## **5.298** smooth

DESCRIPTION LINKS GRAPH AUTOMATON

Origin Derived from change.

Constraint smooth(NCHANGE, TOLERANCE, VARIABLES)

Arguments NCHANGE : dvar

TOLERANCE : int

VARIABLES : collection(var-dvar)

**Restrictions**  $NCHANGE \ge 0$ 

NCHANGE < |VARIABLES|

 $\mathtt{TOLERANCE} \geq 0$ 

required(VARIABLES, var)

Purpose

NCHANGE is the number of times that |X-Y|> TOLERANCE holds; X and Y correspond to consecutive variables of the collection VARIABLES.

Example

 $(1, 2, \langle 1, 3, 4, 5, 2 \rangle)$ 

In the example we have one change between values 5 and 2 since the difference in absolute value is greater than the tolerance (i.e., |5-2|>2). Consequently the NCHANGE argument is fixed to 1 and the smooth constraint holds.

**Symmetries** 

- Items of VARIABLES can be reversed.
- One and the same constant can be added to the var attribute of all items of VARIABLES.

Usage

This constraint is useful for the following problems:

- Assume that VARIABLES corresponds to the number of people that work on consecutive weeks. One may not normally increase or decrease too drastically the number of people from one week to the next week. With the smooth constraint you can state a limit on the number of drastic changes.
- Assume you have to produce a set of orders, each order having a specific attribute.
  You want to generate the orders in such a way that there is not a too big difference
  between the values of the attributes of two consecutive orders. If you can't achieve
  this on two given specific orders, this would imply a set-up or a cost. Again, with the
  smooth constraint, you can control this kind of drastic changes.

Algorithm

A first incomplete algorithm is described in [29]. The sketch of a filtering algorithm for the conjunction of the smooth and the stretch constraints based on dynamic programming achieving arc-consistency is mentioned by Lars Hellsten in [184, page 60]. An arc-consistency algorithm in linear time of the sum of domain sizes is described in [47].

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See also common keyword: change (number of changes in a sequence with respect to a binary

constraint).

related: distance.

Keywords characteristic of a constraint: automaton, automaton with counters,

non-deterministic automaton, non-deterministic automaton.

**constraint network structure:** sliding cyclic(1) constraint network(2),

Berge-acyclic constraint network.

**constraint type:** timetabling constraint.

filtering: dynamic programming, arc-consistency.

modelling: number of changes.modelling exercises: n-Amazon.

puzzles: n-Amazon.

Arc input(s)	VARIABLES
Arc generator	$PATH \mapsto collection(variables1, variables2)$
Arc arity	2
Arc constraint(s)	${\tt abs(variables1.var-variables2.var)} > {\tt TOLERANCE}$
Graph property(ies)	NARC= NCHANGE

## Graph model

Parts (A) and (B) of Figure 5.536 respectively show the initial and final graph associated with the **Example** slot. Since we use the **NARC** graph property, the unique arc of the final graph is stressed in bold.

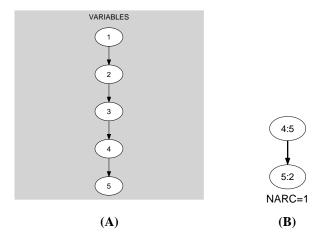


Figure 5.536: Initial and final graph of the smooth constraint

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Automaton

Figure 5.537 depicts a first automaton that only accepts all the solutions of the smooth constraint. This automaton uses a counter in order to record the number of satisfied constraints of the form  $(|VAR_i - VAR_{i+1}|) > TOLERANCE$  already encountered. To each pair of consecutive variables  $(VAR_i, VAR_{i+1})$  of the collection VARIABLES corresponds a 0-1 signature variable  $S_i$ . The following signature constraint links  $VAR_i$ ,  $VAR_{i+1}$  and  $S_i$ :  $(|VAR_i - VAR_{i+1}|) > TOLERANCE \Leftrightarrow S_i = 1$ .

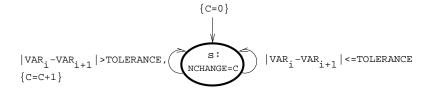


Figure 5.537: Automaton (with a counter) of the smooth constraint

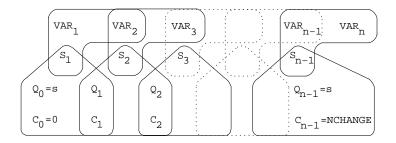


Figure 5.538: Hypergraph of the reformulation corresponding to the automaton (with a counter) of the smooth constraint

Since the reformulation associated with the previous automaton is not Berge-acyclic, we now describe a second counter free automaton that also only accepts all the solutions of the smooth constraint. Without loss of generality, assume that the collection of variables VARIABLES contains at least two variables (i.e.,  $|VARIABLES| \ge 2$ ). Let n, min, max, and  $\mathcal D$  respectively denote the number of variables of the collection VARIABLES, the smallest value that can be assigned to the variables of VARIABLES, the largest value that can be assigned to the variables of VARIABLES, and the union of the domains of the variables of VARIABLES. Clearly, the maximum number of changes (i.e., the number of times the constraint ( $|VAR_i - VAR_{i+1}|$ ) > TOLERANCE ( $1 \le i < n$ ) holds) cannot exceed the quantity  $m = \min(n-1, \overline{NCHANGE})$ . The  $(m+1) \cdot |\mathcal D| + 2$  states of the automaton that only accepts all the solutions of the smooth constraint are defined in the following way:

- We have an initial state labelled by  $s_I$ .
- We have  $m \cdot |\mathcal{D}|$  intermediate states labelled by  $s_{ij}$   $(i \in \mathcal{D}, j \in [0, m])$ . The first subscript i of state  $s_{ij}$  corresponds to the value currently encountered. The second subscript j denotes the number of already encountered satisfied constraints of the form  $(|VAR_k VAR_{k+1}|) > TOLERANCE$  from the initial state  $s_I$  to the state  $s_{ij}$ .
- We have a final state labelled by  $s_F$ .

Four classes of transitions are respectively defined in the following way:

- 1. There is a transition, labelled by i from the initial state  $s_I$  to the state  $s_{i0}$ ,  $(i \in \mathcal{D})$ .
- 2. There is a transition, labelled by j, from every state  $s_{ij}$ ,  $(i \in \mathcal{D}, j \in [0, m])$ , to the final state  $s_F$ .
- 3.  $\forall i \in \mathcal{D}, \ \forall j \in [0, m], \ \forall k \in \mathcal{D} \cap [\max(\min, i \texttt{TOLERANCE}), \min(\max, i + \texttt{TOLERANCE})]$  there is a transition labelled by k from  $s_{ij}$  to  $s_{kj}$  (i.e., the counter j does not change for values k that are too closed from value i).
- 4.  $\forall i \in \mathcal{D}, \ \forall j \in [0, m-1], \ \forall k \in \mathcal{D} \smallsetminus [\max(\min, i \texttt{TOLERANCE}), \min(\max, i + \texttt{TOLERANCE})]$  there is a transition labelled by k from  $s_{ij}$  to  $s_{kj+1}$  (i.e., the counter j is incremented by +1 for values k that are too far from i).

We have  $|\mathcal{D}|$  transitions of type 1,  $|\mathcal{D}| \cdot (m+1)$  transitions of type 2, and at least  $|\mathcal{D}|^2 \cdot m$  transitions of types 3 and 4. Since the maximum value of m is equal to n-1, in the worst case we have at least  $|\mathcal{D}|^2 \cdot (n-1)$  transitions. This leads to a worst case time complexity of  $O(|\mathcal{D}|^2 \cdot n^2)$  if we use Pesant's algorithm for filtering the regular constraint [275].

Figure 5.539 depicts the corresponding counter free non deterministic automaton associated with the smooth constraint under the hypothesis that (1) all variables of VARIABLES are assigned a value in  $\{0,1,2,3\}$ , (2) |VARIABLES| is equal to 4, and (3) TOLERANCE is equal to 1.

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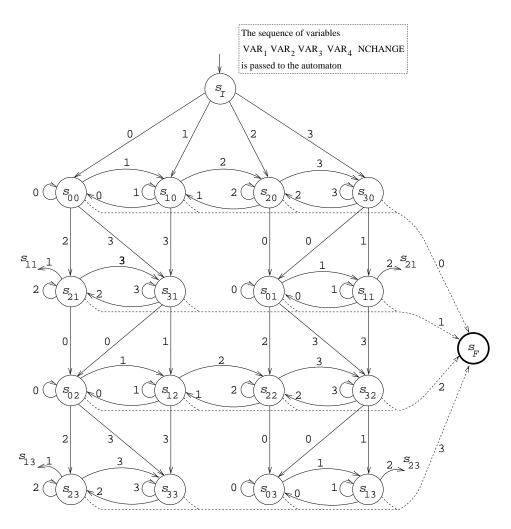


Figure 5.539: Counter free non deterministic automaton of the smooth(NCHANGE,  $1, \langle \text{VAR}_1, \text{VAR}_2, \text{VAR}_3, \text{VAR}_4 \rangle)$  constraint assuming  $\text{VAR}_i \in [0,3]$   $(1 \leq i \leq 3)$ , with initial state  $s_I$  and final state  $s_F$