# First-order answer set programming as constructive proof search 

Paweł Urzyczyn<br>(joint work with Aleksy Schubert)

## Logic Programming

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$U:-Z, V$;
$Y:-Z$;
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The meaning of this program is the set of derived atoms.
They are: $Z, Y, X$, but neither $U$ nor $V$.

## A logic program with negations

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\begin{aligned}
& X:-Y, Z, U ; \\
& Y:-\neg Z ; \\
& Y:-Z ; \\
& Z:-\neg X, \neg U ; \\
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Which atoms are "derivable" (forced true)?
There are many possible answers. One is...

## Answer Set Programming

Kolaitis, Papadimitriou,
Why not Negation by Fixpoint?, PODS'88:

1. Guess which atoms should be forced.
2. Verify that exactly these atoms are forced.

## Bad guess

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Guess 1: Atoms $X$ and $Z$ are forced, atoms $Y$ and $U$ are not.

## Bad guess

$X:-Y, Z, U$;
$Y:-\neg Z$; Red clauses are invalid.
$Y:-Z$;
$Z:-\neg X, \neg U$;
$U:-Y, \neg Z$.

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## Bad guess

$X:-Y, Z, U$;
$Y:-\neg Z$; Red clauses are invalid.
$Y:-Z$; Nothing can be derived: this guess is wrong.
$Z:-\neg X, \neg U$;
$U:-Y, \neg Z$.

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## Good guess

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Guess 2: Atoms $Y$ and $U$ are forced, atoms $X$ and $Z$ are not.

## Good guess

$X:-Y, Z, U$;
Green assumptions are satisfied.
$Y:-\neg Z$;
$Y:-Z$;
$Z:-\neg X, \neg U$; This clause is invalid.
$U:-Y, \neg Z$.

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## Stable models

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& Z:-\neg X, \neg U ; \\
& U:-Y, \neg Z ;
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$$

This program has two stable models $\{U, Y\}$ and $\{Z, Y\}$. It entails $Y$ under stable model semantics.

Write $P \models$ sms $Y$.

## Main definition

Given a program $P$ and model $\mathfrak{M}$, define program $P_{\mathfrak{M}}$ without negations, as follows:

- For $X \notin \mathfrak{M}$, delete $\neg X$ from the rhs of all clauses of $P$;
- For $X \in \mathfrak{M}$, delete all clauses of $P$ with $\neg X$ at the rhs.

The model $\mathfrak{M}$ is stable (is an answer set) for $P$, when exactly the atoms in $\mathfrak{M}$ are derivable from $P_{\mathfrak{M}}$.

## ASP and intuitionistic logic

Characterizing ASP in terms of two-element Kripke models:

- David Pearce. Stable inference as intuitionistic validity. The Journal of Logic Programming, 38(1):79-91, 1999.


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Can this be done in terms of intuitionistic logic per se?

## The plan

- Given program $P$ and atom $\Omega$, write a formula $\varphi$ such that $P \models_{\mathrm{sms}} \Omega$ if and only if $\varphi$ is provable.


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## The plan

- Given program $P$ and atom $\Omega$, write a formula $\varphi$ such that $P \models$ sms $\Omega$ if and only if $\varphi$ is provable.
- Define a translation backward (for a class of formulas within co-NP).
- Do the same for datalog using a co-Nexptime complete class of first-order formulas.


## Forward translation

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We construct $\varphi=\psi_{1} \rightarrow \psi_{2} \rightarrow \cdots \rightarrow \psi_{m} \rightarrow 0$.
The entailment should hold in every model. For example:
Assume $P$ has only 4 atoms $X, Y, Z$, and $\Omega$. Then among the axioms $\psi_{i}$ there will be formulas:
$(\bar{X} \rightarrow 1) \rightarrow(X \rightarrow 1) \rightarrow 0$
$(\bar{Y} \rightarrow 2) \rightarrow(Y \rightarrow 2) \rightarrow 1$
$(\bar{Z} \rightarrow 3) \rightarrow(Z \rightarrow 3) \rightarrow 2$
$(\bar{\Omega} \rightarrow 4) \rightarrow(\Omega \rightarrow 4) \rightarrow 3$

No other axiom has $0,1,2,3$ as target.

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No other axiom has $0,1,2,3$ as target.
To prove 0 from the initial assumptions one must derive 4 under an arbitrary choice of overlined and non-overlined atoms.

## How to ensure entailment

The entailment $P \models$ sms $\Omega$ means that one of the three cases holds in every model $\mathfrak{M}$ :
$\Omega$ ) either $\Omega \in \mathfrak{M}$, or
A) the model is unstable because too much is derivable ( $P_{\mathfrak{M}}$ is unsound for $\mathfrak{M}$ ), or
$B$ ) the model is unstable because too little is derivable ( $P_{\mathfrak{M}}$ is incomplete for $\mathfrak{M}$ ).

Three more axioms: $\quad \Omega \rightarrow 4, \quad A \rightarrow 4, \quad B \rightarrow 4$.

## Proving unsoundness

We include in our formula the following axioms:

- $\bar{X}_{i} \rightarrow X_{i}!\rightarrow A$, for every atom $X_{i}$ of $P$;
- all clauses of $P$ where $X_{i}$ is renamed as $X_{i}$ ! and $\neg X_{i}$ is renamed as $\bar{X}_{i}$.

Let $\mathfrak{M}$ be the model corresponding to the present context.
One can prove $X_{i}$ ! if and only if the program $P_{\mathfrak{M}}$ derives $X_{i}$.
Thus $A$ is provable if and only if $P_{\mathfrak{M}}$ derives some $X_{i} \notin \mathfrak{M}$.

## Proving incompleteness

One proves $B$ iff some $X_{i} \in \mathfrak{M}$ cannot be derived by $P_{\mathfrak{M}}$.

We include in our formula the axiom:

- $X_{i} \rightarrow X_{i} ? \rightarrow B$,
for every atom $X_{i}$ of $P$.

Every proof of $X_{i}$ ? represents a refutation of $X_{i}$. How?

## Proving non-provability

Suppose we have only two clauses with target $X$ :
$\mathrm{K} 1: X:-Y, Z, \neg U ; \quad \mathrm{K} 2: X:-V, U, \neg Z$.
Then we have the axiom:
$\left(X ? \rightarrow K_{1}\right) \rightarrow\left(X ? \rightarrow K_{2}\right) \rightarrow X ?$

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For that purpose we have axioms:
$Y ? \rightarrow K_{1}, \quad Z ? \rightarrow K_{1}, \quad U \rightarrow K_{1}$,
If $U \in \mathfrak{M}$ then $K_{1}$ is provable: clause K 1 cannot derive $X$.
Otherwise we can try to prove e.g. $Y$ ?
(Clause K1 can't be used if $Y$ is not derivable.)

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Should $X$ ? appear as a proof goal again, we win instantly. Note that such judgments are only classically valid:
$\ldots,\left(X ? \rightarrow K_{1}\right) \rightarrow\left(X ? \rightarrow K_{2}\right) \rightarrow X ?, \cdots \vdash X$ ?

## Backward translation

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The principle of backward translation: for a given formula write a program $P$ so that
$\varphi$ is not provable if and only if $P$ has a stable model.
Slogan: stable model $\equiv$ refutation.

The first-order case

## The plan

First-order datalog ASP is Nexptime-complete.
The appropriate first-order fragment should be co-Nexptime-complete.

- We translate the entailment $P \models$ sms $\Omega$ into a first-order $\Sigma_{1}$ formula $\varphi$ with nullary targets.
- Such formulas can be replaced by monadic $\Sigma_{1}$ formulas (with only unary predicates).
- Refutability of bounded-arity $\Sigma_{1}$ formulas reduces to ASP. (Refutation soup $\Rightarrow$ stable model.)


## The class $\Sigma_{1}$

We only consider formulas written with $\forall$ and $\rightarrow$.
Positions of $\forall$ are classified as "positive" (covariant) and "negative" (contravariant). The class $\Sigma_{1}$ has $\forall$ only at negative positions.

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Provability of $\Sigma_{1}$ formulas is Expspace-complete in general.
Provability of $\Sigma_{1}$ formulas with nullary targets is co-Nexptime-complete.
Same for $\Sigma_{1}$ formulas with bounded-arity predicates.
In fact all we need is this pattern:

$$
\vec{\forall}(\ldots) \rightarrow \vec{\forall}(\ldots) \rightarrow \cdots \rightarrow \vec{\forall}(\ldots) \rightarrow \mathrm{a}
$$

## Forward translation: first-order case

Given program $P$ and atom $\Omega$, write a formula
$\varphi=\psi_{1} \rightarrow \psi_{2} \rightarrow \cdots \rightarrow \psi_{m} \rightarrow$ loop
such that $P \models_{\text {sms }} \Omega$.

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Model construction in every branch of the proof:
$\forall \vec{z}((\mathrm{R}(\vec{z}) \rightarrow$ loop $) \rightarrow(\overline{\mathrm{R}}(\vec{z}) \rightarrow$ loop $) \rightarrow$ loop $)$

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Case dispatch as before:
$\Omega \rightarrow$ loop, $\mathrm{A} \rightarrow$ loop, and $\mathrm{B} \rightarrow$ loop

## Proving unsoundness with nullary targets

Instead of $\bar{X}_{i} \rightarrow X_{i}!\rightarrow A$ we use axioms

$$
\forall \vec{x} \cdot \overline{\mathrm{R}}(\vec{x}) \rightarrow(\mathrm{R}!(\vec{x}) \rightarrow \bullet) \rightarrow \mathrm{A}
$$

That is, we prove •, accumulating knowledge of derivation goals $R!(\vec{c})$ visited so far. For a clause like
$\mathrm{R}(\vec{x}):-\mathrm{P}(\vec{x}), \mathrm{Q}(\vec{x}), \neg \mathrm{S}(\vec{x})$
we have an axiom of the form:
$\forall \vec{x} \cdot \mathrm{R}!(\vec{x}) \rightarrow(\mathrm{P}!(\vec{x}) \rightarrow \bullet) \rightarrow(\mathrm{Q}!(\vec{x}) \rightarrow \bullet) \rightarrow \overline{\mathrm{S}}(\vec{x}) \rightarrow \bullet$,
Proof succeeds when we arrive at a fact (no more subgoals).

## Proving incompletenenss with nullary targets

The basic axiom scheme is
$\forall \vec{x} . \mathrm{R}(\vec{x}) \rightarrow(\mathrm{R} ?(\vec{x}) \rightarrow 0) \rightarrow \mathrm{B}$.
(Oversimplified) axiom scheme for $\mathrm{R} ?(\vec{x})$ is
$\forall \vec{x} . \mathrm{R} ?(\vec{x}) \rightarrow\left(K_{1}(\vec{x}) \rightarrow \bar{K}_{1}\right) \rightarrow \cdots \rightarrow\left(K_{n}(\vec{x}) \rightarrow \bar{K}_{n}\right) \rightarrow 0$, where $K_{i}$ are clauses of target R ? $(\vec{x})$.
This time we accumulate a history of a refuting play.

## Proving incompletenenss, cont'd

If clause $K_{i}$ is e.g. $\mathrm{R}(\vec{x}):-\mathrm{P}(\vec{x}), \mathrm{Q}(\vec{x}), \neg \mathrm{S}(\vec{x})$
then we have this axiom, where RP "remembers"
a single refutation step.
$\forall \vec{x} . K_{i}(\vec{x}) \rightarrow(\mathrm{P} ?(\vec{x}) \rightarrow \mathrm{RP}(\vec{x}) \rightarrow 0) \rightarrow \bar{K}_{i}$
This "memory" is made transitive with axioms:
$\forall \vec{x} \vec{y} \vec{z}(\mathrm{RP}(\vec{x}, \vec{y}) \rightarrow \mathrm{PQ}(\vec{y}, \vec{z}) \rightarrow(\mathrm{RQ}(\vec{x}, \vec{z}) \rightarrow 0) \rightarrow 0)$
The refuter can win by discovering a loop:
$\forall \vec{x}(\mathrm{PP}(\vec{x}, \vec{x}) \rightarrow 0)$.

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Refutations must be made concise (exponential size).

