### Knowledge Representation for the Semantic Web

### Lecture 8: Answer Set Programming III

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partially based on slides by Thomas Eiter



D5: Databases and Information Systems Max Planck Institute for Informatics

WS 2017/18

#### **Unit Outline**

The DLV System and its Features

Weak Constraints

Aggregates

DLV Usage: Examples

Overview: DLV-Extensions

# The DLV System



# The DLV System: Introduction

http://www.dlvsystem.com/

- DLV is a premier disjunctive answer set solver
- Based on strong theoretical foundations
- Incorporates a lot of database technology
- Features non-monotonic negation and disjunction
- Rich program syntax (⇒ high expressiveness)
- Front-ends for specific problems (diagnosis, planning, etc.).
- Many extensions
  - DLVHEX, DLV $^{DB}$ , DLT, DLV-Complex, DL-programs, OntoDLV, ...
- Industrial applications
  - Exeura Srl www.exeura.it/

#### **Features of DLV**

- Language: logic programs admitting
  - · disjunctions in rule heads,
  - default negation,
  - strong (classical) negation.

<sup>&</sup>lt;sup>1</sup>with the release of DLV 2010-10-14, function terms have been introduced.

#### Features of DLV

- · Language: logic programs admitting
  - · disjunctions in rule heads,
  - default negation,
  - strong (classical) negation.
- Additionally:
  - integer, arithmetic, and comparison built-ins,
  - · integrity constraints,
  - weak constraints,
  - aggregate functions,
  - function symbols;<sup>1</sup>
  - support for brave & cautious reasoning.
  - + further

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#### **Frontends**

- Besides the answer set semantics core, DLV offers front-ends for particular KR tasks:
  - diagnosis
  - inheritance
  - knowledge-based planning ( $\mathcal{K}$  language)
- Also:
  - front-end to SQL3
  - weak constraints with weights and layers
  - aggregate functions

#### Using DLV

DLV [build BEN/Dec 17 2012 gcc 4.6.1]
usage: dlv (FRONTEND) {OPTIONS} [filename [filename [...]]]
Specify -help for more detailed usage information.

- DLV is command-line oriented
- Input is read from files whose names are passed on the command-line
- If the command-line option "--" has been specified, input is also read from standard input (stdin)
- Output is printed to standard output (stdout), one line per model,
   i.e., answer set
- Detailed documentation at http://www.dlvsystem.com

### **DLV** Syntax

#### • Rules:

$$a_1 \vee \cdots \vee a_n := b_1, \ldots, b_k, \text{ not } b_{k+1}, \ldots, \text{ not } b_m.$$

where  $n \ge 1$ ,  $m \ge 0$  and all  $a_i$ ,  $b_j$  are atoms or strongly negated atoms (e.g., -a); no function symbols.

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Queries:

$$b_1, \ldots, b_k$$
, not  $b_{k+1}, \ldots$ , not  $b_m$ ?

Support for query answering besides model computation (satisfied in at least one / in all answer sets, called brave / cautious reasoning)

Each variable occurring in a rule (resp., constraint) in

- the head,
- a default literal (not b), or
- · a built-in comparison predicate,

must occur in at least one non-comparison not-free literal in the body.

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#### Example:

```
a(X) := not b(X), c(X).

a(X) := X > Y, node(X), node(Y).
```

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Safe!

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```

```
a(X) v -a(X).
a(X) :- not b(X).
:- X <= Y, node(X).</pre>
```

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#### Unsafe!

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                  X is a known integer (1 \le X \le N).
\#succ(X,Y):
                  Y is successor of X, i.e., Y = X + 1.
+(X,Y,Z):
                  Z = X + Y. (both variants are possible)
*(X, Y, Z):
                  Z = X * Y.
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*(X,Y,Z): Z = X * Y.
```

 Just auxiliary predicates. An upper bound for integers has to be specified when DLV is invoked.

#### **Example: Fibonacci Numbers**

- $\blacktriangleright$   $\underbrace{1}_{F_1}$ ,  $\underbrace{1}_{F_2}$ ,  $\underbrace{2}_{F_3}$ ,  $\underbrace{3}_{\dots}$ , 5, 8, 13, 21, 34, 55, 89, 144, 233, 377, ...
  - Except for first two numbers, each value is defined as the sum of the previous two.

### **Example: Fibonacci Numbers**

- **▶** 1, 1, 2, 3, 5, 8, 13, 21, 34, 55, 89, 144, 233, 377, ...
  - Except for first two numbers, each value is defined as the sum of the previous two.

#### Encoding:

```
fib0(1,1). fib0(2,1).
fib(N,X) := fibO(N.X).
F_{N+2} = F_N + F_{N+1}
fib(N,X) := fib(N1,Y1), fib(N2,Y2),
            N=N2+2, N=N1+1, X=Y1+Y2.
```

An upper bound for integers has to be specified when dlv is invoked.

### **Linear Ordering, Successor**

Example: Employees

**Input:** Employees and their salaries, represented by  $empl(_{-},_{-})$ 

**Problem:** Compute linear ordering and successor relation

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**Problem:** Compute linear ordering and successor relation for employees

Solve problem using projection and double negation!

% Order employees by id

$$prec(X,Y) := empl(X,_), empl(Y,_), X < Y.$$

% Define successor

$$-\operatorname{succ}(X,Y) := \operatorname{prec}(X,Z), \operatorname{prec}(Z,Y).$$
  
 $\operatorname{succ}(X,Y) := \operatorname{prec}(X,Y), \operatorname{not} - \operatorname{succ}(X,Y).$ 

### Smallest, Largest in a Linear Ordering

Example: Employees

Problem: Determine employee with smallest (resp., largest) id

# Smallest, Largest in a Linear Ordering

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 Computing smallest and largest elements in a linear ordering works accordingly:

```
- \texttt{first}(X) := \texttt{succ}(Y, X).  \texttt{first}(X) := \texttt{empl}(X, \_), \ \texttt{not} \ - \texttt{first}(X). - \texttt{last}(X) := \texttt{succ}(X, Y).  \texttt{last}(X) := \texttt{empl}(X, \_), \ \texttt{not} \ - \texttt{last}(X).
```

Exercise: determine maximal (resp. minimal) salary of employees

### **Counting and Sum**

How about counting or computing sums?

Example: Employees (cont'd)

**Problem:** Compute the sum of salaries of the employees

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Example: Employees (cont'd)

Problem: Compute the sum of salaries of the employees

Recursion is needed:

```
partialSum(X,S) := first(X), empl(X,S).
partialSum(Y, S) := succ(X, Y), partialSum(X, S1),
                    empl(Y, S2), S = S1 + S2.
          sum(S) := last(X), partialSum(X,S).
```

#### Weak Constraints

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  - integrity constraints "kill" unwanted models;
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- Syntax (DLV):

```
b_1, \ldots, b_k, \text{ not } b_{k+1}, \ldots, \text{ not } b_m. [Weight: Level]
```

#### where

- all  $b_i$  are atoms (resp. "classical" literals)
- Weight, Level are numbers (or variables occurring in some  $b_i$ ,  $i \leq k$ , that instantiate to numbers)

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- all  $b_i$  are atoms (resp. "classical" literals)
- Weight, Level are numbers (or variables occurring in some  $b_i$ ,  $i \leq k$ , that instantiate to numbers)
- Informally: for (P, WC), where P is a program and WC is a set of weak constraints, each  $M \in AS(P)$  with least violation of WC is an answer set (best model), where AS(P) = set of answer sets of P.

Semantics via aggregated violation cost ( $WC = \{wc_1, \dots, wc_n\}$ ):

```
wc: \sim b_1, \ldots, b_k, \text{ not } b_{k+1}, \ldots, \text{ not } b_m. [Weight: Level]
```

- as usual, consider the grounding grnd(wc) of wc
- Interpretation I violates a ground wc  $(I \not\models wc)$ , if  $\{b_1, \ldots, b_k\} \subseteq I$ and  $I \cap \{b_{k+1}, \ldots, b_m\} = \emptyset$

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- The cost of I at level  $\ell$  is

$$c(I,\ell) = \sum_{i=1}^{n} \sum_{(\theta,w) \in \mathcal{V}_i(I,\ell)} w$$
,

where

$$\mathcal{V}_i(I,\ell) = \{(\theta, w) \mid wc_i\theta = :\sim B. \ [w,\ell] \in grnd(wc_i), I \not\models wc_i\theta\}$$

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- a safe  $M \in AS(P)$  dominates a safe  $M' \in AS(P)$ , if  $c(M,\ell) < c(M',\ell)$  for some  $\ell$  and  $c(M,\ell') = c(M',\ell')$  for all  $\ell' > \ell$

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- a safe  $M \in AS(P)$  is **best (optimal)**, if no  $M' \in AS(P)$  dominates M

#### Weak Constraints: Examples

#### **Example:** Default values for weights and levels

a v b. c :- b.

 $:\sim$  a.

 $:\sim$  b.

 $:\sim$  c.

### **Example:** Default values for weights and levels

```
a v b. c :- b.

:~ a.

:~ b.

:~ c.

Best model: a

Cost ([Weight:Level]): <[1:1]>
```

Answer set  $\{b, c\}$  is discarded because it violates two weak constraints!

Example: Weights vs levels

### Weights:

```
a v b.
```

 $:\sim$  a. [1:]

 $:\sim$  a. [1:]

 $:\sim$  b. [2:]

### **Example:** Weights vs levels

### Weights:

```
a v b.
  :~ a. [1:]
  :~ a. [1:]
  :\sim b. [2:]
 Best model: b
 Cost ([Weight:Level]): <[2:1]>
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Note: WC = \{wc_1, wc_2, wc_3\},\
       wc_1 =: \sim a.[1:],
        wc_2 =: \sim a.[1:],
        wc_3 =: \sim b.[2:]
```

### **Example:** Weights vs levels

### Weights:

#### a v b.

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:~ a. [1:]

 $:\sim$  b. [2:]

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Cost ([Weight:Level]): <[2:1]>

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### Note: $WC = \{wc_1, wc_2, wc_3\}$ , $wc_1 =: \sim a.[1:],$

 $wc_2 =: \sim a.[1:],$ 

 $wc_3 =: \sim b.[2:]$ 

#### Levels:

a v b1 v b2.

:~ a. [:1]

 $:\sim$  b1.  $\lceil:2\rceil$ 

 $:\sim b2. [:2]$ 

#### **Example:** Weights vs levels

### Weights:

```
a v b.
:~ a. [1:]
```

:~ a. [1:]

 $:\sim b. [2:1]$ 

Best model: b

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a v b1 v b2.

:~ a. [:1]  $:\sim$  b1.  $\lceil:2\rceil$ 

 $:\sim b2. [:2]$ 

Best model: a

Cost ([Weight:Level]): <[1:1],[0:2]>

### Weak Constraints with Levels

Levels express the relative importance of the requirements.

**Example:** Divide employees in two project groups  $p_1$  and  $p_2$ 

- 1. Skills of group members should be different
- 2. Persons in the same group should not be married to each other
- 3. Members of a group should possibly know each other

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### Weak Constraints with Levels

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Requirement (3) is less important than (1) and (2)

```
assign(X,p1) v assign(X,p2) :- employee(X).

:~ assign(X,P), assign(Y,P), X!=Y, same_skill(X,Y). [:2]
:~ assign(X,P), assign(Y,P), X!=Y, married(X,Y). [:2]
:~ assign(X,P), assign(Y,P), X!=Y, not know(X,Y). [:1]
```

## Weak Constraints with Weights

- A single weak constraint in some layer n is more important than all weak constraints in lower layers (n-1, n-2, ...) together!
- Weak constraints are weighted to make finer distinctions among elements of the same priority: :~ B1.[3.5:1] :~ B2.[4.6:1]
- The weights of violated weak constraints are summed up for each layer.

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- The weights of violated weak constraints are summed up for each layer.

#### **Example:** High School Time Tabling Problem

Structural Requirements > Pedagogical Requirements > Personal Wishes.

# **Example: Traveling Salesperson (TSP)**

**Input:** a directed graph represented by node(\_), straight connections

 $edge(_{-,-,-})$  and a starting node  $start(_{-})$ .

**Problem:** find a cheapest roundtrip beginning at the starting node



# **Example: Traveling Salesperson (TSP)**

Input: a directed graph represented by node(\_), straight connections  $edge(_{-},_{-},_{-})$  and a starting node  $start(_{-})$ . find a cheapest roundtrip beginning at the starting node Problem:

```
inPath(X,Y) v outPath(X,Y) := edge(X,Y). Guess
:-inPath(X,Y ), inPath(X,Y1 ), Y != Y1.
:-inPath(X,Y ), inPath(X1,Y ), X != X1. Check
:-node(X), notreached(X).
:-not start_reached.<sup>2</sup>
reached(X):-start(X).
reached(X):-reached(Y), inPath(Y,X ).
start_reached :- start(Y), inPath(X,Y).
```

<sup>&</sup>lt;sup>2</sup>This line is added, since the trip must be round.

# **Example: Traveling Salesperson (TSP)**

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Input:
           a directed graph represented by node(_), straight connections
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Problem:
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    inPath(X,Y,C) v outPath(X,Y,C) : -edge(X,Y,C). } Guess
    :-inPath(X,Y,C), inPath(X,Y1,C1), Y != Y1.
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    :-node(X), notreached(X).
    :-not start_reached.<sup>2</sup>
    reached(X):-start(X).
    reached(X):-reached(Y), inPath(Y,X,C).
    start_reached :- start(Y), inPath(X,Y,C).
    :\sim inPath(X,Y,C).[C:1]
                                       Optimize
```

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# **Example: Minimum Spanning Tree**

```
Input:
                 A directed graph represented by node(_), weighted
                 edges edge(\_,\_,\_) and a starting node start(\_).
Problem:
                 Find a minium spanning tree with root at the starting node
      inTree(X,Y ) v outTree(X,Y ) :- edge(X,Y ). } Guess
      \label{eq:check}  \begin{array}{ll} \text{:-inTree(X,Y)}, & \text{start(Y).} \\ \text{:-inTree(X,Y)}, & \text{inTree(X1,Y)}, & \text{X != X1.} \\ \text{:-node(X)}, & \text{not reached(X).} \end{array} \right\} \textbf{Check}
      reached(X):-start(X).
reached(X):-reached(Y), inTree(Y,X ).
Auxiliary Def.
```

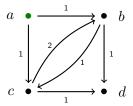
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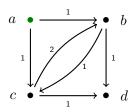
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            Find a minium spanning tree with root at the starting node
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    inTree(X,Y,C) v outTree(X,Y,C) :- edge(X,Y,C). } Guess
    :-inTree(X,Y,C), start(Y).
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    :-node(X), not reached(X).
    reached(X):-start(X).
reached(X):-reached(Y), inTree(Y,X,C).
Auxiliary Def.
    reached(X):-start(X).
    :\sim \text{inPath}(X,Y,C).[C:1]
                                           Optimize
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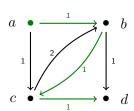
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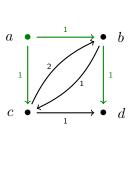


```
P_D = \{node(a), node(b),
        node(c), node(d),
        edge(a, b, 1), edge(a, c, 1)
        edge(c, b, 2), edge(b, c, 1)
        edge(b, d, 1), edge(c, d, 1)
        start(a)
```

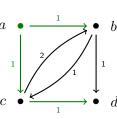
# **Example: Minimum Spanning Tree (ctd.)**







$$\begin{split} P_D &= \{node(a), node(b), \\ &node(c), node(d), \\ &edge(a,b,1), edge(a,c,1) \\ &edge(c,b,2), edge(b,c,1) \\ &edge(b,d,1), edge(c,d,1) \\ &start(a) \} \end{split}$$



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  - aggregates as first-class citizen: need no auxiliary computations
    - linear ordering, successor relation, smallest and largest element, and
    - recursion needed to count the employees
  - challenging: semantics of aggregates (problem: recursion)
- we consider non-recursive aggregates, DLV (general: ASP-Core2)

# Symbolic Set

### Symbolic Set Expression

 $\{Vars: Conj\}$ 

#### where

- Vars is a set of variables, and
- *Conj* is a conjunction of standard literals, i.e., literals and default negated literals.

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```
Example: {S,X : empl(X,S)}
```

**Informal Meaning:** The set of ids and salaries of all employees, i.e.,

- for a set of standard literals (an interpretation)  $I = \{empl(1, 2200), empl(2, 1800)\},$
- the symbolic set above represents a set of tuples  $S = \{\langle 2200, 1 \rangle, \langle 1800, 2 \rangle\}.$

## **Aggregate Functions**

### Aggregate Function Expression

 $f\{S\}$ 

#### where

- S is a symbolic set, and
- f is a function among {#count, #sum, #times, #min, #max}

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**Informal Meaning:** The sum of salaries of all employees.

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```
Example: \#sum{S,X : empl(X,S)}
```

**Informal Meaning:** The sum of salaries of all employees.

- #count returns the cardinality of the symbolic set;
- the other functions apply to the multiset of the elements in the symbolic set projected to the first component.

## Aggregate Functions, cont'd

#### Identical Projections

Note:

$$\#sum\{S: empl(X,S)\} \neq \#sum\{S,X: empl(X,S)\}$$

as identical projections S of different elements count multiple times

## Aggregate Functions, cont'd

#### Identical Projections

Note:

$$\#sum{S : empl(X,S)} \neq \#sum{S,X : empl(X,S)}$$

as identical projections S of different elements count multiple times for  $S=\emptyset$  :

- #sum returns 0
- #times returns 1
- #min and #max undefined

# **Aggregate Atoms**

### Aggregate Atom Syntax

$$Lg <_1 f\{S\} <_2 Rg$$

#### where

- Lq and Uq are terms, called left guard and right guard, respectively,
- and  $<_1, <_2$  in  $\{=, <, \le, >, \ge\}$ ;
- one of the guards can be omitted (assuming "0 <" and " $< +\infty$ "

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- one of the guards can be omitted (assuming " $0 \le$ " and " $\le +\infty$ "

**Example:**  $\#sum{S, X : empl(X, S)} < 3800$ 

**Informal Meaning:** True if sum of salaries  $\leq 3800$ , false otherwise.

 If the argument of an aggregate function does not belong to its domain, then false and warning.

## **Aggregate Atom: Common Mistakes**

Let pay(transaction, person, value) represent a payment, consider:  $\{pay(t1, p1, 5), pay(t2, p1, 8), pay(t3, p1, 5), pay(t4, p2, 10), pay(t5, p2, 20)\}$ . Task: Compute the sum of payments for each person.

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```
• Correct: sum(P,S):-person(P), S = \#sum\{V,T:pay(T,P,V)\}; symbolic set is \{\langle 5, t1 \rangle, \langle 8, t2 \rangle, \langle 5, t3 \rangle\} for p1 \Rightarrow sum(p1, 18); symbolic set is \{\langle 10, t2 \rangle, \langle 20, t2 \rangle\} for p2 \Rightarrow sum(p2, 30).
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- Mistake 3:  $sum(S) := S = \#sum\{V, P : pay(T, P, V)\};$  symbolic set is  $\{\langle 5, p1 \rangle, \langle 8, p1 \rangle, \langle 10, p2 \rangle, \langle 20, p2 \rangle\}$ , persons merged.

#### **Safety**

- Variables that appear solely in aggregate functions are called local variables.
  - Additional safety requirements:
    - Each local variable in {Vars : Conj} also appears in a positive literal in Conj.
    - Each global variable also appears
      - in a non-comparison, non-aggregate, not-free literal in the body; or
      - as a guard of an assignment aggregate atom  $X=f\{S\},\ f\{S\}=X,$  or  $X=f\{S\}=X,$  respectively
  - Each guard of an aggregate atom is either a constant or a global variable.

#### **Semantics of Programs with Aggregates**

#### Generalized Gelfond-Lifschitz Reduct

Given a set M of literals and a ground program P, the reduct (or Gelfond-Lifschitz reduct)  $P^M$  is now as follows:

- remove rules from P
  - with not a in the body, such that a is true wrt. M, or
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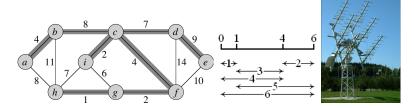
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- recursion through aggregates: use instead GL-reduct  $P^M$  the FLP-reduct  $fP^M = \{r \in P \mid r = H \leftarrow B, M \models B\};$ that is, keep the rules r whose bodies are satisfied.

## DLV Usage: Examples



# Example: Minimum Spanning Tree Using Aggregates

#### Minimum spanning tree (with aggregates and weak constraints)

```
% Guess the edges that are part of the tree. inTree(X,Y,C) v outTree(X,Y,C) :- edge(X,Y,C).
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#### Minimum spanning tree (with aggregates and weak constraints)

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% Guess the edges that are part of the tree.
inTree(X,Y,C) v outTree(X,Y,C) :- edge(X,Y,C).

% Check that we are really dealing with a tree!
:- start(R), not #count{X : inTree(X,R,C)} = 0.
:- edge(_,Y,_), not start(Y),
   not #count{X : inTree(X,Y,C)} = 1.

% Note: ensures also that each node
% in the graph is reached.
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:- edge(_{-},Y,_{-}), not start(Y),
   not \#count\{X : inTree(X,Y,C)\} = 1.
% Note: ensures also that each node
% in the graph is reached.
% Nothing in life is free..
% pay for every edge that is in the solution
\sim inTree(X,Y,C). [C:1]
```

- people liking each other should sit at the same table, and
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```
at(P,T) v not_at(P,T) :- person(P), table(T).
```

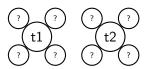
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```
at(P,T) v not_at(P,T) :- person(P), table(T).
:- table(T), nchairs(C), not#count(P : at(P,T)) <= C.</pre>
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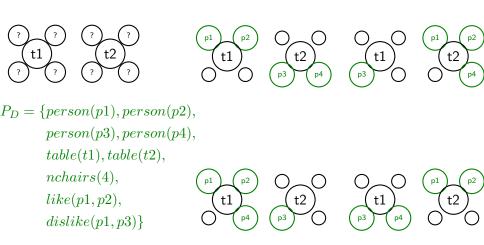
```
at(P,T) v not_at(P,T) :- person(P), table(T).
:- table(T), nchairs(C), not#count{P : at(P,T)} <= C.
:- person(P), not #count{T : at(P,T)} = 1.
:- like(P1,P2), at(P1,T), not at(P2,T).
:- dislike(P1,P2), at(P1,T), at(P2,T).</pre>
```

#### Example: Seating Problem, cont'd



```
P_D = \{person(p1), person(p2), \\ person(p3), person(p4), \\ table(t1), table(t2), \\ nchairs(4), \\ like(p1, p2), \\ dislike(p1, p3)\}
```

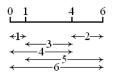
#### **Example: Seating Problem, cont'd**



## **Example: Optimal Golomb Ruler (OGR)**

**Problem:** Place a given number of marks on a ruler, such that no two pairs of marks measure the same distance, and the length of the ruler is minimal.

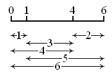
Applications: antenna design, mobile communication technology





## **Example: Optimal Golomb Ruler (OGR)**

**Problem:** Place a given number of marks on a ruler, such that no two pairs of marks measure the same distance, and the length of the ruler is minimal.



Applications: antenna design, mobile communication technology



% Example input for an OGR of size 4
position(0..10).
mark(1..4).

```
% The position 0 is always used, % a position is used if a mark is placed on it. used(0).
```

```
% Guess the other positions. free(P) v used(P) :- position(P).
```

```
% a position is used if a mark is placed on it.
used(0).
% Guess the other positions.
free(P) v used(P) :- position(P).
% Exactly N used positions, where N is the number of marks.
num(N) :- #count{M : mark(M)} = N.
:- num(N), not #count{P : used(P)} = N.
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num(N) :- #count{M : mark(M)} = N.
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% For each used position P1, compute distance
% with each successive used position P2.
d(P1,D) :- used(P1), used(P2), P1 < P2, D = P2 - P1.</pre>
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:- num(N), not \#count\{P : used(P)\} = N.
% For each used position P1, compute distance
% with each successive used position P2.
d(P1,D) := used(P1), used(P2), P1 < P2, D = P2 - P1.
% Discard models in which more than one pair
% of used positions have the same distance.
:- d(P1,D), d(P2,D), P1 < P2.
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d(P1,D) := used(P1), used(P2), P1 < P2, D = P2 - P1.
% Discard models in which more than one pair
% of used positions have the same distance.
:= d(P1.D), d(P2.D), P1 < P2.
% Find the maximum used position P.
non_maxused(P1) := used(P1), used(P2), P1 < P2.
maxused(P) :- used(P), not non_maxused(P).
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non_maxused(P1) := used(P1), used(P2), P1 < P2.
maxused(P): - used(P), not non maxused(P).
% Minimize the cost of the solution.
\sim \text{maxused(P)}. [P:1]
```

#### **Example: Optimal Golomb Ruler (OGR) Variants**

More elegant: use the #max aggregate atom to find the maximum used position:

```
% Minimize the cost of the solution,
% i.e.,the value of the largest used position.
:~ #int(P1), P1 = #max{P:used(P)}. [P1:]
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Program output for both variants (run with option -filter=used):
Best model: used(0), used(2), used(5), used(6)
Cost ([Weight:Level]): <[6:1]>
Best model: used(0), used(1), used(4), used(6)
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Best model: used(0), used(1), used(4), used(6)
Cost ([Weight:Level]): <[6:1]>
```

Best model: used(0), used(2), used(5), used(6)

Results are by chance perfect optimal Golomb Rulers (i.e., no gaps in the sequence of all occurring distances).

**Exercise:** Which additional constraint would be needed to ensure only perfect optimal Golomb Rulers to be calculated?

#### Overview: DLV Extensions

- DLV-Complex extension of DLV with function symbols, lists and sets fully integrated into DLV since release 2010-10-14
  - dlvex an extension of DLV providing access to "external predicates" which are supplied via libraries
  - dlvhex a system for ASP with external computation sources

http://www.kr.tuwien.ac.at/research/systems/dlvhex/ http://www.kr.tuwien.ac.at/research/systems/dlvhex/demo.php

- enables queries to Description Logic KBs in rules
- DLT extends DLV with reusable template predicate definitions
- $\overline{DLV}$ DB an extension of  $\overline{DLV}$ with a tight coupling to relational DBs
  - native DLV offers an ODBC interface
  - NLP-DL a coupling of ASP programs with Description Logics https://www.mat.unical.it/ianni/swlp/index.html

## Summary

- 1. The DLV system
  - DLV syntax
  - Rule safety
  - Built-in predicates
- 2. Weak constraints
  - Weights
  - Levels
- 3. Aggregates
  - Symbolic sets
  - · Aggregate functions
- 4. DLV usage: Examples
- 5. DIV extensions

#### **Software Engineering Issues**

- Software engineering tools for ASP are subject of ongoing research IDEs: ASPIDE<sup>3</sup>, SeaLion<sup>4</sup>
- Particular problem: debugging
- What to do if my program does not have (intended) answer sets?
- Some naive suggestions:
  - Decompose: divide & conquer
  - Use small/specific instances for testing
  - · Test constraints one by one
  - Check auxiliary predicates separately
- Support for debugging: e.g. Spock<sup>5</sup>



<sup>3</sup>www.mat.unical.it/~ricca/aspide/

<sup>4</sup>www.kr.tuwien.ac.at/research/projects/mmdasp/#Software

<sup>5</sup>www.kr.tuwien.ac.at/research/systems/debug/index.html

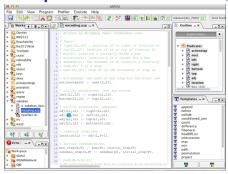
Appendix References

## **ASP Integrated Development Environments (IDEs)**

IDE: ease programming for both novice and skilled developers

- SEA LION [Busoniu et al., 2013]
  - first environment offering debugging for non-ground programs
  - unique tools for model-based engineering (ER diagrams), testing via annotations, and bi-directional visualization of interpretations.
- ASPIDE [Febbraro et al., 2011]
  - comprehensive framework integrating several tools for advanced program composition and execution.
  - test-driven software development in the style of JUnit, e.g.
    - dependency graph visualizer, designed to inspect predicate dependencies and browsing the program,
    - debugger (Dodaro et al. 2015),
    - DLV profiler,
    - ARVis comparator of answer sets,
    - answer set visualizer IDPDraw.
    - data source plugin for JDBC connectivity

#### ASP Development Environments, cont'd



- ASPIDE is extensible
- user can provide new plugins:
  - new input formats
  - new program rewritings
  - customizing the visualization/output format of solver results
- more information: See RR 2013 tutorial

https://www.mat.unical.it/ricca/downloads/rr2013-tutorial.pdf

#### References I



Sealion: An eclipse-based IDE for answer-set programming with advanced debugging support.

TPLP, 13(4-5):657-673, 2013.

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