

ACYCLICITY CONDITIONS AND THEIR APPLICATION TO QUERY ANSWERING IN DESCRIPTION LOGICS

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OUTLINE

1 MOTIVATION

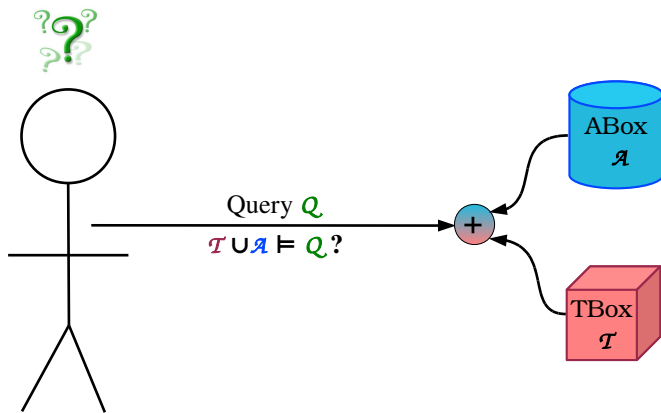
2 MFA AND MSA

3 QUERYING ACYCLIC DL ONTOLOGIES

4 EXPERIMENTAL RESULTS

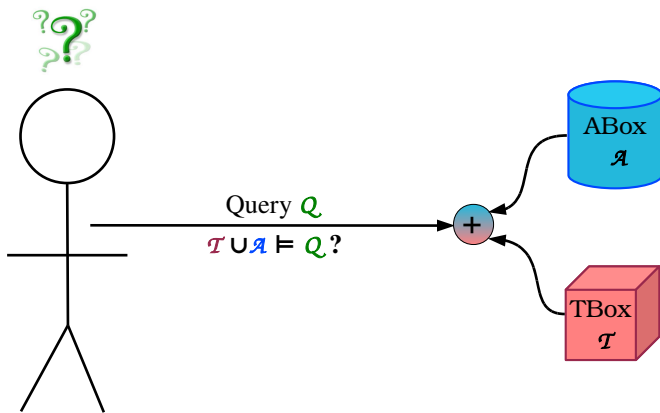
ONTOLOGICAL QUERY ANSWERING

- Key reasoning task for DL and rule-based applications



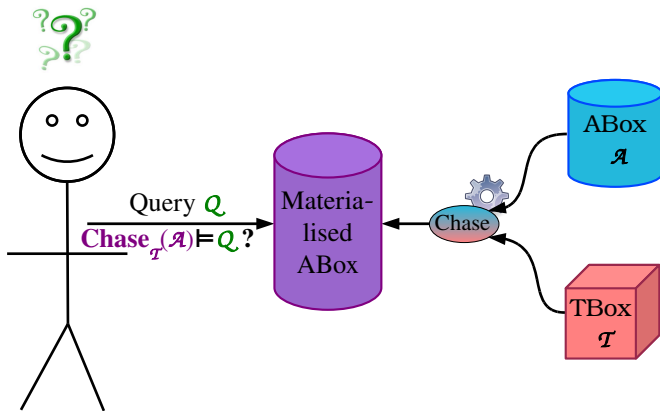
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- **Materialisation-based** paradigm: **chase** ABox using TBox and evaluate Q in the computed ABox



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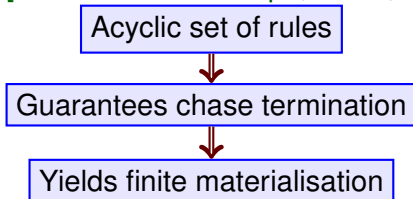
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Guarantees chase termination

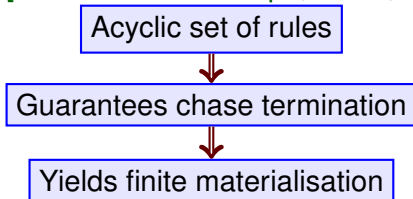
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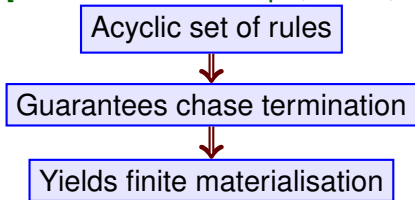


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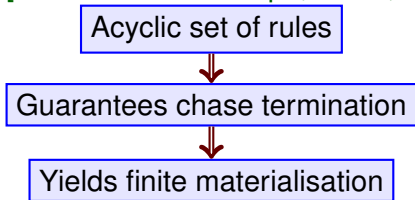


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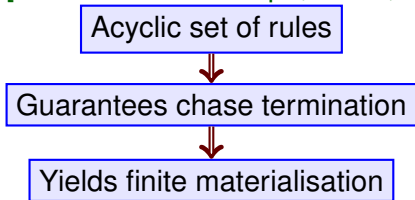
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- I Only sets of rules with models of **bounded size**
- II Acyclicity conditions might be **too restrictive**

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- Suggestion: materialise ABoxes **only** over **acyclic** TBoxes
 - Always complete ✓
 - Provably terminating ✓

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Materialisation-based reasoning beyond OWL 2 RL
might be practically feasible

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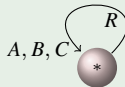
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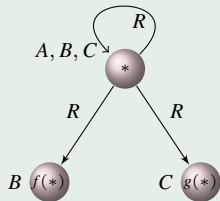
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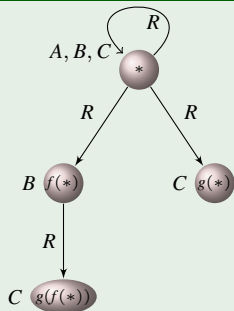
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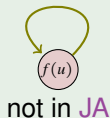
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$$\text{Pos}_B(u) = \{A|_1\} \subseteq \text{Move}(f(u)) = \{R|_2, B|_1, R|_1, A|_1\}$$

■ Joint acyclicity

- 1 Tracks **value generation** and **propagation** to detect cyclic creation of terms
- 2 Polynomial time to check

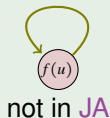
EXISTING ACYCLICITY CONDITIONS

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■ May **overestimate** rule applicability

MODEL-FAITHFUL ACYCLICITY

- Track rule applications more 'faithfully'

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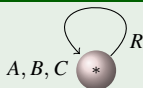
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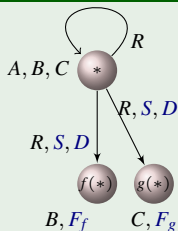
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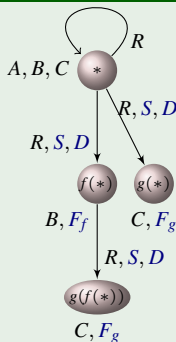
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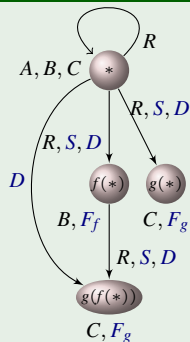
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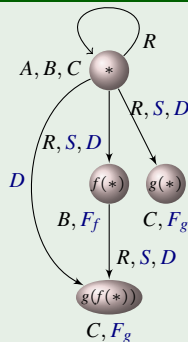
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COST OF CHECKING MFA

■ Testing model-faithful acyclicity for a set of rules Σ

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- 2 Rules of the form $\varphi(\vec{x}, \vec{z}) \rightarrow \exists \vec{y}. \psi(\vec{x}, \vec{y})$ with **predicates of bounded arity**
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- 4 Rules from **Horn-SHIQ**
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- Isn't computational complexity too high?

MODEL-SUMMARISING ACYCLICITY

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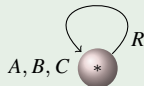
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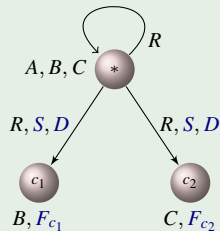
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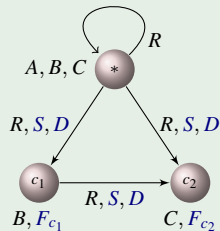
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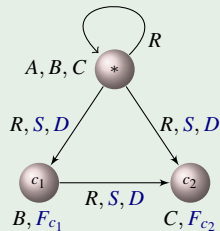
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- Horn-SHIQ TBoxes can be checked in PTIME for MSA before *potential* materialisation-based query answering

ACYCLICITY CONDITIONS (PARTIAL) TAXONOMY

JA	$\subsetneq$	SWA	MSA	MFA
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ACYCLICITY CONDITIONS (PARTIAL) TAXONOMY

- Our contributions:

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ACYCLICITY CONDITIONS (PARTIAL) TAXONOMY

- Our contributions:

- 1 MSA strictly subsumes SWA

JA $\subsetneq$ SWA $\subsetneq$ MSA MFA

ACYCLICITY CONDITIONS (PARTIAL) TAXONOMY

■ Our contributions:

1 MSA strictly subsumes SWA

2 MFA strictly subsumes MSA

$$\text{JA} \subsetneq \text{SWA} \subsetneq \text{MSA} \subsetneq \text{MFA}$$

EXAMPLE

$$A(x) \rightarrow \exists y.R(x, y) \wedge B(y)$$

$$B(x) \rightarrow \exists y.S(x, y) \wedge T(y, x)$$

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MFA but not MSA

ACYCLICITY CONDITIONS (PARTIAL) TAXONOMY

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- 2 MFA strictly subsumes MSA

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$$B(x) \rightarrow \exists y.S(x, y) \wedge T(y, x)$$

$$A(z) \wedge S(z, x) \rightarrow C(x)$$

$$C(z) \wedge T(z, x) \rightarrow A(x)$$

MFA but not MSA

- MSA and MFA coincide in experimental evaluation of DL ontologies

OUTLINE

1 MOTIVATION

2 MFA AND MSA

3 QUERYING ACYCLIC DL ONTOLOGIES

4 EXPERIMENTAL RESULTS

TRANSLATING DLS INTO RULES

- Axioms of normalised Horn-*SRIQ* ontologies can be converted to (existential) rules

$A \sqsubseteq \exists R.B$	$A(x) \rightarrow \exists y. R(x, y) \wedge B(y)$
$A \sqsubseteq \leq 1 R.B$	$A(z) \wedge R(z, x_1) \wedge B(x_1) \wedge R(z, x_2)$
	$\wedge B(x_2) \rightarrow x_1 \approx x_2$
$A \sqcap B \sqsubseteq C$	$A(x) \wedge B(x) \rightarrow C(x)$
$A \sqsubseteq \forall R.B$	$A(z) \wedge R(z, x) \rightarrow B(x)$
$R \sqsubseteq S$	$R(x_1, x_2) \rightarrow S(x_1, x_2)$
$R \circ S \sqsubseteq T$	$R(x_1, z) \wedge S(z, x_2) \rightarrow T(x_1, x_2)$

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- Equality is handled with a modification of the singularisation [Marnette, PODS, 2009] technique

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2 Horn-***SRI*** TBox $\mathcal{T}$ and ABox $\mathcal{A}$

$\mathcal{T}$ is **weakly acyclic**

F set of facts

$\rightsquigarrow$ Deciding $\mathcal{T} \cup \mathcal{A} \models F$ is **EXPTIME**-hard

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Existential rules	Total	MSA	JA	WA
< 100	70	64	64	64
100–1K	33	30	30	23
1K–5K	20	14	14	12
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- **7 large and expressive** OBO ontologies **MSA** but not **JA**
(only two of them were $\mathcal{ELH}^r$ and DL-Lite)

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Depth = length of function symbol nesting

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	Horn- <i>SHIQ</i>	bounded arity	no restriction
MSA	PTime-complete	coNP-complete	ExpTime-complete
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3 DL query answering under **acyclicity** conditions

- Horn-*SRI* $\mathcal{T}$ in **WA**: $\mathcal{T} \cup \mathcal{A} \models F$ is ExpTime-hard
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4 Experimental evaluation on DL ontologies

- 83% ontologies found **acyclic** (78% **JA**)
- materialised ABoxes **not too large** $\leadsto \times 5$ bigger on average for ontologies with depth < 5 (= most ontologies)

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Thank you! Questions?!?