



22nd International Joint Conference on Artificial Intelligence (IJCAI'11), Barcelona, Spain, July 19-22, 2011
 Best Paper Track: International Conference on Logic Programming and Nonmonotonic Reasoning (LPNMR'11)



Pushing Efficient Evaluation of HEX Programs by Modular Decomposition

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In a Nutshell

- ▶ HEX-Programs
 - ▶ knowledge representation language
 - ▶ extends Answer Set Programming (ASP)
 - ▶ comprise **external atoms** for external knowledge/computation
- ▶ Evaluation Efficiency
 - ▶ original model calculation algorithm has several drawbacks
 - ▶ realizing applications in HEX called for efficiency improvements
- ▶ Theoretical Contributions
 - ▶ **generalized program splitting** theorem
 - ⇒ program fragments may overlap, branch, and join
 - ⇒ constraints shared among fragments
 - ▶ program **decomposition** via a directed acyclic graph
 - ⇒ nodes are program fragments, edges represent dependencies
 - ▶ sound and complete model enumeration using this graph
- ▶ Effect of Improvements
 - ▶ independent program fragments are evaluated independently
 - ▶ early elimination of models
 - ▶ considerably less redundant computations in relevant scenarios
 - ▶ parallel evaluation possible

⇒ **Improved time and space efficiency!**
- ▶ Open Source Implementation dlhex (supports dlv and clingo):
<http://www.kr.tuwien.ac.at/research/systems/dlhex/>

HEX

External Atom $\&g[\vec{x}](\vec{y})$

- ▶ input list $\vec{x} = x_1, \dots, x_n$ and output list $\vec{y} = y_1, \dots, y_m$ of terms
- ▶ Model: $I \models \&g[\vec{x}](\vec{y})$ iff **oracle function** $f_{\&g}(I, \vec{x}, \vec{y})$ is true
- ▶ Computational view: $I \models \&g[\vec{x}](\vec{y})$ for all $\vec{y} \in F_{\&g}(I, \vec{x})$
- ▶ External computation depends on **interpretation**
 - ⇒ external atoms cannot be evaluated during grounding process!

Example (choose a plan and a usage, determine resource needs):

$$\left\{ \begin{array}{l} \text{choose}(a, c, d) \leftarrow \text{choose}(b, e, f) \leftarrow \\ \text{plan}(a) \vee \text{plan}(b) \leftarrow \\ \quad \text{need}(p, C) \leftarrow \&res[\text{plan}](C) \\ \text{use}(X) \vee \text{use}(Y) \leftarrow \text{plan}(P), \text{choose}(P, X, Y) \\ \quad \text{need}(u, C) \leftarrow \&res[\text{use}](C) \\ \quad \leftarrow \text{need}(_, \text{money}) \end{array} \right.$$

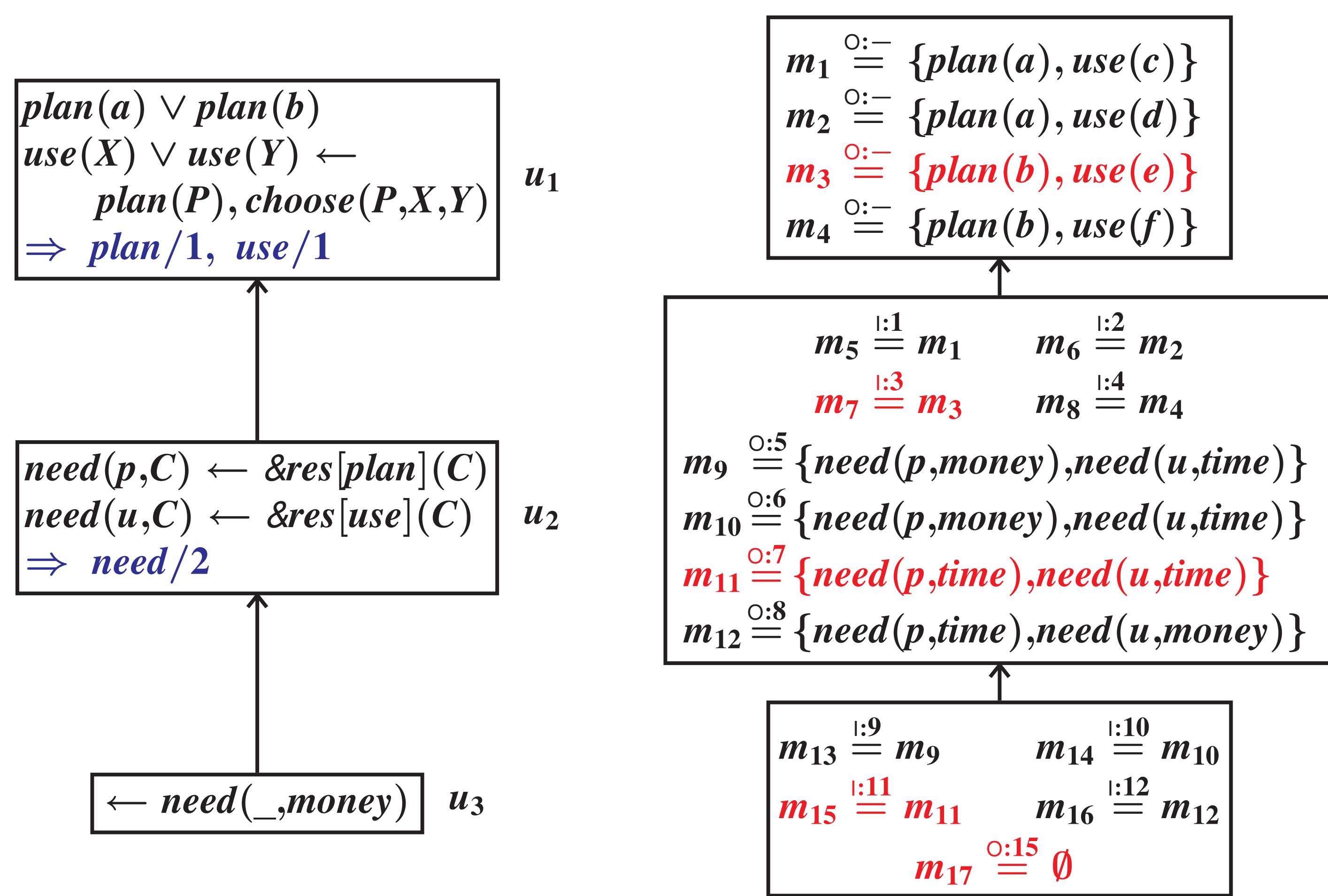
The oracle for $\&res$ is given as

$$\begin{array}{l} I \models \&res[p](\text{money}) \text{ if } p(C) \in I \text{ for } C \in \{a, f\}, \\ I \models \&res[p](\text{time}) \text{ if } p(C) \in I \text{ for } C \in \{b, c, d, e\}, \text{ and} \\ I \not\models \&res[p](X) \text{ in all other cases.} \end{array}$$

The single answer set of the above HEX program is

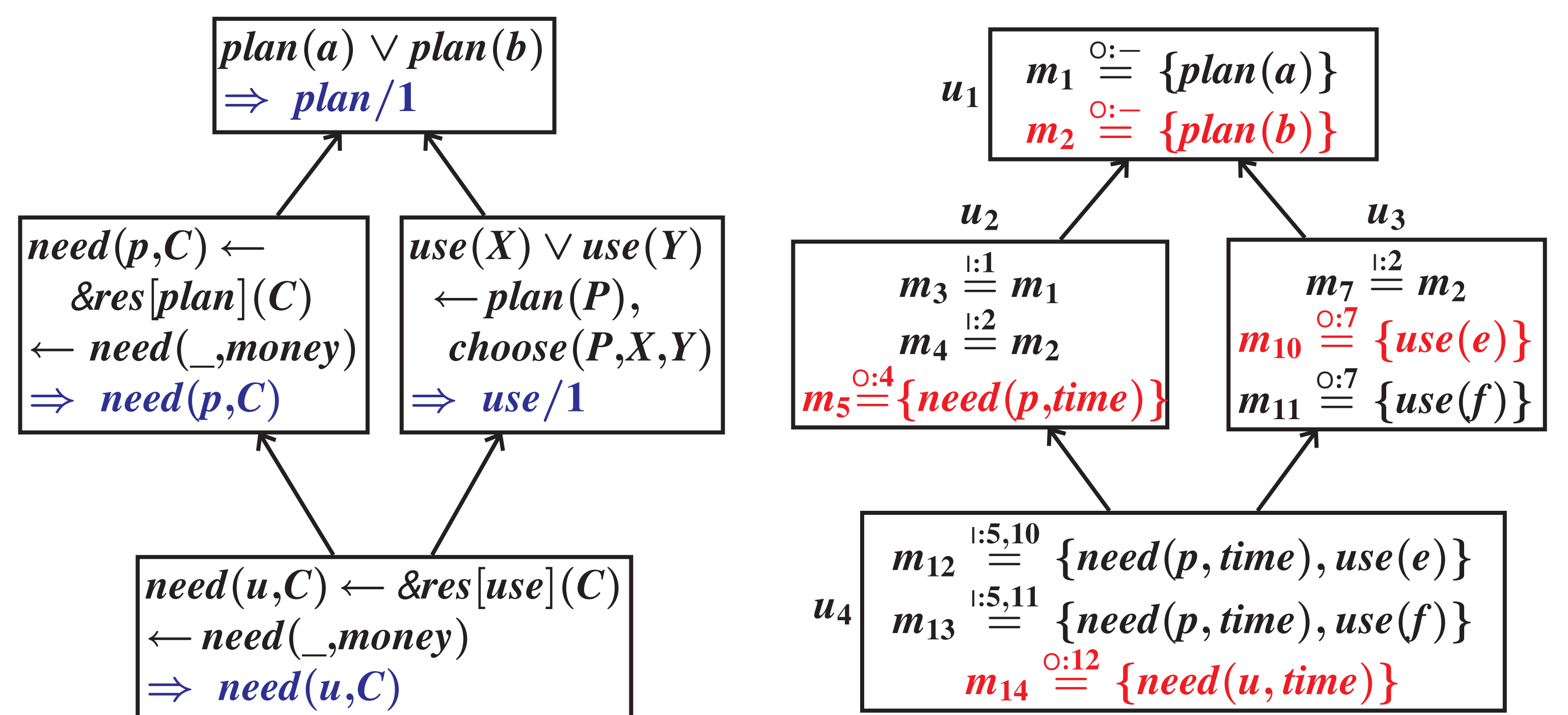
$$\left\{ \begin{array}{l} \text{plan}(b), \&res[\text{plan}](\text{time}), \text{need}(p, \text{time}), \\ \text{use}(e), \&res[\text{use}](\text{time}), \text{need}(u, \text{time}) \end{array} \right.$$

Previous Evaluation Method



- ▶ external atoms depend on output of previous program fragments
- ▶ use largest program fragments possible wrt. external calculations

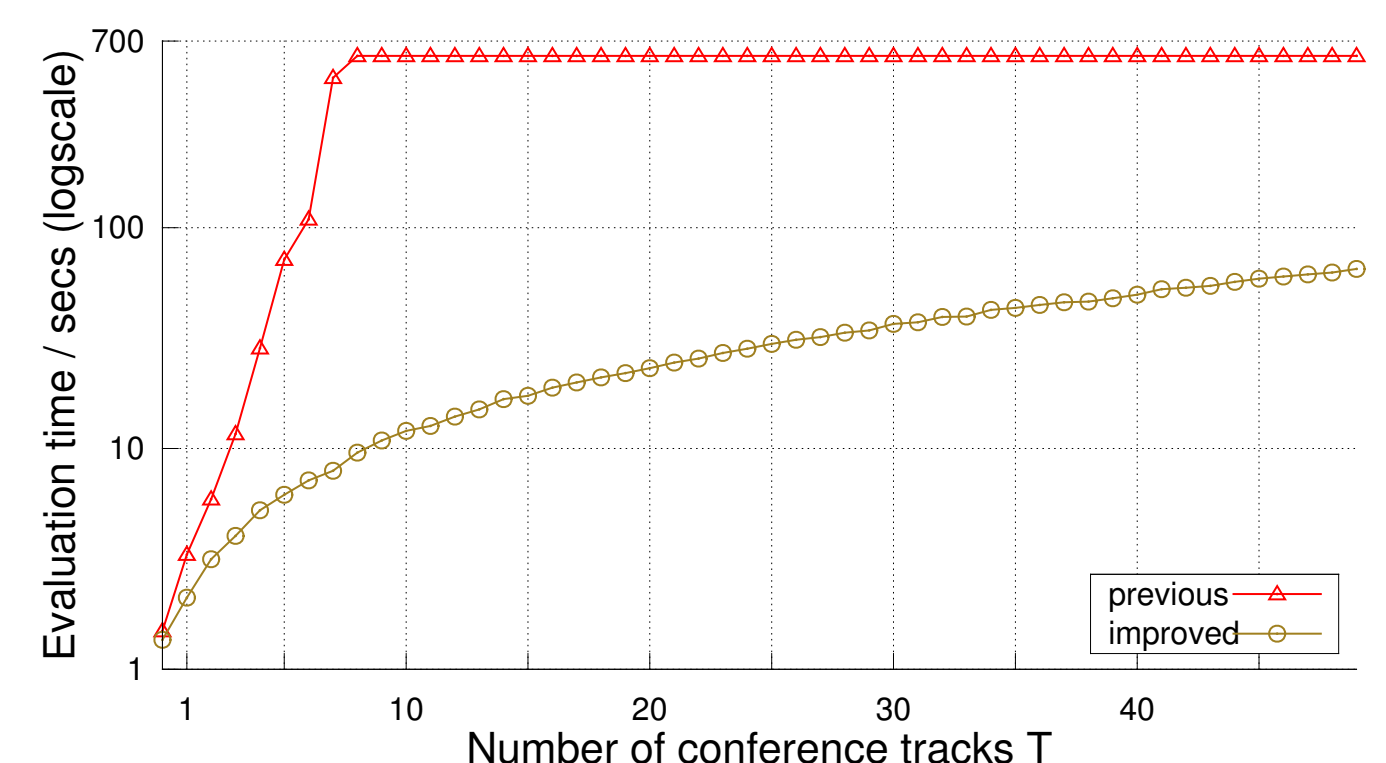
Improved Evaluation Method



- ▶ external atoms depend on output of previous program fragments
- ▶ program fragments model **disjoint sets of atoms**
- ▶ rule dependencies and negative constraint dependencies satisfied
- ▶ positive constraint dependencies satisfied in at least one fragment
- ▶ input models can be joined if they share a **common ancestor model**

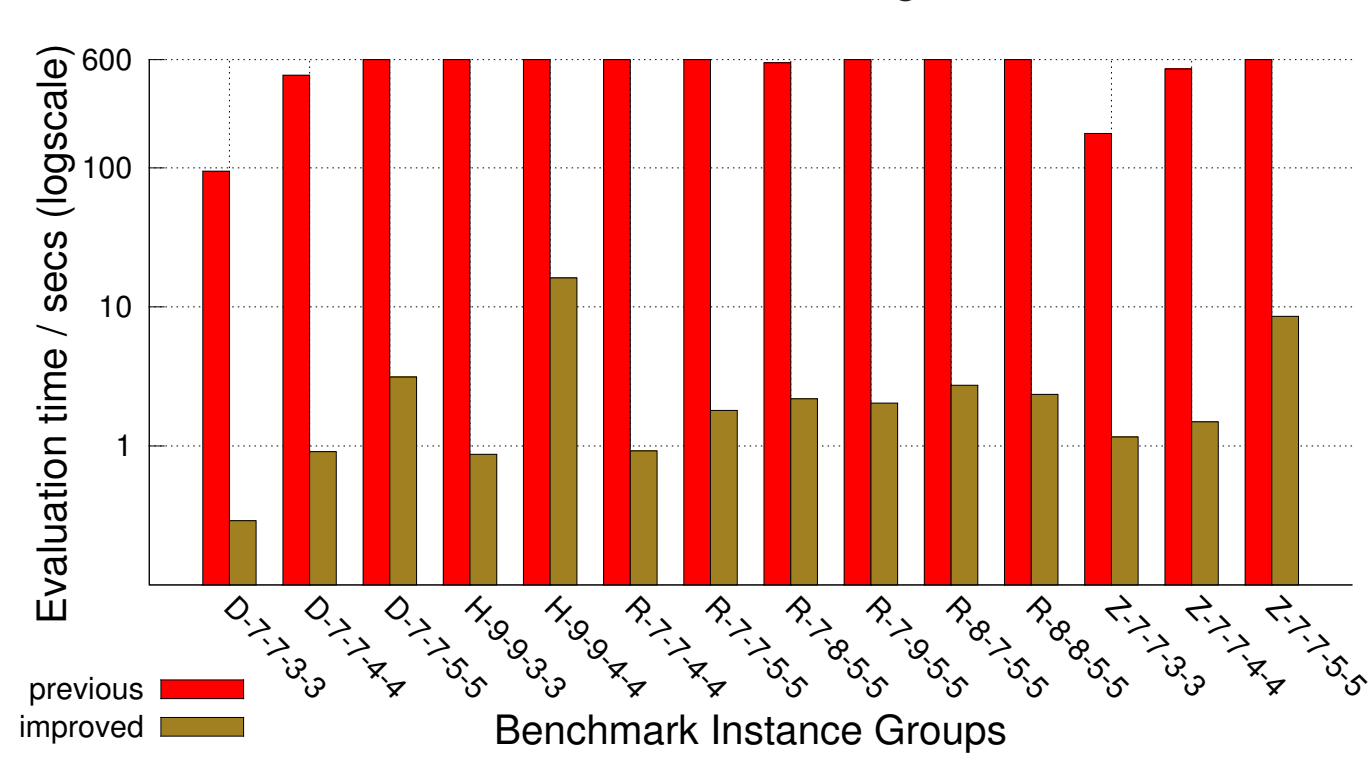
Experimental Results

Reviewer Selection



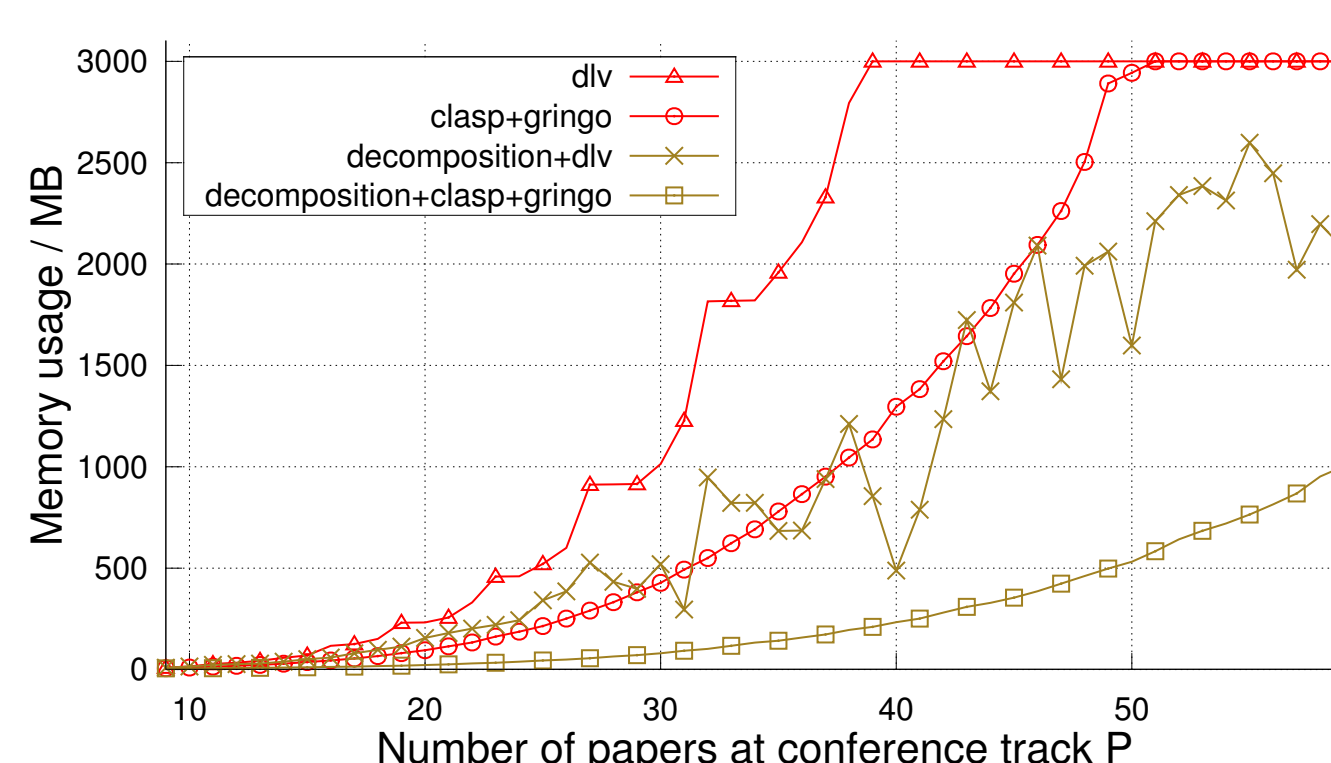
- ▶ exponential speedup for synthetic benchmark

Multi-Context Systems



- ▶ improved scalability of application! (1 sec vs. 600 sec)

Pumping Plain ASP Solvers



- ▶ even for plain ASPs without external atoms, efficiency can be improved by decomposition

References

- ▶ Thomas Eiter, Giovambattista Ianni, Roman Schindlauer, and Hans Tompits. A Uniform Integration of Higher-Order Reasoning and External Evaluations in Answer-Set Programming. In *IJCAI-05*, pages 90–96, 2005.
- ▶ Wolfgang Faber, Nicola Leone, and Gerald Pfeifer. Semantics and complexity of recursive aggregates in answer set programming. *Artificial Intelligence*, 175(1):278–298, January 2011.
- ▶ Michael Gelfond and Vladimir Lifschitz. Classical Negation in Logic Programs and Disjunctive Databases. *Next Generation Computing*, 9(3–4):365–386, 1991.