sorting networks the end game

# $\frac{|\text{uis cruz-filipe}^1 \quad \text{michael codish}^2}{\text{peter schneider-kamp}^1}$

<sup>1</sup>department of mathematics and computer science university of southern denmark

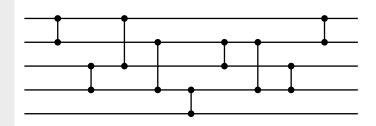
<sup>2</sup>department of computer science ben-gurion university of the negev, israel

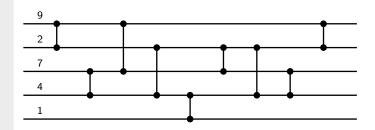
lata 2015, nice march 5th, 2015

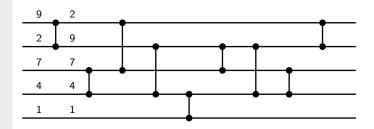
#### outline

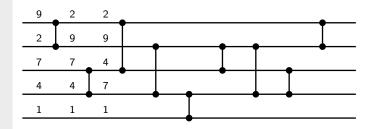
◆□▶ ◆圖▶ ◆臣▶ ◆臣▶ ─ 臣

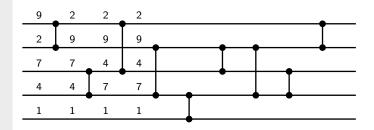
sorting networks in a nutshell

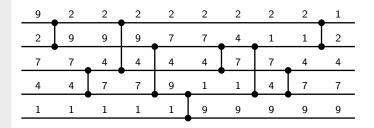






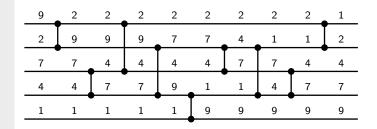






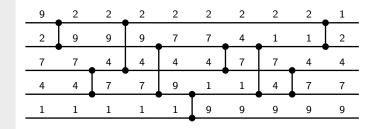
・ロト ・聞ト ・ヨト ・ヨト

æ.



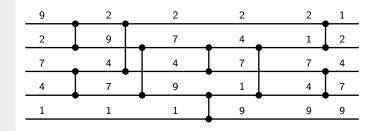
◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 の�?

*size* this net has 5 *channels* and 9 *comparators* 



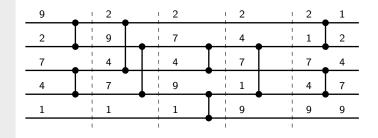
*size* this net has 5 *channels* and 9 *comparators* some of the comparisons may be performed in parallel

▲□▶ ▲圖▶ ▲臣▶ ▲臣▶ ―臣 … のへで



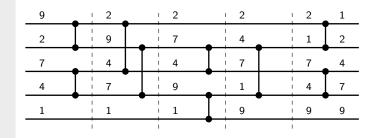
*size* this net has 5 *channels* and 9 *comparators* some of the comparisons may be performed in parallel

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ



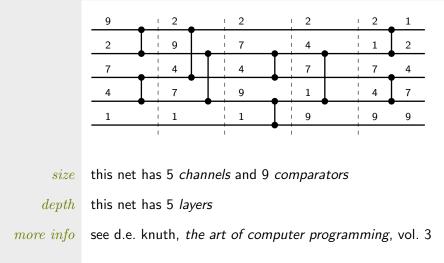
*size* this net has 5 *channels* and 9 *comparators* some of the comparisons may be performed in parallel

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ



◆□▶ ◆□▶ ◆臣▶ ◆臣▶ 臣 の�?

size this net has 5 channels and 9 comparatorsdepth this net has 5 layers



the optimal size problem

the optimal depth problem what is the minimal number of *comparators* on a sorting network on n channels  $(s_n)$ ?

what is the minimal number of *layers* on a sorting network on n channels  $(t_n)$ ?

the optimal size problem

the optimal depth problem

knuth 1973

what is the minimal number of *comparators* on a sorting network on n channels  $(s_n)$ ?

what is the minimal number of *layers* on a sorting network on n channels  $(t_n)$ ?

n	1	2	3	4	5	6	7	8	9	10
tn	0	1	3	3	5	5	6	6	7 6	7 6
		n	11	12	13		14	15	16 9 6	17
		+	8	8	9		9	9	9	11
		Ln	6	6	6		6	6	6	6

the optimal size problem

the optimal depth problem

parberry 1991

what is the minimal number of *comparators* on a sorting network on n channels  $(s_n)$ ?

what is the minimal number of *layers* on a sorting network on n channels  $(t_n)$ ?

п	1	2	3	4	5	6	7	8	9	10
tn	0	1	3	3	5	5	6	6	7	10 7
										17 11 <b>7</b>
		+	8	8	9		9	9	9	11
		Ln	7	7	7		7	7	7	7

the optimal size problem

the optimal depth problem

bundala & závodný 2013 what is the minimal number of *comparators* on a sorting network on n channels  $(s_n)$ ?

what is the minimal number of *layers* on a sorting network on *n* channels  $(t_n)$ ?

n	1	2	3	4	5	6	7	8	9	10
tn	0	1	3	3	5	5	6	6	7	10 7
		n	11	12	13		14	15	16 <b>9</b>	17
		tn	8	8	9		9	9	9	11
		-11	-	•	•		-	2	-	9

the optimal size problem

the optimal depth problem

ehlers & müller 2014 what is the minimal number of *comparators* on a sorting network on n channels  $(s_n)$ ?

what is the minimal number of *layers* on a sorting network on n channels  $(t_n)$ ?

п	1	2	3	4	5	6	7	8	9	10
tn	0	1	3	3	5	5	6	6	7	10 7
		n	11	12	13		14	15	16	17
		tn	8	8	9		9	9	9	17 <b>10</b> 9

the optimal size problem

the optimal depth problem

ehlers & müller 2015 what is the minimal number of *comparators* on a sorting network on n channels  $(s_n)$ ?

what is the minimal number of *layers* on a sorting network on n channels  $(t_n)$ ?

n	1	2	3	4	5	6	7	8	9	10
tn	0	1	3	3	5	5	6	6	7	10 7
		n	11	12	13		14	15	16	17
		tn	8	8	9		9	9	9	17 10

upper bounds obtained by concrete examples (1960s)

- Iower bounds obtained by mathematical arguments
- huge number of nets

upper bounds obtained by concrete examples (1960s)
lower bounds obtained by mathematical arguments
huge number of nets

parberry 1991

- exploration of symmetries  $\rightsquigarrow$  fixed first layer
- exhaustive search (200 hours of computation)

upper bounds obtained by concrete examples (1960s)
lower bounds obtained by mathematical arguments
huge number of nets

parberry 1991

- exploration of symmetries ~> fixed first layer
- exhaustive search (200 hours of computation)

▲□▶ ▲□▶ ▲□▶ ▲□▶ □ のQ@

bundala & závodný 2013

- reduced set of two-layer prefixes
- intensive sat-solving

upper bounds obtained by concrete examples (1960s)
 lower bounds obtained by mathematical arguments
 huge number of nets
 *parberry 1991* exploration of symmetries → fixed first layer

exhaustive search (200 hours of computation)

bundala & závodný 2013

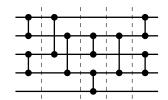
reduced set of two-layer prefixes

intensive sat-solving

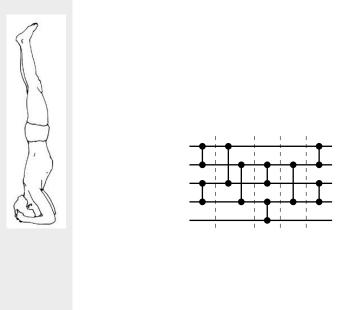
however...

- these techniques do not scale for t<sub>17</sub>
  sat-solvers cannot handle two-layer prefixes
  - too many possibilities for third layer

#### inspirational sources

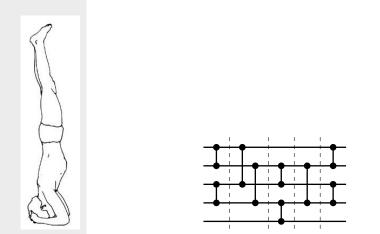


# $inspirational\ sources$



◆□ > ◆□ > ◆豆 > ◆豆 > ̄豆 \_ のへで

#### inspirational sources

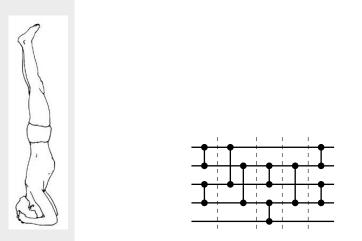




study the properties of the last layers of sorting networks

▲□▶ ▲圖▶ ▲臣▶ ▲臣▶ ―臣 … のへで

#### inspirational sources



#### main idea

study the properties of the last layers of sorting networks

- (surprisingly) never done before
  - very different problem

▲□▶ ▲□▶ ▲目▶ ▲目▶ = 目 - のへで

#### outline

▲□▶ ▲圖▶ ▲圖▶ ▲圖▶

æ

sorting networks in a nutshell

> the last two layers

re-adding redundancy

conclusions & future work

## redundancy

comparator

```
redundant let C; (i, j); C' be a comparator network
              the comparator (i, j) is redundant if x_i \leq x_i for all
              sequences x_1 \dots x_n \in \text{outputs}(C)
```

lemma if D and D' only differ in redundant comparators, then D is a sorting network iff D' is a sorting network

# redundancy

redundant comparator	let $C$ ; $(i, j)$ ; $C'$ be a comparator network the comparator $(i, j)$ is <i>redundant</i> if $x_i \le x_j$ for all sequences $x_1 \dots x_n \in \text{outputs}(C)$
lemma	if $D$ and $D'$ only differ in redundant comparators, then $D$ is a sorting network iff $D'$ is a sorting network
goal	restrict the search space by disallowing redundant comparators
problem	redundancy is a semantic property → not easily encodable in sat

▲□▶ ▲圖▶ ▲圖▶ ▲圖▶ = ● ● ●

the last layer

#### lemma

all comparators in the last layer of a non-redundant sorting network are of the form (i, i + 1)

## $the \ last \ layer$

*lemma* all comparators in the last layer of a non-redundant sorting network are of the form (i, i + 1)

theorem there are  $f_{n+1} - 1$  possible last layers in an *n*-channel sorting network with no redundancy

fibonacci sequence

$$f_1 = f_2 = 1$$
,  $f_{n+2} = f_{n+1} + f_n$ 

 $\rightsquigarrow$  this reduces the number of possible last layers on 17 channels from 211,799,312 to just 2,583

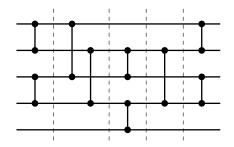
blocks i/ii

*k-block* a *k*-block in a sorting network is a set of channels that are connected after layer *k* 

blocks i/ii

k-block

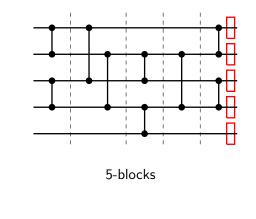
a k-block in a sorting network is a set of channels that are connected after layer k



blocks i/ii

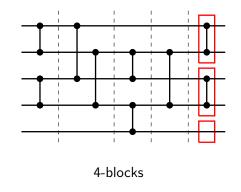
k-block

a k-block in a sorting network is a set of channels that are connected after layer k



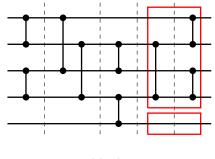
k-block

a k-block in a sorting network is a set of channels that are connected after layer k



k-block

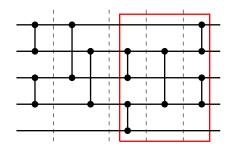
a k-block in a sorting network is a set of channels that are connected after layer k



3-blocks

k-block

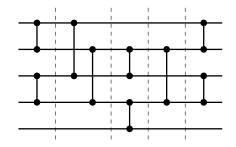
a k-block in a sorting network is a set of channels that are connected after layer k



2-blocks

k-block

a k-block in a sorting network is a set of channels that are connected after layer k



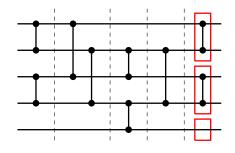
lemma

for every input  $\bar{x} \in \{0,1\}^n$ , there is at most one k-block that receives both 0s and 1s as inputs

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

k-block

a k-block in a sorting network is a set of channels that are connected after layer k



#### 4-blocks

lemma

for every input  $\bar{x} \in \{0,1\}^n$ , there is at most one k-block that receives both 0s and 1s as inputs

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

#### theorem

every comparator at layer k of a non-redundant sorting network connects adjacent k-blocks

*theorem* every comparator at layer *k* of a non-redundant sorting network connects adjacent *k*-blocks

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

corollary restrictions on the last two layers



*theorem* every comparator at layer *k* of a non-redundant sorting network connects adjacent *k*-blocks

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

corollary restrictions on the last two layers



*theorem* every comparator at layer *k* of a non-redundant sorting network connects adjacent *k*-blocks

*corollary* restrictions on the last two layers





◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

*theorem* every comparator at layer *k* of a non-redundant sorting network connects adjacent *k*-blocks

*corollary* restrictions on the last two layers





◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

*theorem* every comparator at layer *k* of a non-redundant sorting network connects adjacent *k*-blocks

*corollary* restrictions on the last two layers

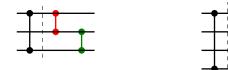


this substantially reduces the number of possibilities for the two last layers

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

*theorem* every comparator at layer *k* of a non-redundant sorting network connects adjacent *k*-blocks

*corollary* restrictions on the last two layers



this substantially reduces the number of possibilities for the two last layers

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()

... but it is not enough

## outline

・ロン ・四マ ・ヨマ ・ヨマ

æ

sorting networks in a nutsheli

> the last two layers

re-adding redundancy

conclusions & future work

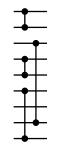
*new idea* we can reduce the search state even more by *adding* redundant comparators!

- *new idea* we can reduce the search state even more by *adding* redundant comparators!
  - *llnf* a sorting network is in *last layer normal form* if
    - its last layer only contains comparators between adjacent channels
      - its last layer does not contain adjacent unused channels

*new idea* we can reduce the search state even more by *adding* redundant comparators!

- *llnf* a sorting network is in *last layer normal form* if
  - its last layer only contains comparators between adjacent channels
  - its last layer does not contain adjacent unused channels

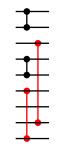
▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()



*new idea* we can reduce the search state even more by *adding* redundant comparators!

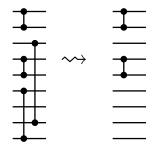
- *llnf* a sorting network is in *last layer normal form* if
  - its last layer only contains comparators between adjacent channels
  - its last layer does not contain adjacent unused channels

▲ロト ▲帰 ト ▲ ヨ ト ▲ ヨ ト ・ ヨ ・ の Q ()



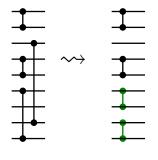
*new idea* we can reduce the search state even more by *adding* redundant comparators!

- *llnf* a sorting network is in *last layer normal form* if
  - its last layer only contains comparators between adjacent channels
  - its last layer does not contain adjacent unused channels



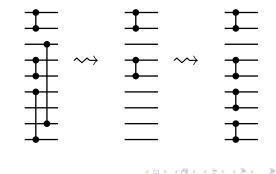
*new idea* we can reduce the search state even more by *adding* redundant comparators!

- *llnf* a sorting network is in *last layer normal form* if
  - its last layer only contains comparators between adjacent channels
  - its last layer does not contain adjacent unused channels



*new idea* we can reduce the search state even more by *adding* redundant comparators!

- *llnf* a sorting network is in *last layer normal form* if
  - its last layer only contains comparators between adjacent channels
  - its last layer does not contain adjacent unused channels



### some more numerology

#### *llnf* a sorting network is in *last layer normal form* if

- its last layer only contains comparators between adjacent channels
  - its last layer does not contain adjacent unused channels

### some more numerology

*llnf* a sorting network is in *last layer normal form* if

 its last layer only contains comparators between adjacent channels

its last layer does not contain adjacent unused channels

*theorem* there are  $p_{n+5}$  last layers in llnf on *n* channels

padovan sequence

$$p_0 = 1, \ p_1 = p_2 = 0, \ p_{n+3} = p_{n+1} + p_n$$

## some more numerology

llnf	a sorting network is in <i>last layer normal form</i> if					
•	<ul> <li>its last layer only contains comparators between adjacent channels</li> </ul>					
-	its last layer does not contain adjacent unused channels					
theorem	there are $p_{n+5}$ last layers in llnf on $n$ channels					
padovan sequence	$p_0 = 1, \ p_1 = p_2 = 0, \ p_{n+3} = p_{n+1} + p_n$					
e cy acriec	$\sim$ this further reduces the number of possible last layers					

on 17 channels from 2,583 to only 86

generalization we can apply the same reasoning to previous layers

generalization

we can apply the same reasoning to previous layers

lemma

if i < j are two channels unused in layer k of a sorting network belonging to different k-blocks, then the comparator (i, j) in layer k is redundant

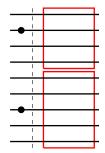
generalization

lemma

we can apply the same reasoning to previous layers

if i < j are two channels unused in layer k of a sorting network belonging to different k-blocks, then the comparator (i, j) in layer k is redundant

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへ⊙

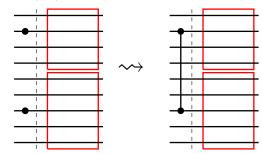


generalization

lemma

we can apply the same reasoning to previous layers

if i < j are two channels unused in layer k of a sorting network belonging to different k-blocks, then the comparator (i, j) in layer k is redundant



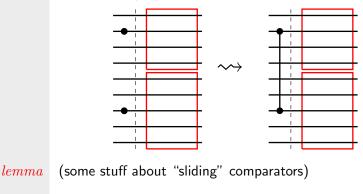
◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへ⊙

generalization

lemma

we can apply the same reasoning to previous layers

if i < j are two channels unused in layer k of a sorting network belonging to different k-blocks, then the comparator (i, j) in layer k is redundant



co-saturation

we can characterize the networks resulting from applying these transformations to the two last layers

co-saturation

we can characterize the networks resulting from applying these transformations to the two last layers

co-saturation theorem if there is a sorting network on n channels, then there is a co-saturated sorting network on n channels with the same depth

co-saturation

co-saturation theorem we can characterize the networks resulting from applying these transformations to the two last layers

if there is a sorting network on n channels, then there is a co-saturated sorting network on n channels with the same depth

 $\rightsquigarrow$  for n = 17, there are only 45,664 possibilities for the last two layers of a co-saturated sorting network

## practical impact

#### the good news we can encode co-saturation in sat

			unrestricted last two layers				
			slowest instance			total	
	n	#cases	#clauses	<b>#</b> vars	time	time	
	15	262	278,312	18,217	754.74	130,551.42	
	16	211	453,810	27,007	1,779.14	156,883.21	

		co-saturated last two layers			
		slowest instance			total
n	#cases	#clauses	#vars	time	time
15	262	335,823	25,209	148.35	19,029.26
16	211	314,921	22,901	300.07	24,604.53

◆□▶ ◆□▶ ◆三▶ ◆三▶ 三三 のへぐ

## outline

◆□▶ ◆圖▶ ◆臣▶ ◆臣▶ ─臣

sorting networks in a nutsheli

> the last two layers

re-adding redundancy

conclusions & future work

### results

- necessary conditions on last two layers (was: sufficient conditions on first two layers)
- co-saturation
- 6× speedup on optimal depth problem
- similar techniques give 4× speedup on optimal size problem
- can find 10-layer sorting network on 17 channels in one hour

key ingredient in computing exact value of t<sub>17</sub>

# thank you!