Don't Repeat Yourself: Termination of the Skolem Chase on Disjunctive Existential Rules

LUKAS GERLACH

Knowledge-Based Systems Group Technische Universität Dresden, Germany

08.10.2020

MOTIVATION

■ Reasoning over *Knowledge Bases*

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- Expressivity of Disjunctive Existential Rules

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- Reasoning over *Knowledge Bases*
- Expressivity of Disjunctive Existential Rules
- Efficiency of the Skolem Chase (ASP Solvers)

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A (disjunctive existental) rule ho is an expression of the form

$$\forall \vec{x} \forall \vec{y}. [B_{\rho}(\vec{x}, \vec{y}) \rightarrow \bigvee\nolimits_{i=1}^{n} \exists \vec{z}_{i}. H_{\rho}^{i}(\vec{x}_{i}, \vec{z}_{i})]$$

where B_{ρ} and H_{ρ}^{i} are conjunctions of atoms without function symbols or constants; \vec{x}, \vec{y} , and \vec{z}_{i} are pairwise disjoint lists of variables; and $\bigcup_{i=1}^{n} \vec{x}_{i} = \vec{x}$.

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\begin{split} & I := \{ \ Pizza(myPizza) \ \} \\ & R := \{ \ Pizza(x) \rightarrow InFridge(x) \lor \exists z. (Service(z) \land Delivers(z,x)) \ \} \\ & \sigma := \exists z. (Service(z) \land Delivers(z,myPizza)) \end{split}
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\sigma := \exists z. (Service(z) \land Delivers(z, myPizza))
Is \sigma entailed by \langle R, I \rangle?
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How to solve this in general?

Definition

A BCQ $\sigma:=\exists \vec{z}.\varphi(\vec{z})$ is entailed by a knowledge base $\mathcal K$ if, for each first order model M of $\mathcal K$, there exists a substitution θ such that $\varphi\theta\subseteq M$.

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- 2. Individual models may be infinite in size.

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Proposition

BCQ entailment is undecidable [Beeri and Vardi, 1981].

Definition

A universal model set [Bourhis et al., 2016] of a knowledge base $\mathcal K$ is a set of models $\mathcal U$, such that for each model $\mathcal M$ for $\mathcal K$ there exists a homomorphism from some model in $\mathcal U$ to $\mathcal M$.

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- 3. By (1) and (2): $\tau \circ \theta$ is a substitution with $\varphi(\tau \circ \theta) \subseteq M$.

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- 3. By (1) and (2): $\tau \circ \theta$ is a substitution with $\varphi(\tau \circ \theta) \subseteq M$.
- 4. By (3): σ is entailed by \mathcal{K} .

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We study an algorithm that should compute a finite universal model set containing only finite models.

General Chase Procedure

- lacksquare Input: Knowledge Base ${\mathcal K}$
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If λ is applicable to F, then the *application* of λ on F is defined as the set of fact sets:

$$\lambda(F) := \{ F \cup \mathsf{sk}(\mathsf{H}^i_\rho)\theta \mid 1 \le i \le \mathsf{branch}(\rho) \}$$

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Those applications can be implemented using ASP-solvers.

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Consider the following instance and rule set:

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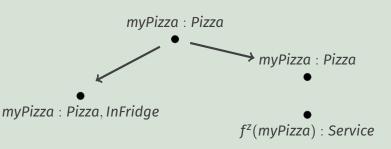
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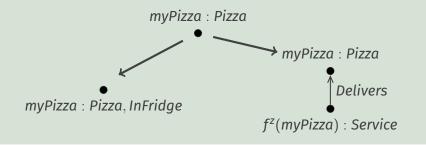


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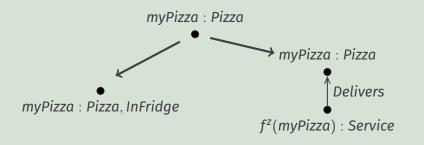
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The BCQ $\exists z.(Service(z) \land Delivers(z, myPizza))$ is **not** entailed.

CHASING A UNIVERSAL MODEL SET

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Problem: Knowledge base termination and rule set termination are undecidable [Beeri and Vardi, 1981, Deutsch et al., 2008, Gogacz and Marcinkowski, 2014].

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The following rule set is **not** terminating.

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Why not use RMFA?

RMFA is **not sound** for the disjunctive skolem chase. (We can still use some ideas.)

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Theorem '

A rule set R without disjunctions is terminating if and only if $\langle R, I_R^* \rangle$ is terminating [Marnette, 2009].

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Consider the rule set R and its critical instance I_R^* :

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\begin{split} R &= \{ \ \text{Pizza}(x) \rightarrow \text{Last}(x) \lor (\text{NextOrder}(x, f^z(x)) \land \text{Pizza}(f^z(x))) \ \} \\ I_R^\star &= \{ \ \text{Pizza}(\star), \text{Last}(\star), \text{NextOrder}(\star, \star) \ \} \end{split}
```

The knowledge base $\langle R, I_R^* \rangle$ is terminating but R is not.

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Example

The following rule set is terminating but it does not terminate if we replace the disjunction by a conjunction:

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5 | 2

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In the context of a rule set: If a trigger λ is blocked, then λ is not applicable to any fact set occurring in the chase on any instance.

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Consider the following rule set:

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To derive $f^{z}(\star)$, $\langle \rho_{1}, \{x \mapsto \star \} \rangle$ was applied before.

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GENERALISE OBSOLETENESS

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For a rule set R, we define DMFA(R) to be the smallest fact set such that $I_R^\star \subseteq \mathsf{DMFA}(R)$ and, for every trigger $\langle \rho, \theta \rangle$ with $\rho \in R$ that is active w.r.t. DMFA(R) and not blocked, we have $sk(H_\rho^i)\theta \subseteq \mathsf{DMFA}(R)$ for all $1 \le i \le branch(\rho)$.

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- 2. By (1): The chase sequence of $\langle R, I \rangle$ contains a cyclic term t.
- 3. By (2): The cyclic term $\sigma(t)$ is in DMFA(R) (via induction over the chase sequence).

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We show that R is not DMFA if R is not terminating. Let σ be a mapping over constants with $\sigma(c) := \star$ for all constants c.

- 1. There exists an instance I such that $\langle R, I \rangle$ is not terminating.
- 2. By (1): The chase sequence of $\langle R, I \rangle$ contains a cyclic term t.
- 3. By (2): The cyclic term $\sigma(t)$ is in DMFA(R) (via induction over the chase sequence).
- 4. By (3): R is not DMFA.

Example

R:

$$Pizza(x) \rightarrow Last(x) \lor (NextOrder(x, f^{z}(x)) \land Pizza(f^{z}(x)))$$

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DMFA(R):

NextOrder



*: Pizza, Last

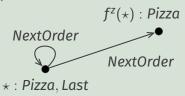
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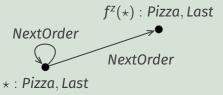
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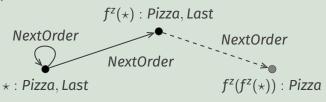
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DMFA(R):





Disjunctive Existential Rule Sets

Terminating w.r.t. restricted chase

22

Disjunctive Existential Rule Sets

Terminating w.r.t. restricted chase

Terminating w.r.t. disjunctive skolem chase

22

Disjunctive Existential Rule Sets			
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	MFA		

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		MFA	

Example

The following singleton rule set is contained in the blank space:

$$P(y,x) \wedge Q(y) \rightarrow \exists z. (P(x,z) \wedge P(z,x))$$

22

Theorem

Checking if a rule set R is DMFA is 2EXPTIME-complete.

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(Membership): We compute DMFA(R) step by step.

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Therefore, there are at most doubly exponentially many steps of which each is computable in 2ExpTIME.

(Hardness): Reduction from MFA (MFA and DMFA coincide for rule sets without disjunctions)

[Cuenca Grau et al., 2013, Calì et al., 2010].

Theorem

Let R be a rule set that is DMFA and let $\mathcal K$ be a knowledge base featuring R. BCQ entailment for $\mathcal K$ is coN2ExpTime-complete.

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Proof. (Sketch)

(Membership): We consider BCQ non-entailment.

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(Hardness): Reduction from the word problem of N2EXPTIME-bounded turing machines similar to the proof for RMFA [Carral et al., 2017, Calì et al., 2010].

RESULTS

■ DMFA is a novel acyclicity notions tailored towards the disjunctive skolem chase.

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- DMFA is in between MFA and RMFA (as expected).
- Checking DMFA is 2EXPTIME-complete and checking BCQ entailment for a rule set that is DMFA is coN2ExpTime-complete.

In theory:

1. Develop a cyclicity notion for the disjunctive skolem chase.

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- 2. Refine notions to capture as many rule sets as possible.

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In practice:

1. Evaluate DMFA on real world knowledge bases.

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- 1. Develop a cyclicity notion for the disjunctive skolem chase.
- 2. Refine notions to capture as many rule sets as possible.

In practice:

- 1. Evaluate DMFA on real world knowledge bases.
- 2. Use an ASP based implementation of the disjunctive skolem chase for reasoning with description logics.

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The sources of the presentation can be found on Gitlab: https://gitlab.com/monstR/defence-grosser-beleg

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