

Complexity of Decision Problems in Computational Logic

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Is the equivalence of two algorithms decidable?

- In the general case, **no** :
 - Undecidability of the Halting Theorem.
- In some particular cases, **yes** :
 - $f : n \rightarrow 0$
 - $f : n \rightarrow 1$

How can we evaluate the computational complexity of a problem?

- Look for lower bounds :
 - Evaluate the computational complexity of the problem for particular instances.
- Look for upper bounds :
 - Find an algorithm solving the problem and evaluate its complexity.

What is a Datalog program ?

- A set of Horn rules without function symbols.
- A **goal** predicate.

Example of Datalog program

Program Π :

- $Z(X) \Rightarrow E(X)$
- $E(X) \wedge S(X, Y) \Rightarrow O(Y)$
- $O(X) \wedge S(X, Y) \Rightarrow E(Y)$
- $O(X) \Rightarrow \overline{O}(X)$
- Goal predicate : \overline{O} .

Datalog programs work on deductive databases

- $D = (\{0, 1, 2, 3\}, \{\mathbf{Z}(0), \mathbf{S}(0, 1), \mathbf{S}(1, 2), \mathbf{S}(2, 3)\})$
- $\Pi(D) = (\{0, 1, 2, 3\}, \{\mathbf{Z}(0), \mathbf{S}(0, 1), \mathbf{S}(1, 2), \mathbf{S}(2, 3)\})$

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- Solutions of $\overline{\mathbf{O}}(X) : \{(1), (3)\}$.

How can we prove that $\Pi(D)$ contains a given atom?

By exhibiting proofs for this atom.

Proof that $\overline{O}(3)$ is contained in $\Pi(D)$

$$\overline{O}(3), O(3) \Rightarrow \overline{O}(3)$$



$$O(3), E(2) \wedge S(2, 3) \Rightarrow O(3)$$



$$E(2), O(1) \wedge S(1, 2) \Rightarrow E(2)$$



$$O(1), E(0) \wedge S(0, 1) \Rightarrow O(1)$$



$$E(0), Z(0) \Rightarrow E(0)$$

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$$O(3), E(X) \wedge S(X, 3) \Rightarrow O(3)$$



$$E(X), O(Y) \wedge S(Y, X) \Rightarrow E(X)$$



$$O(Y), E(W) \wedge S(W, Y) \Rightarrow O(Y)$$



$$E(W), Z(W) \Rightarrow E(W)$$

Problem

We may use an unbounded number of variables.

- The proof of $\overline{O}(2n + 1)$ involves $2n + 1$ variables.

Solution

We may re-use **forgotten** variables.

Proof that $\overline{O}(3)$ is contained in $\Pi(D)$

$$\overline{O}(3), O(3) \Rightarrow \overline{O}(3)$$

$$\downarrow$$

$$O(3), E(2) \wedge S(2, 3) \Rightarrow O(3)$$

$$\downarrow$$

$$E(2), O(1) \wedge S(1, 2) \Rightarrow E(2)$$

$$\downarrow$$

$$O(1), E(0) \wedge S(0, 1) \Rightarrow O(1)$$

$$\downarrow$$

$$E(0), Z(0) \Rightarrow E(0)$$

Proof that $\overline{O}(3)$ is contained in $\Pi(D)$

$$\overline{O}(3), O(3) \Rightarrow \overline{O}(3)$$

↓

$$O(3), E(X) \wedge S(X, 3) \Rightarrow O(3)$$

↓

$$E(X), O(Y) \wedge S(Y, X) \Rightarrow E(X)$$

↓

$$O(Y), E(W) \wedge S(W, Y) \Rightarrow O(Y)$$

↓

$$E(W), Z(W) \Rightarrow E(W)$$

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When are two Datalog programs A and B equivalent?

- When A is contained in B :
 - When all the solutions of $\alpha(\mathbf{v})$ in $A(D)$ are solutions of $\beta(\mathbf{v})$ in $B(D)$, for every finite database D .
- When B is contained in A .

How can we check that A is contained in B ?

- For every proof of an atom $\alpha(\mathbf{v})$, we must find a proof of $\beta(\mathbf{v})$.
- We must find **containment mappings**.

Containment : Example

Program A

- $Z(X) \Rightarrow E(X)$
- $E(X) \wedge S(X, Y) \Rightarrow O(Y)$
- $O(X) \wedge S(X, Y) \Rightarrow E(Y)$
- $O(X) \Rightarrow \bar{O}(X)$
- Goal predicate : \bar{O} .

Program B

- $Z(X) \Rightarrow I(X)$
- $I(X) \wedge S(X, Y) \Rightarrow I(Y)$
- $I(X) \Rightarrow \bar{I}(X)$
- Goal predicate : \bar{I} .

Containment relations

- A is contained in B.
- B is not contained in A.

Unfolding tree of A

$$\overline{O}(X), O(X) \Rightarrow \overline{O}(X)$$



$$O(X), E(Y) \wedge S(Y, X) \Rightarrow O(X)$$



$$E(Y), O(V) \wedge S(V, Y) \Rightarrow E(Y)$$



$$O(V), E(W) \wedge S(W, V) \Rightarrow O(V)$$



$$E(W), Z(W) \Rightarrow E(W)$$

Unfolding tree of B

$$\bar{I}(\bar{X}), I(\bar{X}) \Rightarrow \bar{I}(\bar{X})$$



$$I(\bar{X}), I(\bar{Y}) \wedge S(\bar{Y}, \bar{X}) \Rightarrow I(\bar{X})$$



$$I(\bar{Y}), I(\bar{V}) \wedge S(\bar{V}, \bar{Y}) \Rightarrow I(\bar{Y})$$



$$I(\bar{V}), I(\bar{W}) \wedge S(\bar{W}, \bar{V}) \Rightarrow I(\bar{V})$$



$$I(\bar{W}), Z(\bar{W}) \Rightarrow I(\bar{W})$$

How can we work on trees ?

- Words are recognized by **word** automata.
- Trees are recognized by **tree** automata.

Different tree automata

- Top-down deterministic finite automata
- **Top-down non-deterministic finite automata**
- Bottom-up deterministic finite automata
- Bottom-up non-deterministic finite automata
- Two-way alternating finite automata

$$\text{TDDFA} \subsetneq \text{TDNDFA} = \text{BUDFA} = \text{BDNDFA} = \text{TWAFDA}$$

What is a monadic program ?

A program in which each internal IDB predicate is of arity 1.

Example of monadic program

Program B

- $Z(X) \Rightarrow I(X)$
- $I(X) \wedge S(X, Y) \Rightarrow I(Y)$
- $I(X) \Rightarrow \bar{I}(X)$
- Goal predicate : \bar{I}

Decoration of a tree of A

- Identify the internal IDB predicates of B .
- Assume that some internal IDB predicates hold on some variables of the tree.
- Store the information
 - **globally** in unfolding trees.
 - **locally** in proof trees.

Example of decorated unfolding tree

- $\overline{O}(X), O(X) \Rightarrow \overline{O}(X)$
 \downarrow
 $O(X), E(Y) \wedge S(Y, X) \Rightarrow O(X)$
 \downarrow
 $E(Y), O(V) \wedge S(V, Y) \Rightarrow E(Y)$
 \downarrow
 $O(V), E(W) \wedge S(W, V) \Rightarrow O(V)$
 \downarrow
 $E(W), Z(W) \Rightarrow E(W)$

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$$O(V), E(W) \wedge S(W, V) \Rightarrow O(V)$$



$$E(W), Z(W) \Rightarrow E(W)$$

- IDB predicates : I .
- Assumed relations : $I(X), I(Y), I(V), I(W)$.

Example of decorated proof tree

$$\overline{O}(X), O(X) \Rightarrow \overline{O}(X)$$

↓

$$O(X), E(Y) \wedge S(Y, X) \Rightarrow O(X)$$

↓

$$E(Y), O(X) \wedge S(X, Y) \Rightarrow E(Y)$$

↓

$$O(X), E(Y) \wedge S(Y, X) \Rightarrow O(X)$$

↓

$$E(Y), Z(Y) \Rightarrow E(Y)$$

Example of decorated proof tree

$\overline{O}(X), O(X) \Rightarrow \overline{O}(X)$	$-I \quad -I(X)$
\downarrow	
$O(X), E(Y) \wedge S(Y, X) \Rightarrow O(X)$	$-I \quad -I(X), I(Y)$
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$E(Y), O(X) \wedge S(X, Y) \Rightarrow E(Y)$	$-I \quad -I(X), I(Y)$
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$O(X), E(Y) \wedge S(Y, X) \Rightarrow O(X)$	$-I \quad -I(X), I(Y)$
\downarrow	
$E(Y), Z(Y) \Rightarrow E(Y)$	$-I \quad -I(Y)$

What is a fix-point tree ?

- Nothing more is implied by the assumptions.
- There exists a **least** fix-point.

Why are these trees important ?

Equivalence between :

- A proof of $P(X)$.
- The presence of $P(X)$ in the least fix-point.
- The presence of $P(X)$ in **every** fix-point.

How can we recognize fix-point proof trees ?

With automata :

- We search an infix-point certificate.
- The research fails when the tree is fix-point.

How can we conclude over the containment ?

With automata :

- We search a reaching-goal certificate.
- The research succeeds when a containment mapping exists.

What is a certificate ?

A mapping of variables :

- From the variables of a rule.
- To the variables of a tree.
- That stabilizes the body predicates.
- That does not stabilize the head predicate.

How do we search certificates ?

With top-down non-deterministic automata :

- We identify mapped variables in the current node.
- Unidentified variables are in one child sub-tree.
- We look for stabilized body predicates in the current node.
- We check if the head predicate of the rule was stabilized.

Research of an infix-point certificate : Example

- IDB predicates : **E, O**.
- Rule : $\mathbf{E}(\bar{X}) \wedge \mathbf{T}(\bar{Y}, \bar{Z}) \wedge \mathbf{T}(\bar{X}, \bar{Y}) \Rightarrow \mathbf{O}(\bar{Y})$.
- Current sub-tree :

$$\mathbf{G}(Y), \mathbf{U}(Y) \wedge \mathbf{H}(Y) \Rightarrow \mathbf{G}(Y) \text{ — } \mathbf{E}, \mathbf{O} \text{ — } \mathbf{E}(Y)$$



$$\begin{array}{l} \mathbf{U}(Y), \\ \mathbf{T}(Y, Z) \wedge \mathbf{T}(Z, W) \Rightarrow \mathbf{U}(Y) \\ \mathbf{E}, \mathbf{O} \text{ — } \mathbf{E}(Y) \end{array}$$



$$\begin{array}{l} \mathbf{H}(Y), \\ \mathbf{T}(X, Y) \Rightarrow \mathbf{H}(Y) \\ \mathbf{E}, \mathbf{O} \text{ — } \mathbf{E}(Y), \mathbf{E}(X) \end{array}$$

Research of an infix-point certificate : Example

- IDB predicates : **E**, **O**.
- Rule : $\mathbf{E}(\bar{X}) \wedge \mathbf{T}(\bar{Y}, \bar{Z}) \wedge \mathbf{T}(\bar{X}, \bar{Y}) \Rightarrow \mathbf{O}(\bar{Y})$.
- Current sub-tree :

$$\mathbf{G}(Y), \mathbf{U}(Y) \wedge \mathbf{H}(Y) \Rightarrow \mathbf{G}(Y) \text{ — } \mathbf{E}, \mathbf{O} \text{ — } \mathbf{E}(Y), \mathbf{O}(Y)$$



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We build automata checking whether the tree

- Is a decorated prof tree.
- Contains an infix-point certificate.
- Contains a reaching-goal certificate.

A is contained in B when every decorated proof tree of A

- Contains an infix-point certificate.
- Contains a reaching-goal certificate.

We proceed by

- Union of automata.
- Complementation of automata.
- Intersection of automata.
- Emptiness-checking of automata.

Complexity of the algorithm

2EXPTIME in the sizes of A and B

What is a transitive program ?

A program with recursion through transitive closure only.

Example of transitive program

Program C

- $\top \Rightarrow S^*(X, X)$
- $S(X, Y) \wedge S^*(Y, Z) \Rightarrow S^*(X, Z)$
- $Z(X) \wedge S^*(X, Y) \Rightarrow I(Y)$
- Goal predicate : I

Diamond reduction

Non-recursive program with

- New EDB **diamond** predicates.
- New **diamond** rules.
- Rules $\top \Rightarrow \mathbf{S}^*(X, X)$ are erased.
- Rules $\mathbf{S}(X, Y) \wedge \mathbf{S}^*(Y, Z) \Rightarrow \mathbf{S}^*(X, Z)$ are replaced by diamond rules.

Twelve diamond rules

- 1 $S(X, X_1) \wedge S^\diamond(X_1, X_2) \wedge S(X_2, X_3) \wedge S^\diamond(X_3, X_4) \wedge S(X_4, Y) \Rightarrow S^*(X, Y)$
- 2 $S(X, X_1) \wedge S^\diamond(X_1, X_2) \wedge S(X_2, X_3) \wedge S^\diamond(X_3, Y) \Rightarrow S^*(X, Y)$
- 3 $S(X, X_1) \wedge S^\diamond(X_1, X_2) \wedge S^\diamond(X_2, X_3) \wedge S(X_3, Y) \Rightarrow S^*(X, Y)$
- 4 $S(X, X_1) \wedge S^\diamond(X_1, X_2) \wedge S^\diamond(X_2, Y) \Rightarrow S^*(X, Y)$
- 5 $S^\diamond(X, X_1) \wedge S(X_1, X_2) \wedge S^\diamond(X_2, X_3) \wedge S(X_3, Y) \Rightarrow S^*(X, Y)$
- 6 $S^\diamond(X, X_1) \wedge S(X_1, X_2) \wedge S^\diamond(X_2, Y) \Rightarrow S^*(X, Y)$
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- 8 $S^\diamond(X, X_1) \wedge S^\diamond(X_1, Y) \Rightarrow S^*(X, Y)$
- 9 $S(X, X_1) \wedge S^\diamond(X_1, X_2) \wedge S(X_2, Y) \Rightarrow S^*(X, Y)$
- 10 $S(X, X_1) \wedge S^\diamond(X_1, Y) \Rightarrow S^*(X, Y)$
- 11 $S^\diamond(X, X_1) \wedge S(X_1, Y) \Rightarrow S^*(X, Y)$
- 12 $S^\diamond(X, Y) \Rightarrow S^*(X, Y)$

Labelling of a proof tree

- Select atoms of an unfolding tree of the diamond reduction.
- Map variables of these atoms to variables of the current node.
- Build a logical formula from this set and this mapping.
- Store the couple (Set of atoms, Associated mapping) **locally**.
- Store **locally** a set a such couples.

Example of formula

- Current node : $I(X), S(Y, X) \wedge I(Y) \Rightarrow I(X)$
- Set of atoms : $\{S^\diamond(\bar{X}, \bar{Y}), S(\bar{Y}, \bar{Z})\}$
- Mapping : $\bar{X} \rightarrow X, \bar{Y} \rightarrow Y, \bar{Z} \rightarrow \bar{Z}$
- Logical formula : $(\exists \bar{Z}) (S^*(X, Y) \wedge S(Y, \bar{Z}))$

Example of labelled proof tree

$\bar{I}(X),$
 $I(X) \Rightarrow \bar{I}(X)$

↓

$I(X),$
 $I(Y) \wedge S(Y, X) \Rightarrow I(X)$

↓

$I(Y),$
 $Z(Y) \Rightarrow I(Y)$

Example of labelled proof tree

$\bar{I}(X),$
 $I(X) \Rightarrow \bar{I}(X)$



$I(X),$
 $I(Y) \wedge S(Y, X) \Rightarrow I(X)$



$I(Y),$
 $Z(Y) \Rightarrow I(Y)$

$\{(\{S^\diamond(\bar{X}, \bar{Y}), S(\bar{Y}, \bar{Z})\},$
 $\{\bar{X} \rightarrow X, \bar{Y} \rightarrow \bar{Y}, \bar{Z} \rightarrow \bar{Z}\})\}$

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What is a fix-point labelled proof tree ?

- The stored formulæ do not imply **directly** other formulæ.
- There exists a **least** fix-point.

Why are these trees important ?

Equivalence between :

- A proof of $\beta(\mathbf{v})$.
- The presence of $\beta(\mathbf{v})$ in the root of the least fix-point.
- The presence of $\beta(\mathbf{v})$ in the root of **every** fix-point.

What is a direct implication ?

- 1 If φ is true in a neighbour node, φ is true.
- 2 If $\varphi_1 \wedge \varphi_2$ is true, φ_1 is true.
- 3 If φ_1 and φ_2 are true, $\varphi_1 \wedge \varphi_2$ is true.
- 4 If φ is true, $(\exists \mathbf{v})(\varphi)$ is true.
- 5 If $(\exists \mathbf{v})(\varphi_1 \wedge \varphi_2)$ is true and $\varphi_2 \Rightarrow \varphi_3$ is a rule, $(\exists \mathbf{v})(\varphi_1 \wedge \varphi_2 \wedge \varphi_3)$ is true.
- 6 If φ is an EDB atom of the current node, φ is true.
- 7 If $(\exists \mathbf{v})(\varphi)$ is true, $(\exists \mathbf{v})(\varphi \wedge \mathbf{S}^*(x, x))$ is true.
- 8 If $(\exists \mathbf{v})(\varphi \wedge \mathbf{S}(x, y))$ is true, $(\exists \mathbf{v})(\varphi \wedge \mathbf{S}^*(x, y))$ is true.
- 9 If $(\exists \mathbf{v})(\varphi \wedge \mathbf{S}^*(x, y) \wedge \mathbf{S}^*(y, z))$ is true, $(\exists \mathbf{v})(\varphi \wedge \mathbf{S}^*(x, z))$ is true.
- 10 \top is true.

How do we recognize fix-point labelled proof trees ?

With top-down non-deterministic automata :

- We select a direct implication rule.
- We select one or two true formulæ stored in the node.
- We compute the implied formula.
- We verify that this formula is stored in the node.

How can we conclude over the containment ?

With automata :

- The goal formula $\beta(\mathbf{v})$ is stored in the root when a containment mapping exists.

We build an automaton checking whether the tree

- Is a fix-point labelled proof tree.
- Does not store the goal formula $\beta(\mathbf{v})$ in its root.

A is contained in B when every labelled proof tree of A

- Stores the goal formula $\beta(\mathbf{v})$ in its root.

We proceed by

- Emptiness-checking of automata.

Complexity of the algorithm

3EXPTIME in the sizes of A and B

We already knew

- The decidability of the containment problem in monadic and transitive programs.
- Algorithms of non-elementary complexity.

I found

- An algorithm deciding the containment in monadic programs in $2EXPTIME$.
- An algorithm deciding the containment in transitive programs in $3EXPTIME$.

We still have to

- Find lower bounds for the containment problems.
- Search algorithms deciding directly the equivalence problems.

Questions ?