Overview: Representation Techniques

Week 6

- Representations for classical planning problems
 - deterministic environment; complete information

Week 7

- Logic programs for problem representations
 - including planning problems, games

Week 8

- First-order logic to describe dynamic environments
 - deterministic environment; (in-)complete information

Week 9

- State transition systems to describe dynamic environments
 - nondeterministic environment; (in-)complete information

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Answer Set Programming: Overview

- Foundations: Stable models of a logic program
- How to represent problems as Answer Set Programs (ASP)
- ASP solver technology
- Solving planning problems and general single-player games with ASPs

Background reading

Answer Set Programming at a Glance by Gerhard Brewka, Thomas Eiter, Miroslaw Truszcynski, Communications of the ACM 54(12):93-103, 2011

Potassco User Guide

http://sourceforge.net/projects/potassco/files/potassco_guide/2010-10-04/guide.pdf/download

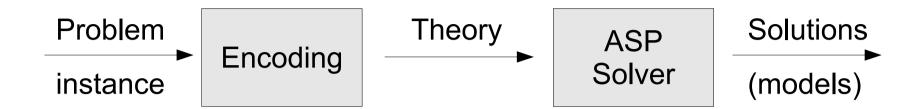
Handbook of Knowledge Representation by Bruce Porter, Vladimir Lifschitz, Frank Van Harmelen, Elsevier 2007. Chapter 7

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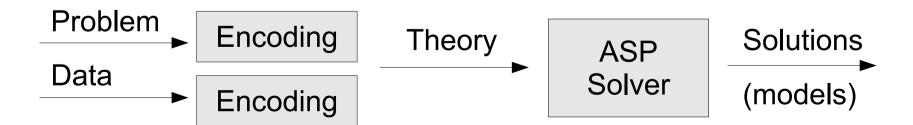
History

- Roots: logic programming, nonmonotonic reasoning
- Based on some formal system with semantics that assigns a theory a collection of answer sets (models)
- An ASP solver: computes answer sets for a theory
- Solving a problem in ASP:
 - Encode the problem as a theory such that solutions to the problem are given by answer sets of the theory

Solving a Problem with an ASP



- Uniform encoding: separate problem specification and data
- Compact, easily maintainable representation
- Integrating KR, DB (i.e. database), and search techniques
- Handling dynamic, knowledge intensive applications



Example: k-Colouring Problem

 Given a graph (V,E) find an assignment of one of k colours to each vertex such that no two adjacent vertices share a colour

```
% Problem encoding
1 { coloured(V,C) : colour(C) } 1 :- vtx(V).
:- edge(V,U), colour(C), coloured(U,C), coloured(V,C).
```

```
% Data vtx(a). ... edge(a,b). ... colour(b). ...
```

- Legal colourings of the graph given as data and stable models of the problem encoding and data correspond:
 - a vertex v coloured with a colour c iff
 coloured (v, c) holds in a stable model

Semantics: Stable Models

Stable Models of a Logic Program

Consider normal logic program rules

- Seen as "constraints" on an answer set (stable model):
 - if B1, . . . ,Bm are in the set and
 - none of C1, . . . ,Cn is included,

then A must be included in the set

- A stable model is a set of atoms
 - (i) which satisfies the rules and
 - (ii) where each atom is justified by the rules

negation by default; closed world assumption (CWA)

Stable Models (cont'd)

Program:

$$b \leftarrow$$
 $f \leftarrow b$, not eb
 $eb \leftarrow e$

Stable model:

{b,f}

- Another candidate model: {b, eb}
 satisfies the rules but is not a proper stable model:
 - eb is included for no reason.
- Justifiability of stable models is captured by the notion of a reduct of a program

Definite Programs

- For the reduct we first need to consider negation-free programs, i.e. programs without not
- Such a program P has a unique least model Least-Model(P) satisfying the rules
- Least-Model(P) can be constructed by forward chaining

Examples.

$$r \leftarrow p$$

$$LM(P_1) = \{p, r\}$$

$$P_2$$
:

$$p \leftarrow r$$

$$r \leftarrow p$$

$$LM(P_2) = \{\}$$

$$p \leftarrow r$$

$$r \leftarrow p$$

$$p \leftarrow$$

$$LM(P_3) = \{p, r\}$$

Stable Models (Formal Definition)

- Consider the propositional (variable free) case:
 - P ground program
 - S set of ground atoms
- Reduct P^s
 - delete each rule having a body literal not C with C ∈ S
 - remove all negative body literals from the remaining rules
- P^S is a definite program (and has unique Least-Model(P^S))
- S is a stable model of P iff S = Least-Model(P^S)

Examples: Stable Models

S	Р	P ^S	LM(P ^S)
{ b, f }		b ←	{ b, f }
	$f \leftarrow b$, not eb $eb \leftarrow e$	f ← b	
	eb ← e	eb ← e	
{ b, eb }		b ←	{ b }
	f ← b, not eb		
	$f \leftarrow b$, not eb $eb \leftarrow e$	eb ← e	

- The set {b, eb} is not a stable model of P
- {b, f} is the (unique) stable model of P

More Examples

- A program can have none, one, or multiple stable models
- Program: Two stable models:

$$p \leftarrow \text{not } r$$
 { p } $r \leftarrow \text{not } p$

Program: No stable models

$$p \leftarrow \text{not } p$$

Exercise

Determine the Stable Models

Program P

PS

is stable model?

Program P

PS

is stable model?

 $p \leftarrow \text{not } r$

$$r \leftarrow \text{not } s$$

Programs with Variables

- Variables are needed for uniform encodings
- Semantics: Herbrand models
- A rule is seen as a shorthand for the set of its ground instantiations over the Herbrand universe of the program
- Recall: The Herbrand universe is the set of terms built from the constants and functions in the program

Example. For the program P:

```
edge(1,2).
edge(1,3).
edge(2,4).
path(X,Y) :- edge(X,Y).
path(X,Y) :- edge(X,Z), path(Z,Y).
```

the Herbrand universe is {1,2,3,4}

Programs with Variables

• Hence, the rule path (X,Y) :- edge (X,Y) in P represents:

```
path(1,1) :- edge(1,1).
path(1,2) :- edge(1,2).
path(2,1) :- edge(2,1).
path(2,2) :- edge(2,2).
path(1,3) :- edge(1,3).
```

- The Herbrand base of a program is the set ground atoms built from the predicates and the Herbrand universe of the program
- For P the Herbrand base is

```
\{path(1,1), edge(1,1), path(1,2), ...\}
```

A Herbrand model is a subset of the Herbrand base

Programs with Variables

- The grounding of a program P yields:
 - a propositional logic program
 - built from atoms in the Herbrand base of P, denoted HB(P)
- Grounding is denoted grnd(P)
- M ⊆ HB(P) is a stable model of P if M is a stable model of grnd(P)

Example: Nonmonotonic Reasoning

Consider the program

```
flies(X):- bird(X), not exceptionalBird(X).
bird(tweety).
bird(sam).
```

It has a single stable model:

```
{ bird(sam), bird(tweety), flies(sam), flies(tweety) }
```

If we add an exception:

```
bird(X) :- emu(X).
exceptionalBird(X) :- emu(X).
emu(sam).
```

• then the extended program has a new unique stable model:

```
{ bird(teweety), flies(tweety),
  emu(sam), bird(sam), exceptionalBird(sam) }
```

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Stable Models: Complexity

- It requires linear time to check whether a set of atoms is a stable model of a ground program
- It is NP-complete to decide whether a ground program has a stable model

Extensions to Normal Programs

• An integrity constraint (or simply: constraint) is a rule without a head:

It can be seen as a shorthand for

$$F \leftarrow \text{not } F, B1, \ldots, Bm, \text{ not } C1, \ldots, \text{ not } Cn$$

- and it eliminates stable models where the body B1, . . . ,Bm, not C1, . . . , not Cn is satisfied
- Built-in arithmetics

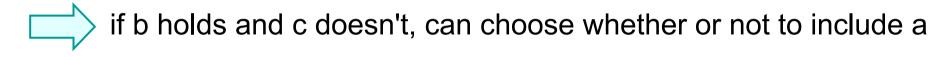
```
next_state(T+1) :- current_state(T).
```

More Extensions: Encoding of Choices

- A key point in ASP
- Choices can be encoded using normal rules

$$a \leftarrow \text{not } a', b, \text{not } c$$

 $a' \leftarrow \text{not } a$



Choice rules, however, provide a much more intuitive encoding:

$$\{a\} \leftarrow b$$
, not c

Meaning is the same as above

Choice rules with cardinality constraints

Choice rules with conditional literals

```
1 { coloured(V,C):colour(C) } 1 :- vtx(V).
```

Representing Problems as Answer Set Programs

Example: Graph Colouring

```
% Problem encoding
  Generator rule
1 { coloured(V,C) : colour(C) } 1 :- vtx(V).
% Tester rule
:- edge(V,U), colour(C), coloured(V,C), coloured(U,C).
% Data
vtx(a). ...
edge(a,b). ...
colour(r). colour(g). ...
```

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Generator Rules

- The idea is to define the potential answer sets
- Typically encoded using choice rules
- Example. Choice on a subset of {a1,...,an} given b:

```
{al;...;an} :- b.
```

The program with the fact b and this rule alone has 2ⁿ stable models:

```
{b}, {b, a1},...,{b, a1, ..., an}
```

Example. Choice on a cardinality limited subset of {a1,...,an} given b:

```
2 {a1;...;an} 3 :- b.
```

Typically rules with variables used

```
1 {coloured(V,C):colour(C)} 1 :- vtx(V).
```

Given a vertex v, choose exactly one ground atom coloured (v, c) such that colour (c) holds

Tester Rules

Integrity constraints

```
:- a1,...,an, not b1,...,not bm.
```

- Eliminate stable models but cannot introduce new ones:
 - Let P be a program and IC a set of integrity constraints
 Then S is a stable model of P ∪ IC iff:
 - S is a stable model of P, and
 - S satisfies IC
- Example.

```
:- edge(V,U), colour(C), coloured(V,C), coloured(U,C).
```

Definitory Rules

- Often the tester and generator rules need auxiliary conditions
- This part of the encoding usually looks similar to a Prolog program
- As ASP has Prolog style rules with a similar semantics, Prolog style programming techniques can be used here for handling, e.g., data base operations (unions, joins, projections)
- Example. Join two relations: p(X,Y) := q(X,Z), r(Z,Y).
- Example. The largest score S from a relation score (P, S):

```
has_larger(S) :- score(P,S), score(P1,S1), S<S1.
max_score(S) :- score(P,S), not has_larger(S).</pre>
```

Another Example: Reviewer Assignment

```
% Data
reviewer(r1). ...
proposal(p1). ...
expert(r1,p2). ...
coi(r1,p1). ...
                       % Conflict of interest
% Problem encoding
 Generator rule
 Each project proposal assigned to exactly 3 reviewers
 { assigned(P,R) : reviewer(R) } 3 :- proposal(P).
```

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Example: Reviewer Assignment (cont'd)

```
% Tester rules
% No assignments with a conflict of interest
    :- assigned(P,R), coi(P,R).
% No reviewer gets a proposal outside their expertise
    :- proposal(P), reviewer(R), assign(P,R),
        not expert(R,P).
% No reviewer has more than 8 proposals
    :- 9 { assigned(P,R) : proposal(P) }, reviewer(R).
% Each reviewer has at least 6 proposals
    :- { assigned(P,R) : proposal(P) } 5, reviewer(R).
```

Last Example: Hamiltonian Cycles

- A Hamiltonian cycle: a closed path that visits all vertices of a graph exactly once
- Input: a directed graph
 - vtx(a). ...
 - edge(a,b). ...
 - initialvtx(a0). for some vertex a0

Hamiltonian Cycles (cont'd)

- Candidate answer sets: subsets of edges
- Generator:
 Allows zero or more instances

```
{ hc(X,Y) } :- edge(X,Y).
```

- Stable models of the generator given a graph:
 - input graph and
 - a subset of the ground facts hc(a0,a1)
 for which there is an input fact edge(a0,a1)
- Tester (1): each vertex has at most one chosen incoming/outgoing edge

```
:- hc(X,Y), hc(X,Z), Y!=Z.
:- hc(Y,X), hc(Z,X), Y!=Z.
```

 Only subsets of chosen edges hc(a,b) that form paths (possibly closed) pass this test

Hamiltonian Cycles (cont'd)

Tester (2): each vertex is reachable from a given initial vertex through chosen hc(a,b) edges:

```
:- vtx(X), not r(X).
r(Y) :- hc(X,Y), initialvtx(X).
r(Y) :- hc(X,Y), r(X).
```

- Only Hamiltonian cycles pass tests (1) and (2)
- Given:
 - the graph, the generator rule, and the tester rules (1),(2)
- Hamiltonian cycles and stable models correspond
- A Hamiltonian cycle: atoms hc(a,b) in a stable model

Exercise

Exercise: Find 3-Cliques in Graphs

- Given an undirected graph G=(V,E), decide whether there is a set of 3 vertices that are pairwise adjacent
- Generate a subset of V that forms such a clique
- % Data

% Generator rule

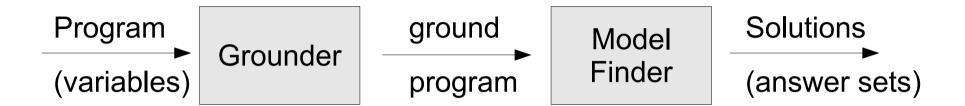
% Tester rule

ASP Solver Technology

ASP Solvers

- ASP solvers need to handle two challenging tasks
 - complex data
 - search
- Separation of concerns two level architecture
 - Grounding step handles complex data:
 - Given program P with variables, generate a set of ground instances of the rules which preserves the models
 - Logic Programming and deductive database techniques
 - Model search for ground programs:
 - Special-purpose search procedures
 - Exploiting SAT (i.e., satisfiability) solver technology

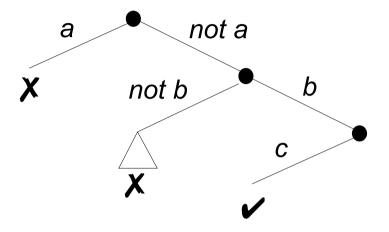
Typical ASP System Tool Chain



- Grounder
 - (deductive) DB techniques
 - built-in predicates/functions (e.g. arithmetic)
 - function symbols
- Model finder
 - SAT technology (propagation, conflict driven clause learning)
 - Special propagation rules for recursive rules
 - Built-in support for cardinality and weight constraints, optimisation

Search

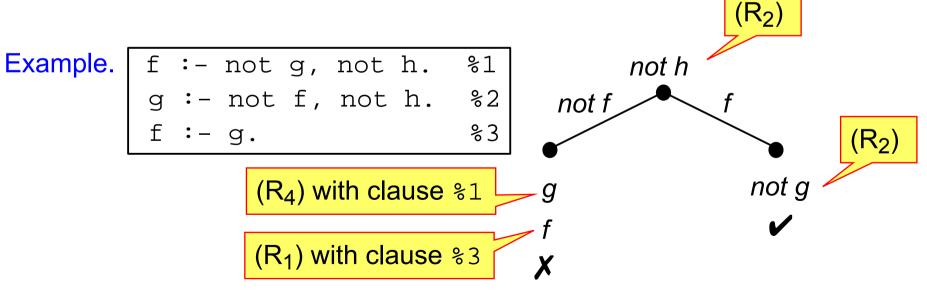
Backtracking over truth-values for atoms



- Each node consists of a model candidate (set of literals)
- Propagation rules are applied after each choice
 - A propagation rule extends a model candidate by one or more new literals
 - Example. Given r ← p, not q and candidate {p,not r}, derive q
 - Propagation rules need to be correct: If L is derived from model candidate
 A then L holds in every stable model compatible with A

Example Propagation Rules

(R₁) All literals in the body of a clause are true → head must be true
(R₂) In all clauses for p at least one body literal is false → p must be false
(R₃) p is true and there is only one clause for p → all body literals must be true
(R₄) p is false and there is a clause for p in which all body literals are true except L → L must be false



The right branch determines the only stable model, S={f}

Some Common Search Heuristics

Heuristics to select the next atom for splitting the search tree:

- an atom with the maximal number of occurrences in clauses of minimal size
- an atom with the maximal number of propagations after the split
- an atom with the smallest remaining search space after split + propagation

Exercise

Compute All Stable Models

```
h(0).
e(0):-notb(0).
82
b(0):-note(0).
83
:-e(0), noth(0).
84
:-b(0), h(0).
85
h(1):-b(0).
86
h(1):-h(0), note(0).
87
n(1):-e(0).
88
n(1):-n(0).
89
:-notn(1).
```

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Using ASP for Planning and Game Playing

Planning/Single-Player Games with ASP: Overview

- Devise a logic program such that stable models correspond to plans:
 - of length at most n
 - that are valid
 - and that reach the goal
- Generator: execution sequences of operator instances from time 0 to n
- Tester: eliminate those sequences that
 - contain actions whose preconditions are not satisfied
 - do not reach the goal

Preliminaries

Cake-Example revisited

- Two state properties: have, eaten
- Action eat, which is possible if have is true;
 effect: eaten
- Action bake, which is possible if have is false;
 effect: have
- Initially, have is true
- The goal is to make eaten true
- Add to each state feature and action a time argument
 - p(T) − p is true at time T
 - a (T) action a is taken at time T
- Initial state:

have (0).

Planning with ASP – Preconditions & Effects

Plan length (τ = search depth):

```
time (0...t).
```

Generator: one action at a time

```
1 { bake(T); eat(T) } 1 :- time(T).
```

Tester (1): Action preconditions

```
:- eat(T), not have(T).
:- bake(T), have(T).
```

Auxiliary rules: Action effects

```
have (T+1) :- bake (T), time (T).

have remains the following problem of the following pr
```

Stands for: time(0). time(1). $time(\tau)$. where τ a number ≥ 0

eat possible if have true bake possible if have false

Condition under which have remains unchanged

Goal Conditions

 Tester (2): exclude models where the goal has not been reached at time τ+1

```
% Goal :- not eaten(\tau+1).
```

Remember: the goal is to make eaten **true**

Plans

Plans correspond to answer sets:

cf Exercise Slide 41

- there is a stable model iff there is a valid sequence of n moves that leads to the goal
- A valid plan:
 - all action instances in the stable model. Here: eat (0)

General Game Playing

General Game Players are systems

- able to understand formal descriptions of arbitrary games
- able to learn to play these games effectively

Translation: They don't know the rules until the game starts

Unlike specialised game players (e.g. Deep Blue), they do not use algorithms designed in advance for specific games



International Activities

Websites - games.stanford.edu ggp.org general-game-playing.de

- Games
- Game Manager
- Reference Players
- Development Tools
- Literature

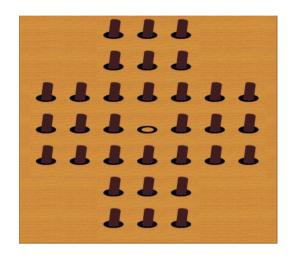
World Cup, administered by Stanford University

- 2005 Cluneplayer (USA)
- 2006 Fluxplayer (Germany)
- 2007, 2008, 2012 Cadiaplayer (Iceland)
- 2009, 2010 Ary (France)
- 2011, 2013 TurboTurtle (USA)
- 2014 Sancho (USA)
- 2015 Galvanise (USA)



Single-Player General Game Playing

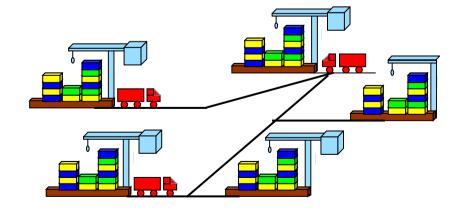
 In single-player games, the player has no direct opponent





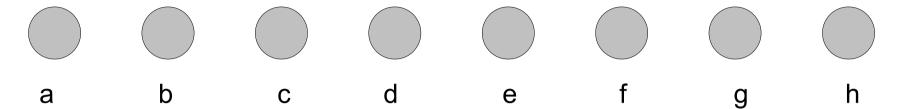


	32	35	30	25	08	05	50	55
I	29	24	33	36	51	56	07	04
ĺ	34	31	26	09	06	49	54	57
	23	28	37	12	01	52	03	48
	38	13	22	27	10	47	58	53
I	19	16	11	1	61	02	43	46
	14	39	18	21	44	41	62	59
	17	20	15	40	63	60	45	42

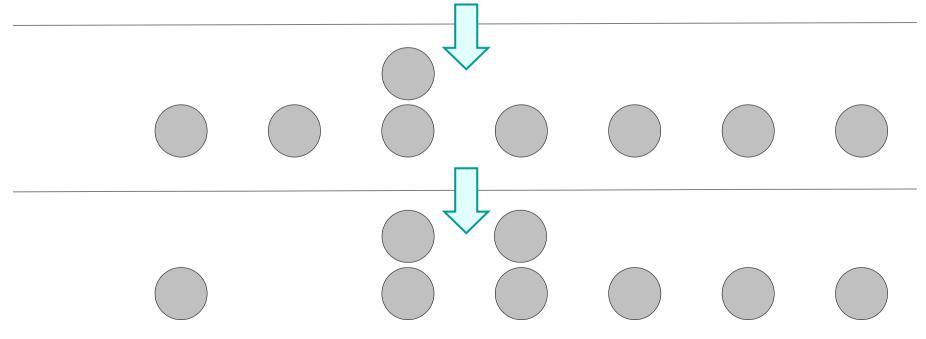


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Example: Coin Game



- Jump with singleton coin over two coins onto singleton coin
- End up with 4 stacks of two coins each



dead end

Variable

A KR Language for Games: Game Description Language (GDL)

Some Facts

```
(role robot)

(init (cell a 1))
(init (cell b 1))
...

(init (cell h 1))
(init (step 1))
```

Some Rules

```
(<= (legal robot (jump ?x ?y))
    (true (cell ?x 1))
    (true (cell ?y 1))
    (twobetween ?x ?y))

(<= (next (cell ?x 0))
    (does robot (jump ?x ?y)))

(<= (next (cell ?y 2))
    (does robot (jump ?x ?y)))</pre>
```

prefix syntax

All highlighted expressions are pre-defined keywords in GDL

does(r,a)

legal(r,a)

qoal(r,v)

terminal

next(f)

GDL Keywords

In GDL, a game is described by a logic program written in prefix notation

GDL uses the following predicates as keywords

• role(r) means that r is a role (i.e. a player) in the game

init(f) means that f is true in the initial position (state)

true(f) means that f is true in the current state

means that role r does action a in the current state

means that f is true in the next state

means that it is legal for r to play a in the current state

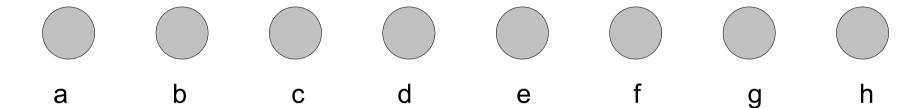
means that r gets goal value v in the current state

means that the current state is a terminal state

distinct(s,t) means that terms s and t are syntactically different

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The Coin Game in GDL



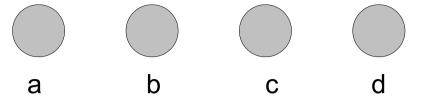
```
(role robot)

(init (cell a 1))
(init (cell b 1))
(init (cell c 1))
(init (cell d 1))
(init (cell e 1))
(init (cell f 1))
(init (cell g 1))
(init (cell h 1))
(init (step 1))
```

```
(succ a b)
(succ b c)
(succ c d)
(succ d e)
(succ e f)
(succ f q)
(succ q h)
(succ 1 2)
(succ 2 3)
(succ 3 4)
(succ 4 5)
```

```
(<= terminal</pre>
    (not anylegalmove))
(<= anylegalmove</pre>
    (legal robot ?m))
(<= (goal robot 100)
    (true (step 5)))
(<= (goal robot 0)</pre>
    (true (cell ?x 1)))
```

The Coin Game in GDL (cont'd)



```
(<= (legal robot (jump ?x ?y))</pre>
    (true (cell ?x 1))
    (true (cell ?y 1))
    (twobetween ?x ?y)
(<= (legal robot (jump ?y ?x))</pre>
    (legal robot (jump ?x ?y)))
(<= (next (cell ?x 0))
    (does robot (jump ?x ?y)))
(<= (next (cell ?y 2))
    (does robot (jump ?x ?y)))
(<= (next (cell ?x ?c))
    (true (cell ?x ?c))
    (does robot (jump ?y ?z))
    (distinct ?x ?y)
    (distinct ?x ?z))
(<= (next (step ?y))
    (true (step ?x))
    (succ ?x ?y))
```

```
e f q h
```

```
(<= (twobetween ?x ?y))</pre>
    (succ ?x ?z) (true (cell ?z 2))
    (zerobetween ?z ?y))
(<= (twobetween ?x ?y))</pre>
    (succ ?x ?z) (true (cell ?z 1))
    (onebetween ?z ?y))
(<= (twobetween ?x ?y))</pre>
    (succ ?x ?z) (true (cell ?z 0))
    (twobetween ?z ?y)))
(<= onebetween ?x ?y))</pre>
    (succ ?x ?z) (true (cell ?z 1))
    (zerobetween ?z ?y))
(<= (onebetween ?x ?y))</pre>
    (succ ?x ?z) (true (cell ?z 0))
    (onebetween ?z ?y))
(<= (zerobetween ?x ?y)</pre>
    (succ ?x ?y))
(<= (zerobetween ?x ?y)</pre>
    (succ ?x ?z) (true (cell ?z 0))
    (zerobetween ?z ?y))
```

Valid GDL Descriptions

Conditions that GDL game descriptions must satisfy:

only appears in facts

only appears in the head of clauses and does not depend on true, legal, does, next, terminal, or goal

only appears in the body of clauses, and none of
legal, terminal or goal depends on does

next(f) only appears in the head of clauses

distinct(s,t) only appears in the body of clauses

Solving Single-Player Games: From GDL to ASP

- 1. Replace (init φ) by holds(φ ,0)
- 2. Replace (true φ) by holds(φ , T)
- 3. Replace (next φ) by holds(φ, T+1)
- 4. Replace all other (p $t_1 \dots t_n$) by $p(t_1, \dots, t_n, T)$

Result for the Coin Game, written in ASP notation:

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From GDL to ASP (cont'd)

- 1. One move made in every time step
- 2. Don't make a move that is not legal
- 3. Terminal position eventually reached
- 4. Goal value achieved in terminal position

ranges over all moves in the game

Every answer set corresponds to a game solution and vice versa, e.g.

```
jump(d,g),0 jump(f,b),1 jump(c,a),2 jump(e,h),3
```

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Summary

- Stable models = answer sets
- How to write ASPs
- ASP solver technology
- Planning and solving general single-player games with ASPs

Available ASP solvers

Grounder

```
• Gringo http://potassco.sourceforge.net/
```

Lparse http://www.tcs.hut.fi/Software/smodels/

Model finder

• Clasp http://potassco.sourceforge.net/

Clingo = Gringo + Clasp