$ ,  
 $(\otimes) :: \tau_1 \rightarrow \tau_1 \rightarrow \tau_1$ , and  $(\oplus) :: \tau_2 \rightarrow \tau_2 \rightarrow \tau_2$ :



## A Knuth-like 0-1-2-Principle [V. 2008]

Given: `scanl1` ::  $(\alpha \rightarrow \alpha \rightarrow \alpha) \rightarrow [\alpha] \rightarrow [\alpha]$   
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**data** Three = Zero | One | Two

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

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then the same holds for every type  $\tau$ , xs :: [ $\tau$ ], and  
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## Decomposing the 0-1-2-Principle

**Proposition 1:** 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 for every  $n \geq 0$ ,

$$\text{candidate } (++) \text{ } [[k \mid k \leftarrow [0..n]] = [[0..k \mid k \leftarrow [0..n]] \text{ } (*).$$

## Decomposing the 0-1-2-Principle

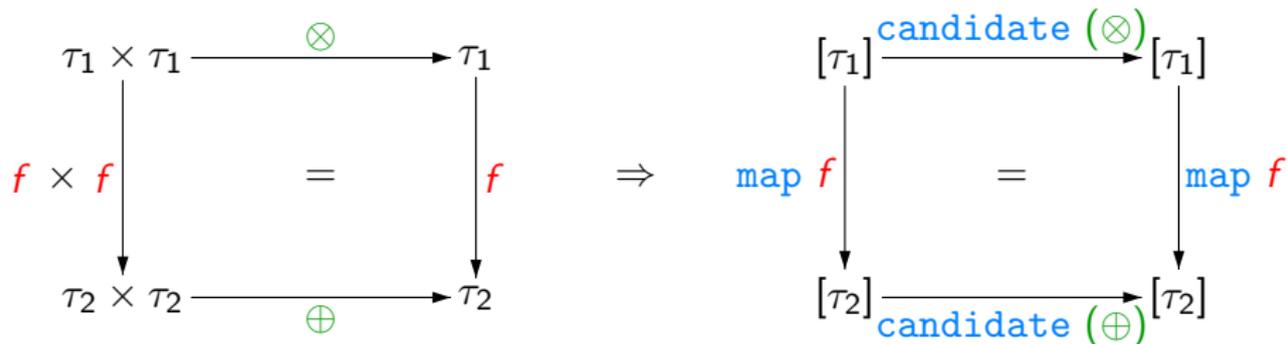
**Proposition 1:** If `candidate` ( $\oplus_1$ ) is correct on each list of the form  $[(\text{Zero}, )^* \text{One} (, \text{Zero})^* (, \text{Two})^*]$  and `candidate` ( $\oplus_2$ ) is correct on each list of the form  $[(\text{Zero}, )^* \text{One}, \text{Two} (, \text{Zero})^*]$ , then for every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

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

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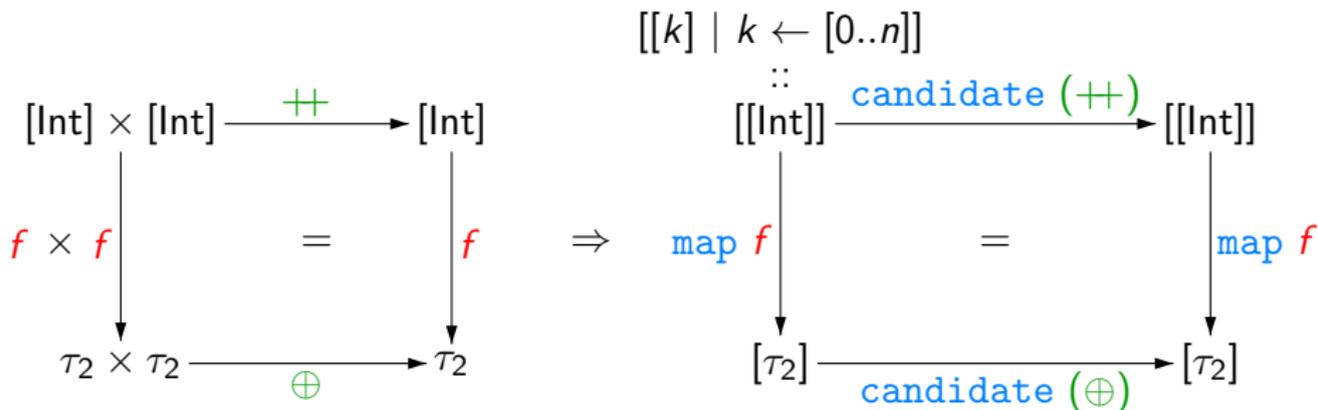
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## What Else?

- ▶ 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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