

Fast Offline Partial Evaluation of Large Logic Programs

Germán Vidal, T. U. Valencia, Spain

Joint work with Michael Leuschel, U. Düsseldorf, Germany

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Introduction

context: offline partial evaluation of logic programs

- PE = BTA + specialization
- BTA = termination analysis + propagation of BTs + annotation

Annotations

- calls are annotated as `unfold/memo`
- arguments are annotated as `static/dynamic`

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specialization

- ① take an atom and unfold it as much as possible
(following the unfold/memo annotations) local control
- ② for every atom in the leaves global control
 - generalize arguments marked as dynamic
 - add it to the set of atoms to be partially evaluated
- ③ go to step (1)

Termination issues in PE are classified into

- **local termination:** no atom is infinitely unfolded
- **global termination:** no infinitely many atoms are unfolded

Annotations are **safe** when:

- unfold/memo annotations guarantee local termination
- static/dynamic annotations guarantee global termination

[all arguments marked as static are ground at specialization time]

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Motivation

Fully automatic BTA for logic programs

[Craig, Gallagher, Leuschel, Henriksen, LOPSTR 2004]

- current implementation does not guarantee global termination
- complex design (different analyses running on different Prolog systems) → difficult to maintain
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In this paper, we propose a new BTA:

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Termination analysis

Essential component of BTA

Choice:

dependent of a computation rule

- more accurate
- slower (requires reexecution every time an annotation changes)

independent of a computation rule



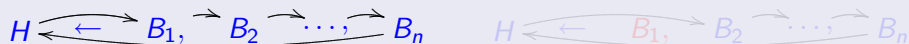
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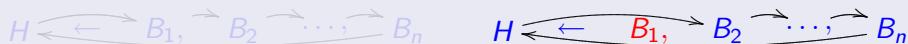
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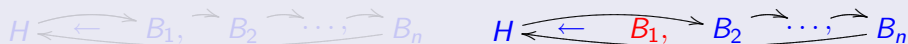
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Quasi-termination analysis for logic programs [Vidal, PEPM 2007]

- considers **strong** termination (independent of the computation rule)
- based on size-change analysis [Lee, Jones, Ben-Amram, POPL 2001]
- covers termination (unfold/memo) and quasi-termination (static/dynamic)

size-change analysis

- 1 construction of size-change graphs
- 2 computation of transitive closure (by concatenation)
- 3 identification of program loops (maximal graphs)

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Construction of size-change graphs

Size-change graphs are used to trace size changes of predicate arguments from one call to another

Parameterized by a **reduction pair** (\succsim, \succ)

- 1 \succsim is a **quasi-order** [reflexive & transitive]
- 2 \succ is a **well-founded order** [irreflexive & transitive]
- 3 \succsim and \succ are **closed under substitutions** [$s \succsim t \Rightarrow \sigma(s) \succsim \sigma(t)$]
- 4 they are **compatible**
(i.e., $\succsim \circ \succ \subseteq \succ$ and $\succ \circ \succsim \subseteq \succ$ but $\succsim \subseteq \succ$ is not necessary)

which can be induced from a **symbolic norm**

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Symbolic norms

symbolic term-size norm

$$\|t\|_{ts} = \begin{cases} n + \sum_{i=0}^n \|t_i\|_{ts} & \text{if } t = f(t_1, \dots, t_n), n \geq 0 \\ t & \text{if } t \text{ is a variable} \end{cases}$$

E.g., $\|f(\mathbf{a}, \mathbf{b})\|_{ts} = 2$, but $\|f(\mathbf{X}, \mathbf{Y})\|_{ts} = 2 + \mathbf{X} + \mathbf{Y}$

symbolic list-length norm

$$\|t\|_{ll} = \begin{cases} 1 + \|Xs\|_{ll} & \text{if } t = [X|Xs] \\ t & \text{if } t \text{ is a variable} \\ 0 & \text{otherwise} \end{cases}$$

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Example: construction of size-change graphs

incList([], -, []).

incList([**X|R**], **I**, **L**) \leftarrow **iList**(**X**, **R**, **I**, **L**).

iList(**X**, **R**, **I**, [**XI|RI**]) \leftarrow **add**(**I**, **X**, **XI**),
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add(**0**, **Y**, **Y**).

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\mathcal{G}_1 : **incList** \longrightarrow **iList**



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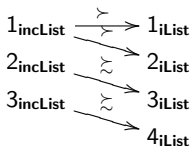
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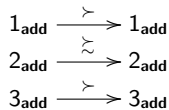
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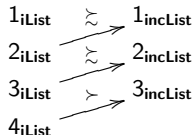
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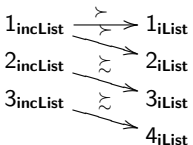
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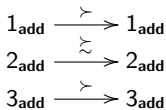
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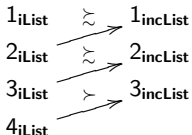
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Transitive closure:

- compute all possible concatenations of graphs

Example



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Identification of program loops

maximal graph

A size-change graph G is maximal if

- 1 its input and output nodes are the same
- 2 it is idempotent, i.e., $G = G \cdot G$

maximal graph \approx program loop

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Size-change terminating! (acc. to [Lee, Jones, Ben-Amram, POPL 2001])

Too weak in logic programming...

$$\begin{array}{l}
 \mathbf{add}(X, Y, Z) \Rightarrow \{X \mapsto s(X'), Z \mapsto s(Z')\} \\
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Local termination

instantiated enough [Lindenstrauss, Sagiv, ICLP 1997]

Term t is instantiated enough w.r.t. $\|\cdot\|$ if $\|t\|$ is an integer

sufficient condition for termination

If every maximal graph for P contains at least one edge

$$i_p \xrightarrow{\gamma} i_p$$

such that, in every possible call, $p(t_1, \dots, t_n)$, the argument t_i is instantiated enough w.r.t. $\|\cdot\|$, then P is terminating

such that the i -th argument of p is classified as **static**, then P is terminating

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Must ensure **quasi-termination** (only finitely many different atoms)

In our previous approach, global termination is ensured when

- for every predicate p and for every maximal graph for p , either
 - the previous condition hold or
 - there is an edge to every argument
- and the considered symbolic norm is **bounded**

i.e., the set $\{s \mid ||t|| \geq ||s||\}$ is finite for any term t

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In our previous approach, global termination is ensured when

- for every predicate p and for every maximal graph for p , either
 - the previous condition hold or
 - there is an edge to every argument
- and the considered symbolic norm is **bounded**

i.e., the set $\{s \mid ||t|| \geq ||s||\}$ is finite for any term t

$$\begin{array}{l}
 1_{add} \xrightarrow{\gamma} 1_{add} \\
 2_{add} \xrightarrow{\gamma} 2_{add} \\
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 \end{array}
 \quad \text{with } 1_{add} \text{ or } 2_{add} \text{ static}$$

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But the symbolic list-length norm is not bounded...

$$||[a]|| = ||[s(a)]|| = ||[s(s(a))]|| = \dots = 1$$

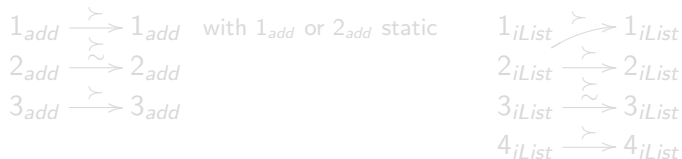
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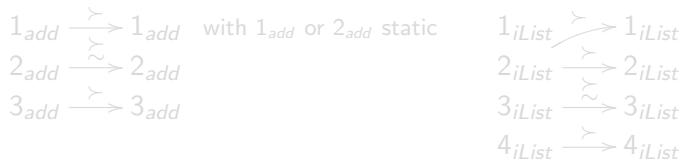
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Is boundedness really needed?

Alternative approach

- use any symbolic norm (even if non-bounded)
- generalize problematic parts of atoms before adding them to the set of atoms to be partially evaluated (global level)

$m_{gg}^{\|\cdot\|}$: most general generalization of an atom w.r.t. a norm

$$m_{gg}^{\|\cdot\|}(t) = t'$$

if t' is the most general generalization of t such that $\|t\| = \|m_{gg}^{\|\cdot\|}(t)\|$

$$m_{gg}^{\|\cdot\|}([X]) = [X]$$

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- 1 if every maximal graph for p fulfills the local termination condition, i_p is marked as **static**
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Example

`incList([], -, []).`

`incList([X|R], I, L) ← iList(X, R, I, L).`

`iList(X, R, I, [XI|RI]) ← add(I, X, XI),
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$\mathcal{G}_{14} : \text{incList} \longrightarrow \text{incList}$



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- 1 User's input: *incList(dynamic, static, dynamic)*
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 - local termination: *incList* \mapsto *memo*, *iList* \mapsto *memo*, *add* \mapsto *unfold*
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Much room for improvement:

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