# optimizing a certified proof checker <br> for a large-scale computer-generated proof 

## luís cruz-filipe

(joint work with peter schneider-kamp)
department of mathematics and computer science university of southern denmark
cicm 2015
july 16th, 2015

## outline

## sorting <br> networks in a <br> nutshell <br> checking the result <br> making the checker work

conclusions 8
future work
a sorting network

a sorting network

a sorting network


## a sorting network


a sorting network

a sorting network

a sorting network

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

size this net has 5 channels and 9 comparators
more info see d.e. knuth, the art of computer programming, vol. 3

## a sorting network

| 9 | 2 | 2 | 2 | 2 | 2 | 2 | 2 | 2 | 1 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 2 | 9 | 9 | 9 | 7 | 7 | 4 | 1 | 1 | 2 |
| 7 | 7 | 4 | 4 | 4 | 4 | 7 | 7 | 4 | 4 |
| 4 | 4 | 7 | 7 | 9 | 1 | 1 | 4 | 7 | 7 |
| 1 | 1 | 1 | 1 | 1 | 9 | 9 | 9 | 9 | 9 |

size this net has 5 channels and 9 comparators
more info see die. knuth, the art of computer programming, vol. 3
the optimal size problem
what is the minimal number of comparators in a sorting network on $n$ channels $\left(s_{n}\right)$ ?

## history

optimal size
$s_{n}$ : minimal number of comparisons to sort $n$ inputs
knuth 1973

| $n$ | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $s_{n}$ | 0 | 1 | 3 | 5 | 9 | 12 | 16 | 19 | 25 | 29 |
|  |  |  |  |  |  |  |  |  | 23 | 27 |
|  |  | $n$ | 11 | 12 | 13 | 14 | 15 | 16 | 17 |  |
|  |  | $s_{n}$ | 35 | 39 | 45 | 51 | 56 | 60 | 73 |  |
|  |  |  | 31 | 35 | 39 | 43 | 47 | 51 | 56 |  |

- values for $n \leq 4$ from information theory
- values for $n=5$ and $n=7$ by exhaustive case analysis
knuth $\quad s_{n} \geq s_{n-1}+3 \quad \rightsquigarrow \quad$ values for $n=6,8$
van voorhis
$s_{n} \geq s_{n-1}+\lg (n)$
$\rightsquigarrow \quad$ other lower bounds


## history

optimal size
$s_{n}$ : minimal number of comparisons to sort $n$ inputs
yours truly 2014

| $n$ | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $s_{n}$ | 0 | 1 | 3 | 5 | 9 | 12 | 16 | 19 | $\mathbf{2 5}$ | $\mathbf{2 9}$ |
|  |  |  |  |  |  |  |  |  |  |  |
|  |  | $n$ | 11 | 12 | 13 | 14 | 15 | 16 | 17 |  |
|  |  | 35 | 39 | 45 | 51 | 56 | 60 | 73 |  |  |
|  |  | $s_{n}$ | $\mathbf{3 3}$ | $\mathbf{3 7}$ | $\mathbf{4 1}$ | $\mathbf{4 5}$ | $\mathbf{4 9}$ | $\mathbf{5 3}$ | $\mathbf{5 8}$ |  |

- generate-and-prune algorithm
- intensive parallel computing
- $\sim 16$ years of cpu time to compute $s_{9}$


## history

optimal size
$s_{n}$ : minimal number of comparisons to sort $n$ inputs
yours truly 2014

| $n$ | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $s_{n}$ | 0 | 1 | 3 | 5 | 9 | 12 | 16 | 19 | 25 | $\mathbf{2 9}$ |


| $n$ | 11 | 12 | 13 | 14 | 15 | 16 | 17 |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| $s_{n}$ | 35 | 39 | 45 | 51 | 56 | 60 | 73 |
|  | $\mathbf{3 3}$ | $\mathbf{3 7}$ | $\mathbf{4 1}$ | $\mathbf{4 5}$ | $\mathbf{4 9}$ | $\mathbf{5 3}$ | $\mathbf{5 8}$ |

- generate-and-prune algorithm
- intensive parallel computing
- $\sim 16$ years of cpu time to compute $s_{9}$

■ but how do we know that these results are correct?

## outline

## sorting

net works in a nutshell
checking the
result
making the checker work
conclusions $\S$
future work

## sorting networks

comparator network
sequence of comparators $(i, j)$ with $1 \leq i<j \leq n$ $n$ is the number of channels

## sorting networks

comparator network

0/1 lemma (knuth 1973)
sequence of comparators $(i, j)$ with $1 \leq i<j \leq n$ $n$ is the number of channels
$C$ is a sorting network on $n$ channels iff $C$ sorts all inputs in $\{0,1\}^{n}$

## sorting networks

comparator network

0/1 lemma (knuth 1973)
output
sorting network
sequence of comparators $(i, j)$ with $1 \leq i<j \leq n$ $n$ is the number of channels
$C$ is a sorting network on $n$ channels iff $C$ sorts all inputs in $\{0,1\}^{n}$
$C(\vec{x})$ denotes the output of $C$ on $\vec{x}=x_{1} \ldots x_{n}$
$C(\vec{x})$ is sorted for every input $\vec{x}$

## sorting networks

comparator network

0/1 lemma (knuth 1973)
output
sorting network
typical result

- program extraction $\rightsquigarrow$ haskell program (tests all inputs)
- nearly best possible algorithm (known result)
- short formalization ( $\sim 35$ lemmas)


## the key result

output lemma if outputs $(C) \subseteq$ outputs $\left(C^{\prime}\right)$ and $C^{\prime} ; N$ is a sorting (parberry 1991) network, then $C ; N$ is a sorting network

## the key result

output lemma (parberry 1991)
permuted output lemma
if outputs $(C) \subseteq$ outputs $\left(C^{\prime}\right)$ and $C^{\prime} ; N$ is a sorting network, then $C ; N$ is a sorting network if $\pi($ outputs $(C)) \subseteq$ outputs $\left(C^{\prime}\right)$ for some permutation $\pi$ and $C^{\prime}$ extends to a sorting network, then $C$ extends to a sorting network

## the key result

output lemma (parberry 1991)
permuted output lemma
definition
if outputs $(C) \subseteq \operatorname{outputs}\left(C^{\prime}\right)$ and $C^{\prime} ; N$ is a sorting network, then $C ; N$ is a sorting network
if $\pi$ (outputs $(C)) \subseteq$ outputs $\left(C^{\prime}\right)$ for some permutation $\pi$ and $C^{\prime}$ extends to a sorting network, then $C$ extends to a sorting network
$C \preceq_{\pi} C^{\prime}$ if $\pi$ (outputs $\left.(C)\right) \subseteq$ outputs $\left(C^{\prime}\right)$
$C \preceq C^{\prime}$ if $C \preceq_{\pi} C^{\prime}$ for some permutation $\pi$
the algorithm
init set $R_{0}^{n}=\{\emptyset\}$ and $k=0$
repeat until $k>1$ and $\left|R_{k}^{n}\right|=1$
generate $N_{k+1}^{n}$ extend each net in $R_{k}^{n}$ by one comparator in all possible ways
prune to $R_{k+1}^{n}$ keep only one element from each minimal equivalence class w.r.t. $\preceq^{T}$ step increase $k$
the algorithm
init set $R_{0}^{n}=\{\emptyset\}$ and $k=0$
repeat until $k>1$ and $\left|R_{k}^{n}\right|=1$
generate $N_{k+1}^{n}$ extend each net in $R_{k}^{n}$ by one comparator in all possible ways
prune to $R_{k+1}^{n}$ keep only one element from each minimal equivalence class w.r.t. $\preceq^{T}$
step increase $k$
pruning

- quadratic step
- inner loop searches among all permutations typically fails
- record successful subsumptions
the algorithm
init set $R_{0}^{n}=\{\emptyset\}$ and $k=0$
repeat until $k>1$ and $\left|R_{k}^{n}\right|=1$
generate $N_{k+1}^{n}$ extend each net in $R_{k}^{n}$ by one comparator in all possible ways
prune to $R_{k+1}^{n}$ keep only one element from each minimal equivalence class w.r.t. $\preceq^{T}$
step increase $k$
certified checker
- replace pruning cycle by oracle calls
- skeptic approach towards oracle
- use program extraction
- verifies all cases up to $s_{8}$, requires $\sim 18$ years for $s_{9} \ldots$


## checker soundness

```
Definition Oracle := list (comp_net * comp_net * (list nat)).
Inductive Answer : Set :=
    | yes : nat -> nat \(->\) Answer
    | no : forall m n:nat, forall R:list comp_net,
            NoDup R ->
            (forall C, In C R \(\rightarrow\) length \(C=n\) ) \(\rightarrow\)
            (forall C, In C R -> standard m C) -> Answer
    | maybe : Answer.
Fixpoint Generate_and_Prune (m n:nat) (O:list Oracle) :
    Answer.
Theorem GP_no : forall m n O R HRO HR1 HR2,
    Generate_and_Prune m n 0 = no m n R HRO HR1 HR2 ->
    forall C, sort_net m C -> length C > n.
Theorem GP_yes : forall m n 0 k ,
    Generate_and_Prune m n \(0=\) yes m k \(->\)
    (forall C, sort_net m C \(\rightarrow\) length \(C>=k\) ) /
    exists C, sort_net m C / length C = k.
```


## outline

## sorting <br> net works in a nutshell <br> checking the result <br> making the <br> checker work

conclusions $\xi^{6}$
future work

## an offline oracle

## typical approach

- call oracle to solve difficult tasks
- check result
- oracle is online, waiting for the next problem


## typical approach

- call oracle to solve difficult tasks
- check result
- oracle is online, waiting for the next problem
in our case
- oracle is pre-computed (offline)
- information from oracle guides algorithm potential for optimizations
improving the pruning step
old algorithm while oracle has a next subsumption $C \preceq_{\pi} C^{\prime}$
1 check that $C \preceq_{\pi} C^{\prime}$
2 check that $C, C^{\prime}$ are in the current set
3 remove $C^{\prime}$ from the current set (laziness performs the last two steps together)
old algorithm while oracle has a next subsumption $C \preceq_{\pi} C^{\prime}$
1 check that $C \preceq_{\pi} C^{\prime}$
2 check that $C, C^{\prime}$ are in the current set
3 remove $C^{\prime}$ from the current set
(laziness performs the last two steps together)

old algorithm while oracle has a next subsumption $C \preceq_{\pi} C^{\prime}$
1 check that $C \preceq_{\pi} C^{\prime}$
2 check that $C, C^{\prime}$ are in the current set
3 remove $C^{\prime}$ from the current set (laziness performs the last two steps together)
new algorithm
1 check that $C \preceq_{\pi} C^{\prime}$
2 store $C$
3 remove $C^{\prime}$ from the current set after: check that all stored networks are in the final set
improving the pruning step
new algorithm
1 check that $C \preceq_{\pi} C^{\prime}$
』 store $C$
3 remove $C^{\prime}$ from the current set after: check that all stored networks are in the final set
requirement
pre-processing
$\rightsquigarrow$ don't care how, they will be checked anyway!
improving the pruning step
new algorithm
$\square$ check that $C \preceq_{\pi} C^{\prime}$
- store $C$
© remove $C^{\prime}$ from the current set after: check that all stored networks are in the final set
optimizations
provide $C^{\prime}$ 's in the order they were generated (replaces quadratic step by linear)
improving the pruning step
new algorithm
$\square$ check that $C \preceq_{\pi} C^{\prime}$
- store C
(3) remove $C^{\prime}$ from the current set after: check that all stored networks are in the final set
optimizations
- provide $C^{\prime} s$ in the order they were generated (replaces quadratic step by linear)
- store Cs in a search tree (improves performance)
new algorithm
1 check that $C \preceq_{\pi} C^{\prime}$
』 store $C$
3 remove $C^{\prime}$ from the current set after: check that all stored networks are in the final set
optimizations
provide $C^{\prime} s$ in the order they were generated (replaces quadratic step by linear)
- store Cs in a search tree (improves performance)
- use search trees in some other places (duh?)
improving the pruning step
new algorithm while oracle has a next subsumption $C \preceq_{\pi} C^{\prime}$
$\square$ check that $C \preceq_{\pi} C^{\prime}$
- store $C$
(5) remove $C^{\prime}$ from the current set after: check that all stored networks are in the final set

improving the pruning step
new algorithm
1 check that $C \preceq_{\pi} C^{\prime}$
- store $C$
(3) remove $C^{\prime}$ from the current set after: check that all stored networks are in the final set
less memory
- extract naturals to native integers (unfortunately necessary, but clearly sound)
new algorithm while oracle has a next subsumption $C \preceq_{\pi} C^{\prime}$
$\square$ check that $C \preceq_{\pi} C^{\prime}$
『 store $C$
© remove $C^{\prime}$ from the current set after: check that all stored networks are in the final set
less memory
- extract naturals to native integers (unfortunately necessary, but clearly sound)
- represent comparators as a single number (halves memory consumption)


## philosophical considerations

the good news
checker verifies $s_{9}$ in around 6 days using "moderate" resources not-so-new commonplace cpu, 64 gb ram

## philosophical considerations

the good news
checker verifies $s_{9}$ in around 6 days using "moderate" resources
(almost) no changes to the formalization
relatively quick changes (a few hours each)
mostly require proving that optimized version coincides with original version

## philosophical considerations

the good news
more good news

- relatively quick changes (a few hours each)
- mostly require proving that optimized version coincides with original version
a new methodology?


## sorting

## networks in a

 nutshell
## checking the

 resultmaking the checker work
conclusions $\mathcal{G}$ future work

## conclusions $\begin{aligned} & \text { future work }\end{aligned}$

- formal verification of exact values of $s_{n}$ for $n \leq 9$
- new methodology (offline oracles)
- able to deal with $\sim 27 \mathrm{gb}$ of proof witnesses
- clean separation between formalization ("mathematics") and optimization of checker ("computer science")
next episodes
- formal proof of van voorhis' $s_{n} \geq s_{n-1}+\lg (n)$ to obtain $S_{10}$
- other problems in sorting networks
- application of this method to other search-intensive proofs

