

The DReW System for Nonmonotonic DL-Programs

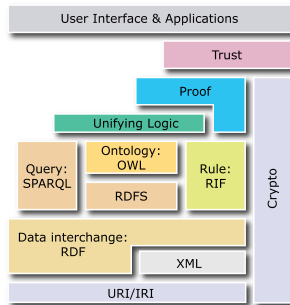
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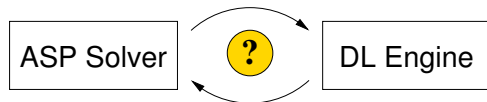
Background: Semantic Web (W3C)



- ▶ *RDF (Resource Description Framework)* is the data model
- ▶ RDFS (Schema) enriches RDF by simple taxonomies and hierarchies
- ▶ More expressive: *OWL (Web Ontology Language)* (2004; 2009)
 - ▶ strongly builds on Description Logics
- ▶ Rule languages: *Rule Interchange Format (RIF)* (2010)

dl-Programs

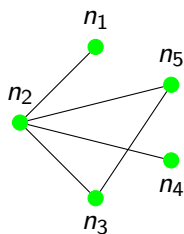
- ▶ An extension of answer set programs with *queries to DL knowledge bases (KBs)* (through *dl-atoms*)
- ▶ dl-atoms allow to query a DL knowledge base differently *bidirectional flow of information*, with clean technical separation of DL engine and ASP solver (“loose coupling”)



- ▶ Use DL-programs as “glue” for combining inferences on a DL KB.
- ▶ System Prototypes
 - ▶ NLP-DL <http://www.kr.tuwien.ac.at/research/systems/semweb1p/>
 - ▶ dlvhex <http://www.kr.tuwien.ac.at/research/systems/dlvhex/>
 - ▶ #F-Logic programs (Ontoprise, extension to F-logic programs)

DL-Programs: Network Example

$KB = (L, P)$



Ontology L

$\geq 1.wired \sqsubseteq Node \quad \top \sqsubseteq \forall wired.Node$

$wired = wired^-;$

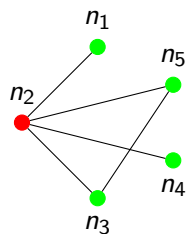
$n_1 \neq n_2 \neq n_3 \neq n_4 \neq n_5$

$wired(n_1, n_2) \quad wired(n_2, n_3) \quad wired(n_2, n_4)$

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$\geq 4.$ $wired \sqsubseteq \text{HighTrafficNode}$

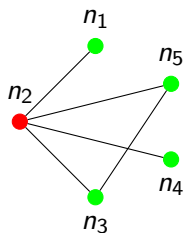
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$x_1?$



$x_2?$



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Program

P

$newnode(x_1). \quad newnode(x_2)$

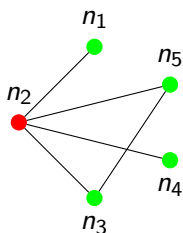
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$\geq 4. \text{wired} \sqsubseteq \text{HighTrafficNode}$

Program

$\text{newnode}(x_1). \text{newnode}(x_2)$

P

$\text{overloaded}(X) \leftarrow \text{DL}[\text{wired} \uplus \text{connect}; \text{HighTrafficNode}](X).$

- ▶ DL atom: $\text{DL}[\text{wired} \uplus \text{connect}; \text{HighTrafficNode}](X).$
- ▶ Intuition: extend DL predicate wired by connect , then query HighTrafficNode
 - ▶ E.g. Suppose $\{\text{connect}(x_1, n_3), \text{connect}(x_2, n_3)\} \subseteq I$
 - ▶ Then $I \models \text{DL}[\text{wired} \uplus \text{connect}; \text{HighTrafficNode}](n_3)$
 - ▶ Thus $I \models \text{overloaded}(n_3)$

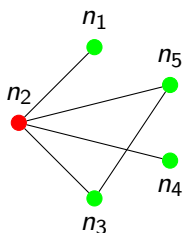
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$overloaded(X) \leftarrow DL[wired \uplus connect; HighTrafficNode](X).$

$connect(X, Y) \leftarrow newnode(X), DL[Node](Y),$

$not\ overloaded(Y), not\ excl(X, Y).$

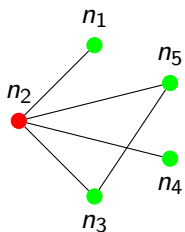
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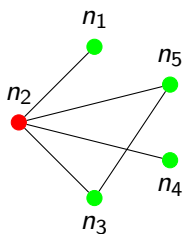
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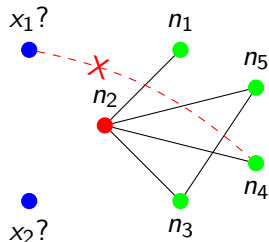
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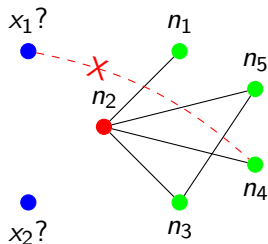
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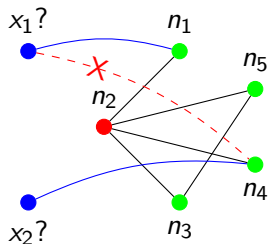
$excl(x_1, n_4).$

Semantics of DL-Programs



- ▶ Answer set semantics (Stable model semantics)
 - ▶ Extension of answer set semantics for normal logical programming
 - ▶ Multi models

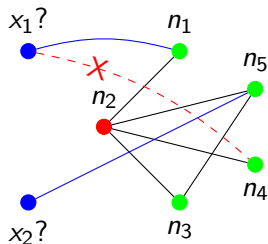
Semantics of DL-Programs



- ▶ $M_1 = \{connect(x_1, n_1), connect(x_2, n_4), \dots\},$

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Semantics of DL-Programs

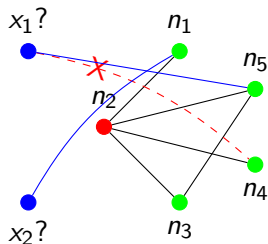


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▶ $M_1 = \{connect(x_1, n_1), connect(x_2, n_4), \dots\}$,

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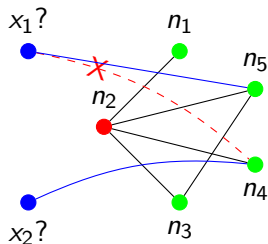
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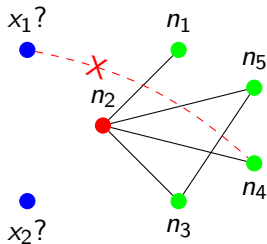
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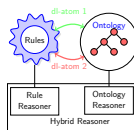
- ▶ Well-founded semantics
 - ▶ Extension of well-founded semantics for normal logical programming
 - ▶ Single model

▶ $M_0 = \{overloaded(n_2), \dots\}$

Loose Coupling - Features

► Advantage:

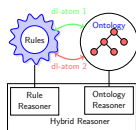
- Clean semantics, can use legacy systems
- Fairly easy to incorporate further knowledge formats (e.g. RDF)
- Privacy, information hiding



Loose Coupling - Features

▶ Advantage:

- ▶ Clean semantics, can use legacy systems
- ▶ Fairly easy to incorporate further knowledge formats (e.g. RDF)
- ▶ Privacy, information hiding



▶ Drawback: *impedance mismatch, performance*

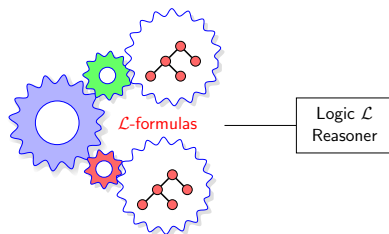
- ▶ Evaluation of DL-program needs multiple calls of a DL-reasoner
- ▶ Calls are expensive
 - ▶ optimizations (caching, pruning ...)
- ▶ In some case, exponentially many calls might be unavoidable
- ▶ Even polynomially many calls might be too costly



Uniform Evaluation



Convert the evaluation problem into one for a single reasoning engine



- ▶ This means to transform a dl-program into an (equivalent) knowledge base in *one formalism* \mathcal{L} for evaluation (*uniform evaluation*)
- ▶ In this talk, $\mathcal{L} = \text{Datalog}^-$

Reasoning with DL-Programs by Datalog[⊥] rewriting

1. Rewriting Ontology to Datalog
2. Duplicating rewritten ontologies according to the dl-inputs
3. Rewriting DL-rules to Datalog[⊥] rules
4. Rewriting DL-atoms to Datalog rules
5. Calling Datalog reasoner

DReW Reasoner

- ▶ DReW is a reasoner for DL-Programs over Datalog-rewritable Description Logics
- ▶ homepage: <http://www.kr.tuwien.ac.at/research/systems/drew/>
- ▶ open sourced: <https://github.com/ghxiao/drew>

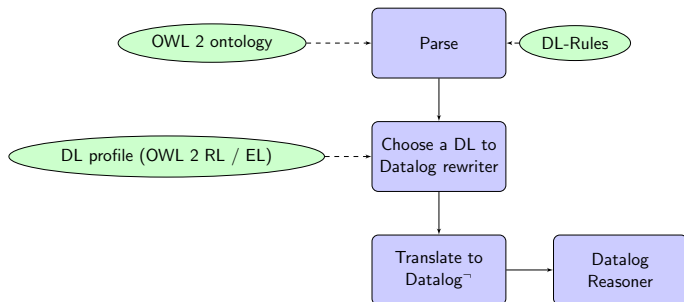


Figure : Control Flow of DReW with DL-programs

Features in DReW v0.3

- ▶ Ontology component
 - ▶ OWL 2 RL
 - ▶ OWL 2 EL
- ▶ Semantics
 - ▶ ASP semantics
 - ▶ Well-founded semantics
- ▶ Rule formalism
 - ▶ DL-Programs
 - ▶ Conjunctive Query under DL-safeness
 - ▶ Terminological default reasoning

Example Usage

Example with network DL-Programs under ASP semantics

```
$ ./drew -rl -ontology sample_data/network.owl \  
-dlp sample_data/network.dlp \  
-filter connect -dlv $HOME/bin/dlv
```

```
{ connect(x1, n1) connect(x2, n5) }
```

```
{ connect(x1, n5) connect(x2, n1) }
```

```
{ connect(x1, n5) connect(x2, n4) }
```

```
{ connect(x1, n1) connect(x2, n4) }
```


Example Usage

Example with network dl-Programs under well-founded semantics

```
$ ./drew -rl -ontology sample_data/network.owl \  
-dlp sample_data/network.dlp \  
-filter overloaded -wf -dlv ./dlv-wf
```

```
{ overloaded(n2) }
```

Summary and Outlook

▶ Summary

- ▶ DL-programs is a strong formalism for combining Ontology and Rules
- ▶ Traditional engine for dl-Programs suffers from the overhead of calling external DL Reasoner
- ▶ By exploiting Datalog-rewritability, reasoning over dl-programs can be reduced to Datalog⁻
- ▶ Try DReW Reasoner!

▶ Outlook

- ▶ More evaluation
- ▶ More expressive DL component, e.g. Horn-SHIQ
- ▶ More reasoning paradigm support, e.g. Closed World Assumption