# Unboundedness for Recursion Schemes: A Simpler Type System 

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Recursion schemes = we consider trees generated by higher-order recursion schemes

Unboundedness = we provide an algorithm checking whether some properties in these trees are unbounded

Simpler type system = we give a new, simpler method, leading to a practical algorithm

## Higher-order recursion schemes - what is this?

## Definition

Higher-order recursion schemes $=$ a generalization of context-free grammars, where nonterminals can take arguments. We use them to generate trees.

Equivalent definition: simply-typed lambda-calculus + recursion
In other words:

- programs with recursion
- higher-order functions (i.e., functions taking other functions as parameters)
- every function/parameter has a fixed type
- no data values, only functions


## Higher-order recursion schemes - example

Ranked alphabet: (rank = number of children) $a$ of rank $2, b$ of rank $1, c$ of rank 0

Nonterminals:
$S$ (starting), $A, D$

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$D b c \rightarrow b(b c)$
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$D(D b) c \rightarrow D b(D b c) \rightarrow b(b(D b c))$

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## Sorts (simple types)

Ranked alphabet: (rank = number of children) $a$ of rank 2, $b$ of rank 1, $c$ of rank 0

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Every nonterminal (every argument) has assigned some "sort", for example:

- o - a tree
- $o \rightarrow O$ - a function that takes a tree, and produces a tree
- $o \rightarrow(o \rightarrow o) \rightarrow o$ - a function that takes a tree and a function of type $o \rightarrow o$, and produces a tree


## Model-checking

Theorem [Ong 2006]
MSO model-checking on trees generated by recursion schemes is decidable.

Input: recursion scheme $\mathcal{G}$, MSO formula $\phi$
Question: is $\phi$ true in the (infinite) tree generated by $\mathcal{G}$ ?

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This procedure can be used for model-checking programs written in functional programming languages:

Input: a program $P$, a property $\psi$
Question: does $P$ satisfy $\psi$ ?
CEGAR loop, etc.
There exist tools that take (short) programs in Ocaml and can verify some useful properties.

## Several recent papers - can we go beyond MSO?

What about checking properties not expressible in MSO, e.g., talking about boundedness?

## Unboundedness - basic problem

Input: recursion scheme $G$
Question: In the tree generated by $G$, are there (finite) branches with arbitrarily many occurrences of a symbol "a"?
( $\forall n \exists$ branch with $>n$ occurrences of $a$ )


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Notice:
There may be no path with infinitely many „a".
Our property is not regular!!!
(the result [Ong - LICS 2006] does not help here)

## Simultaneous unboundedness

Input: recursion scheme $G$, set of symbols $A$ Question: In the tree generated by $G$, are there (finite) branches with arbitrarily many occurrences of every symbol from A?
( $\forall n \exists$ branch $\forall a \in A$ there are $>n$ occurrences of $a$ on the branch)


## Known results

Given a recursion scheme $\mathcal{G}$ generating a tree $\mathcal{T}$, the following problems are decidable:

- Does $\mathcal{T}$ satisfy $\phi \in \mathrm{MSO}$ ? [Ong 2006] (equivalently: is $\mathcal{T}$ accepted by a parity automaton)?
- Simultaneous unboundedness for $\mathcal{T}$. [Clemente, P., Salvati, Walukiewicz 2016]
- Does $\mathcal{T}$ satisfy $\phi \in \mathrm{WMSO}+\mathrm{U}$ ? [P. 2018]
- Only if $\mathcal{G}$ is safe: Is $\mathcal{T}$ accepted by a B-automaton $\mathscr{A}$ ?
[Barozzini, Clemente, Colcombet, P. 2020]


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[Barozzini, Clemente, Colcombet, P. 2020]
- The problem is n-EXP complete for schemes of order n
- There exist tools solving this problem in practice: $\rightarrow$ TRecS, HorSat, ... [Kobayashi, Broadbent, ...]
$\rightarrow$ HORSC, TravMC2 [Neatherway, Ramsay, Ong, ...]
- The tools are based on intersection type systems


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- Only if $\mathcal{G}$ is safe: Is $\mathcal{T}$ accepted by a B-automaton $\mathscr{A}$ ?
[Barozzini, Clemente, Colcombet, P. 2020]
- solution for safe schemes [Hague, Kochems, Ong 2016]
- solution for all schemes [Clemente, P., Salvati, Walukiewicz 2016]
- can be solved in n-EXP for schemes of order n [P. 2017]
- this paper: can be solved in practice (for safe schemes)


## Order of a sort

$$
\begin{aligned}
& \operatorname{ord}(o)=0 \\
& \operatorname{ord}\left(\alpha_{1} \rightarrow \ldots \rightarrow \alpha_{k} \rightarrow 0\right)=1+\max \left(\operatorname{ord}\left(\alpha_{1}\right), \ldots, \operatorname{ord}\left(\alpha_{k}\right)\right)
\end{aligned}
$$

For example:

- $\operatorname{ord}(o)=0$,
- $\operatorname{ord}(o \rightarrow o)=\operatorname{ord}(o \rightarrow o \rightarrow o)=1$,
- $\operatorname{ord}(o \rightarrow(o \rightarrow o) \rightarrow o)=2$

Order of a recursion scheme
= maximal order of (a type of) its nonterminal

## What is safety?

Restriction on terms appearing on right sides of rules:

- unrestricted terms:

$$
M::=a|x| A \mid M N
$$

- safe terms:

$$
\begin{aligned}
& M::=a|x| A \mid M N_{1} \ldots N_{k} \\
& \quad \text { only if } \operatorname{ord}\left(M N_{1} \ldots N_{k}\right) \leq o r d\left(N_{i}\right) \text { for all } i
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In other words: if we apply an argument of some order $k$, then we have to apply also all arguments of order $\geq k$

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Let's check safety for our example HORS:

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$\operatorname{ord}(\mathrm{D} f)=1 \leq 1=\operatorname{ord}(f) \rightarrow \mathrm{OK}$
All other subterms are of order $0 \rightarrow \mathrm{OK}$

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Example: Unsafe HORS (generating "Urzyczyn's tree" U):
Types: $a^{o \rightarrow 0 \rightarrow 0}, b^{o \rightarrow 0}, c^{o \rightarrow o}, d^{0}, e^{o}, S^{o}, F^{(0 \rightarrow 0 \rightarrow 0 \rightarrow 0 \rightarrow 0}$
Rules: $S \rightarrow F b d e$

$$
F f x y \rightarrow a(F(F f x) y(c y))(a(f y) x)
$$

$X$ unsafe
(and not equivalent
$\operatorname{ord}(F f x)=1>0=\operatorname{ord}(x)$ to any safe HORS)
( $F$ expects two order-0 arguments; we have applied one ( $x$ ), but not the other)

## Why safety helps?

Theorem [Knapik, Niwiński, Urzyczyn 2002; Blum, Ong 2007] Substitution (hence $\beta$-reduction) in safe $\lambda$-calculus can be implemented without renaming bound variables.

Bad example: when you substitute ( $\lambda x . y x$ ) [ $a x x / y$ ], it is necessary to change the first two $x$ to some other variable name

## Our solution to the unboundedness problem

We provide a system of intersection types.
A type derivation says:

- which arguments / free variables are used (and with which type)
- if the term is „productive":
» produces the letter „a", or
> used a productive argument twice
"Productive" places in a type derivation can be counted.


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## Theorem

$G$ has type derivations with arbitrarily many productive places
the tree generated by $G$ has branches with arbitrarily many symbols „a"
soundness - always
completeness - proof only for safe schemes

- ??? for other schemes


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Algorithm \& implementation:

- based on HORSAT2
- tries to find all possible type derivations
- found a derivation with a "productive loop" $\rightarrow$ answer YES
- optimizations are necessary - mostly coming from HORSAT2 (which types for subterms may be useful)


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Evaluation:

- tried on (adapted) benchmarks from HORSAT, coming from real verification problems + some new examples
- 24 inputs, only 2 timeouts (>600s)
- on other inputs works in $<60 \mathrm{~s}$, often $<1$ s
- size (largest solved): 400 rules, order 8


## Conclusion

- We consider the unboundedness problem for recursion schemes
- We propose a new, simpler type system for this problem
- Correctness proof for safe schemes
- Open question: does the type system work for all schemes?
- We implemented a tool working relatively well in practice

Thank you!

