

Finding \mathcal{EL}^+ Justifications using the Earley Parsing Algorithm

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Outline

- 1 Description Logics
 - A Brief Introduction
 - Reasoning Tasks
 - The \mathcal{EL} Family of DLs
 - Reasoning Complexity
- 2 Module Extraction
 - Reachability Modules
 - Backward Reachability Modules
 - Bi-Directional Reachability Modules
- 3 The Earley Parsing Algorithm for Extracting Modules
 - Context Free Grammars
 - Earley Parsing Algorithm
- 4 Conclusion and Future Work

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Description Logics

An overview

- A class of knowledge representation languages
- Frequently used to represent ontologies formally
- Decidable fragments of first-order logic
- Makes it possible to **reason** over ontologies

Description Logics

An overview

- Concepts: classes of individuals
- Roles: (binary) relationships between individuals
- Define a terminology: TBox
- Provide assertions: ABox
- We are only considered with Tboxes

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Reasoning Tasks

Classical Reasoning Tasks

- Determining the subsumption hierarchy between concepts (Tbox)
- Instance checking (Abox)
- Consistency checking (Tbox)
- Concept equivalence (Tbox)

Non-Classical Reasoning Tasks

- Ontology repair (Tbox)
- Computing justifications (Tbox)
- Module extraction (Tbox)

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The description logic \mathcal{EL}^+

Concepts and Roles

- Concept names: Person, Mother, Female
- Special concepts: \top , \perp
- Roles: hasChild
- Concept construction: $\text{Person} \sqcap \text{Female}$, $\exists \text{hasChild.Female}$

Tbox (and Rbox) statements

- Subsumption statements: $\text{Mother} \sqsubseteq \text{Female} \sqcap \exists \text{hasChild.}\top$
- Role inclusion: $\text{hasFather} \sqsubseteq \text{hasAncestor}$

Abox statements

- $\text{Mother}(\text{Susan})$
- $\text{hasChild}(\text{Susan}, \text{Samantha})$

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Classical Reasoning Tasks

Subsumption checking

- Is Female subsumed by Person?

Instance checking

- Is Susan a Female?

Consistency checking

- Is Female subsumed by \perp ?

Equivalence checking

- Is Female subsumed by Person **and** Person subsumed by Female?

Non-Classical Reasoning Tasks

- Let \mathcal{O} be a set of Tbox (and Rbox) statements

Justification (MinA)

- Let $A \sqsubseteq B$ be a statement that follows **logically** from \mathcal{O}
- Justification: A minimal subset of \mathcal{O} from which $A \sqsubseteq B$ follows

Module extraction

- Given a statement $A \sqsubseteq B$
- Module: a subset \mathcal{O}' of \mathcal{O} such that
 $A \sqsubseteq B$ follows from \mathcal{O}' iff
 $A \sqsubseteq B$ follows from \mathcal{O}

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Complexity for Description Logics

Classical Reasoning

- Classical reasoning for DLs in general is hard (intractable in general)
- Reasoning for the \mathcal{EL} family is much better
- Computing the subsumption hierarchy can be done in polynomial time
- The \mathcal{EL} family is surprisingly useful

Non-classical Reasoning

- Non-classical reasoning is based on classical reasoning
- Finding justifications involve consistency checking
- So is module extraction
- In general non-classical reasoning tasks are hard (intractable)
 - ▶ Even for DLs for which classical reasoning is tractable
- A solution is to use heuristics

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Reachability Modules

Subsumption Module for A : \mathcal{O}'

- \mathcal{O}' is a subset of \mathcal{O}
- $A \sqsubseteq B$ follows from \mathcal{O}' iff $A \sqsubseteq B$ follows from \mathcal{O} for every B in \mathcal{O}

Strong Subsumption Module for A : \mathcal{O}'

- Subsumption module for A
- If $A \sqsubseteq B$ follows from \mathcal{O} then all MinAs for $A \sqsubseteq B$ are contained in \mathcal{O}'

Definition of A -reachability

- A is A -reachable
- For all axioms $\alpha_L \sqsubseteq \alpha_R$, if x is A -reachable for every x in α_L then y is A -reachable for every y in α_R

A -reachability

- $\alpha_L \sqsubseteq \alpha_R$ is A -reachable if all x s in α_L are A -reachable
- $\mathcal{O}^{A \rightarrow}$: set of A -reachable axioms
- $\mathcal{O}^{A \rightarrow}$ is a strong subsumption module for A

Example

1. $A \sqsubseteq \exists r.D$ 2. $\exists r.D \sqsubseteq B$ 3. $E \sqsubseteq B$ 4. $A \sqsubseteq F$

$\mathcal{O}^{A \rightarrow}$: 1, 2, 4

Observe: Axiom 4 is irrelevant

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Backward Reachability modules

Backward Subsumption module for B : \mathcal{O}'

- \mathcal{O}' is a subset of \mathcal{O}
- $A \sqsubseteq B$ follows from \mathcal{O}' iff $A \sqsubseteq B$ follows from \mathcal{O} for every A in \mathcal{O}

Strong Backward Subsumption Module for B : \mathcal{O}'

- Backward subsumption module for B
- If $A \sqsubseteq B$ follows from \mathcal{O} then all MinAs for $A \sqsubseteq B$ are contained in \mathcal{O}'

Definition of backward B -reachability

- B is backward B -reachable
- For all axioms $\alpha_L \sqsubseteq \alpha_R$, if y is backward B -reachable for some y in α_R , or if $\alpha_R = \perp$, then x is backward B -reachable for every x in α_L

Backward B -reachability

- $\alpha_L \sqsubseteq \alpha_R$ is backward B -reachable if some y in α_R is backward B -reachable, or if $\alpha_R = \perp$,
- $\mathcal{O}^{\rightarrow B}$: set of backward B -reachable axioms
- $\mathcal{O}^{\rightarrow B}$ is a strong backward subsumption module for B

Example

1. $A \sqsubseteq \exists r.D$ 2. $\exists r.D \sqsubseteq B$ 3. $E \sqsubseteq B$ 4. $A \sqsubseteq F$

$\mathcal{O}^{\rightarrow B}$: 1, 2, 3

Observe: Axiom 3 is irrelevant

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Definition of a bi-directional reachability-based module: $\mathcal{O}^{A \rightarrow B}$

All axioms $\alpha_L \sqsubseteq \alpha_R \in \mathcal{O}$ such that

for every x in α_L , x is A -reachable and,

for some y in α_R , y is backward B -reachable

Example

1. $A \sqsubseteq \exists r.D$ 2. $\exists r.D \sqsubseteq B$ 3. $E \sqsubseteq B$ 4. $A \sqsubseteq F$

$\mathcal{O}^{A \rightarrow B}$: 1, 2

Observe: Axioms 3 and 4 don't feature anymore

Result

If $A \sqsubseteq B$ follows from \mathcal{O} then $\mathcal{O}^{A \rightarrow B}$ contains all MinAs for $A \sqsubseteq B$

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Context Free Grammars

- Well-known method for modeling the structure of languages
- Set of productions
 - ▶ Expresses the ways the symbols in a language can be grouped together
 - ▶ Lexicon of symbols

Example

$S \rightarrow VP$

$S \rightarrow NP VP$

$VP \rightarrow VP NP$

$NP \rightarrow Det Noun$

$VP \rightarrow Verb$

$Det \rightarrow that$

$Verb \rightarrow book$

$Noun \rightarrow flight$

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Earley Parsing Algorithm

- Dynamic programming approach
- A single left-to-right, top-down, depth-first parallel search strategy to compute all possible parses
- Does this in polynomial worst case time (n^3)

Converting \mathcal{EL}^+ to Earley

- An \mathcal{EL}^+ ontology can be converted to a Context Free Grammar
- The Earley Algorithm is used to compute all reachability paths
- Used to compute bi-directional subsumption modules

Conclusion

- Extended the notion of reachability
 - ▶ Backward reachability
 - ▶ Bi-directional reachability
- Conversion of \mathcal{EL}^+ statements to a Context Free Grammar
- Use the Earley parsing algorithm to compute bi-directional subsumption modules

Future Work

- Seems promising in principle: will it be worthwhile in practice?
- Efficient implementation
- Protégé plugin
- Investigate the link with automata-based pinpointing approach (Penãloza)