Stream Reasoning-Related Activities at KRR Uni Potsdam

Martin Gebser Philipp Obermeier Orkunt Sabuncu Roland Kaminski Torsten Schaub



Overview

1 Sliding Window-Based Approach with ASP

2 Multi-shot ASP Solving

3 ROSoClingo



Outline

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2 Multi-shot ASP Solving

3 ROSoClingo

4 Conclusion

Approach Overview

Two Main Aspects

- Extension of (Reactive) ASP to allow for sliding-window-based reasoning: built-in support of data expiration
- Encoding technique to re-use learned conflict constraints by
 1 statically encode a task wrt. any window contents and
 2 dynamically map stream data to static encoding

References

M. Gebser, T. Grote, R. Kaminski, P. Obermeier, O. Sabuncu, T. Schaub. Stream reasoning with answer set programming: Preliminary report. *KR'12*, 2012.

M. Gebser, T. Grote, R. Kaminski, P. Obermeier, O. Sabuncu, T. Schaub. Answer set programming for stream reasoning. *ASPOCP'12*, 2012.

Consider the task of continuously matching stream prefixes against regular expression $(a|b)^*aa$.

Example Stream

aabaaab... 🎽

Observation: Only the two last readings are significant. Restrict attention to sliding window of length 2!

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Stream Data (Expiration after 2 Steps)

read(a,1). read(a,2). read(b,3). ...

Reactive ASP Encoding

```
#program cumulative t.
#external read((a;b),t).
accept(t) :- read(a,(t;t-1)).
```

% set False after 2 steps

Incremental Instantiation: t = 1

```
accept(1) :- read(a,1), read(a,0).
read(a,1).
```

Stream Data (Expiration after 2 Steps) read(a,1). read(a,2). read(b,3). ...

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Recapitulation

We have seen how an reactive ASP encoding can be expanded relative to sliding window data by successively

- 1 generating new (ground) rules
- 2 defining new (ground) atoms.
- X New propositions handicap the re-use of conflict constraints.

In what follows, we develop modeling approaches to combine online data with a static problem representation.

Idea: Encode problem wrt. any window contents and dynamically map stream data (in window) to internal representation!

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Idea: Encode problem wrt. any window contents and dynamically map stream data (in window) to internal representation!

Consider the task of checking whether the last five readings (over alphabet $\{a, b\}$) from a stream include *aaa* as a subsequence.

Example Stream

aabaaab... **)** ↓↓↓↓↓↓↓ 1234567...

Observation: Readings remain in window for five steps.

- Map stream positions to slots represented by remainders of 5?
 - Circular subsequences may lead to false positives.

Consider the task of checking whether the last five readings (over alphabet $\{a, b\}$) from a stream include *aaa* as a subsequence.

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aabaaab... **¥** ↓↓↓↓↓↓↓↓ 1234567...

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aabaaab... ✔ ↓↓↓↓↓↓↓ 1234567...

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aabaaab... ✓ ↓↓↓↓↓↓↓ 1234567...

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Map stream positions to slots represented by remainders of 5?
 Circular subsequences may lead to false positives.

Consider the task of checking whether the last five readings (over alphabet $\{a, b\}$) from a stream include *aaa* as a subsequence.

Example Stream

aabaaab... ↓↓↓↓↓↓↓↓ 1234012...

Observation: Readings remain in window for five steps.

➡ Map stream positions to slots represented by remainders of 5?
 ✓ Circular subsequences may lead to false positives.

Consider the task of checking whether the last five readings (over alphabet $\{a, b\}$) from a stream include *aaa* as a subsequence.

Example Stream

aabaaab... ↓↓↓↓↓↓↓↓ 1234012...

Observation: Readings remain in window for five steps.

→ Map stream positions to slots represented by remainders of 5?

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Consider the task of checking whether the last five readings (over alphabet $\{a, b\}$) from a stream include *aaa* as a subsequence.

Example Stream

aabaaab... ↓↓↓↓↓↓↓ 1234501...

Observation: Readings remain in window for five steps.

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Static "Free Slot" Approach

Reactive ASP Encoding

```
next(T,(T+1) \ 6) :- T = 0..5.
{ b_read(a,T) } :- next(T,_).
single(T) :- b_read(a,T).
double(T) :- b_read(a,T), single(S), next(S,T).
accept :- b_read(a,T), double(S), next(S,T).
```

Static program part is instantiated once (initially).

- Successive slots are determined via modulo-6 arithmetic.
- Internal representation of readings is generated by choice rules.
- Subsequences *aaa* are traced wrt. internal representation.
- Dynamic parts must map readings to internal representation!

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next(T, (T+1) \setminus 6) :- T = 0..5.
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{ b_read(a,T) } := next(T,_).
single(T) := b_read(a,T).
double(T) := b_read(a,T), single(S), next(S,T).
accept := b_read(a,T)_double(S)_next(S,T)
```

Ground Instantiation

next(0,1).	next(3,4).
next(1,2).	next(4,5).
next(2,3).	next(5,0).

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$read \Rightarrow b_read$

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#program cumulative(t).
#external read((a;b),t). % set False after 5 steps
:- read(a,t), not b_read(a,t \setminus 6).
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#program volatile(t).

#external volatile(t). % set True for steps t to t+5

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Observation: Dynamic parts confined to data and its mapping.

KRR@UP

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4 Conclusion

Claim ASP is an under-the-hood technology

That is, in practice, it mainly serves as a solving engine within an encompassing software environment

Single-shot solving: ground | solve
 Multi-shot solving: ground | solve

➡ continuously changing logic programs

Agents, Assisted Living, Robotics, Planning, Query-answering, etc clingo 4

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ASP

```
#program <name> [ (<parameters>) ]
    #program play(t).
#external <atom> [ : <body> ]
    #external mark(X,Y,P,t) : field(X,Y), player(P).
```

Control

Integration

in ASP: embedded scripting language (#script in Lua/Python: library import (import gringo)

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in ASP: embedded scripting language (#script) in Lua/Python: library import (import gringo)

Lua (www.lua.org)

Example prg:solve(), prg:ground(parts), ...

Python (www.python.org)

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- in Lua/Python: library import (import gringo)

Vanilla *clingo*

Emulating clingo in clingo 4

```
#script (python)
def main(prg):
    parts = []
    parts.append(("base", []))
    prg.ground(parts)
    prg.solve()
#end.
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ROSoClingo

- ROSoClingo provides a highly capable reasoning framework for ROS by integrating the reactive answer set solver clingo
- Representation methodology based on reactive ASP
 - clingo can react to incoming requests, environment changes, and new sensory information
 - Exogenous events are modelled by clingo's external directives
 - Execution failures are directly incorporated in the encoding
- Single framework declaratively controlling robots to do complex action planning while adapting to new information and environment changes
- Available at potassco.sourceforge.net

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Summary and Outlook

Stream Reasoning Approach for ASP

- Extended (Reactive) ASP by built-in support of sliding windows
- Developed modeling approaches to reason over transient data with re-use of conflict constraint

$\mathsf{Clingo} = \mathsf{Control} + \mathsf{ASP}$

Operative framework to continuously process ASP programs
 Interleaving of ASP grounding/solving with imperative control, among others, essential for stream reasoning

Summary and Outlook

Applications (Hybris project) driving our future refinements and extensions



Warehouse logistics



Robocup logistics