sorting networks the end game
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lata 2015, nice
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## outline

## sorting <br> networks in a <br> nutshell <br> the last two layers <br> re-adding redundancy

conclusions 8
future work:
a sorting network

a sorting network

a sorting network


## a sorting network


a sorting network

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size this net has 5 channels and 9 comparators
a sorting network

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depth this net has 5 layers
more info see d.e. knuth, the art of computer programming, vol. 3

## the optimization problems

the optimal size problem
the optimal depth problem
what is the minimal number of comparators on a sorting network on $n$ channels $\left(s_{n}\right)$ ?
what is the minimal number of layers on a sorting network on $n$ channels $\left(t_{n}\right)$ ?

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| $n$ | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $t_{n}$ | 0 | 1 | 3 | 3 | 5 | 5 | 6 | 6 | 7 | 7 |
|  |  |  |  |  |  |  |  |  | 6 | 6 |
|  |  | $n$ | 11 | 12 | 13 | 14 | 15 | 16 | 17 |  |
|  |  | 8 | 8 | 9 | 9 | 9 | 9 | 11 |  |  |
|  |  | $t_{n}$ | 6 | 6 | 6 | 6 | 6 | 6 | 6 |  |

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| $t_{n}$ | 0 | 1 | 3 | 3 | 5 | 5 | 6 | 6 | $\mathbf{7}$ | $\mathbf{7}$ |
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| $t_{n}$ | 0 | 1 | 3 | 3 | 5 | 5 | 6 | 6 | 7 | 7 |


| $n$ | 11 | 12 | 13 | 14 | 15 | 16 | 17 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $t_{n}$ | $\mathbf{8}$ | $\mathbf{8}$ | $\mathbf{9}$ | $\mathbf{9}$ | $\mathbf{9}$ | $\mathbf{9}$ | 11 <br> $\mathbf{9}$ |

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- lower bounds obtained by mathematical arguments
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- reduced set of two-layer prefixes
- intensive sat-solving
however... these techniques do not scale for $t_{17}$
- sat-solvers cannot handle two-layer prefixes
- too many possibilities for third layer
inspirational sources

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main idea

study the properties of the last layers of sorting networks

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study the properties of the last layers of sorting networks
- (surprisingly) never done before
- very different problem


## outline

## sorting

netuorks in a nutshell
the last two
layers

## re-adding redundancy

conclusions $\S$
future work
redundant let $C ;(i, j) ; C^{\prime}$ be a comparator network
comparator the comparator $(i, j)$ is redundant if $x_{i} \leq x_{j}$ for all sequences $x_{1} \ldots x_{n} \in$ outputs $(C)$
lemma if $D$ and $D^{\prime}$ only differ in redundant comparators, then $D$ is a sorting network iff $D^{\prime}$ is a sorting network

## redundancy

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lemma if $D$ and $D^{\prime}$ only differ in redundant comparators, then $D$ is a sorting network iff $D^{\prime}$ is a sorting network
goal restrict the search space by disallowing redundant comparators
problem redundancy is a semantic property
$\rightsquigarrow$ not easily encodable in sat
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 $f_{1}=f_{2}=1, f_{n+2}=f_{n+1}+f_{n}$
sequence
$\rightsquigarrow$ this reduces the number of possible last layers on 17 channels from 211,799,312 to just 2,583
blocks $i / i i$
k-block a $k$-block in a sorting network is a set of channels that are connected after layer $k$
blocks i/ii
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blocks i/ii
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4-blocks
blocks i/ii
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3-blocks
blocks i/ii
a $k$-block in a sorting network is a set of channels that are connected after layer $k$


2-blocks

## blocks i/ii

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

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k-block
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## blocks ii/ii

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restrictions on the last two layers

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

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. . . but it is not enough

## outline

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## revisiting the last layer

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

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llnf a sorting network is in last layer normal form if

- its last layer only contains comparators between adjacent channels
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## some more numerology

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$\ln f$
a sorting network is in last layer normal form if

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theorem

$$
p_{0}=1, p_{1}=p_{2}=0, p_{n+3}=p_{n+1}+p_{n}
$$ there are $p_{n+5}$ last layers in Ilnf on $n$ channels

## some more numerology

a sorting network is in last layer normal form if

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theorem there are $p_{n+5}$ last layers in Inf on $n$ channels
$p_{0}=1, p_{1}=p_{2}=0, p_{n+3}=p_{n+1}+p_{n}$
sequence
$\rightsquigarrow$ this further reduces the number of possible last layers on 17 channels from 2,583 to only 86


## co-saturation $i / i i$

generalization
we can apply the same reasoning to previous layers

## co-saturation $i / i i$

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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

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lemma (some stuff about "sliding" comparators)
co-saturation ii/ii
co-saturation
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## co-saturation $i i / i i$

co-saturation
co-saturation theorem
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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 ii/ii

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 <br> time |
| $n$ | \#cases | \#clauses | \#vars | time | timen |
| 15 | 262 | 278,312 | 18,217 | 754.74 | $\mathbf{1 3 0 , 5 5 1 . 4 2}$ |
| 16 | 211 | 453,810 | 27,007 | $1,779.14$ | $\mathbf{1 5 6 , 8 8 3 . 2 1}$ |


|  |  | co-saturated last two layers |  |  |  |
| ---: | ---: | ---: | :---: | :---: | :---: |
|  |  | slowest instance |  |  | total |
| $n$ | \#cases | \#clauses | \#vars | time | time |
| 15 | 262 | 335,823 | 25,209 | 148.35 | $\mathbf{1 9 , 0 2 9 . 2 6}$ |
| 16 | 211 | 314,921 | 22,901 | 300.07 | $\mathbf{2 4 , 6 0 4 . 5 3}$ |

# sorting 

## networks in a

 nutshell the last two layersre-adding redundancy
conclusions $\mathcal{G}$
future work

## results

- necessary conditions on last two layers (was: sufficient conditions on first two layers)
- co-saturation
- $6 \times$ speedup on optimal depth problem
- similar techniques give $4 \times$ speedup on optimal size problem
- can find 10 -layer sorting network on 17 channels in one hour
- key ingredient in computing exact value of $t_{17}$

