

Topic 10: Propagation for a DISTINCT Constraint¹

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Pierre Flener

ASTRA Research Group
on Combinatorial Optimisation
Uppsala University
Sweden

Course 1DL441:
Combinatorial Optimisation using
Constraint Programming

¹Based also on some material by Christian Schulte



Outline

Prelude

The DISTINCT
Predicate

Naïve DC
Propagation

Efficient DC
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Domain Consistency Revisited

All solutions to the constraint need to be considered:

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- A naïve propagator, computing first all solutions, takes too much time and space. Recall Topic 3: the store $\{x \mapsto \{2, \dots, 7\}, y \mapsto \{0, 1, 2\}, z \mapsto \{-1, \dots, 2\}\}$ has solutions $\langle 3, 1, 0 \rangle, \langle 5, 0, 1 \rangle, \langle 6, 2, 0 \rangle$ to $x = 3 \cdot y + 5 \cdot z$; hence $\{x \mapsto \{3, 5, 6\}, y \mapsto \{0, 1, 2\}, z \mapsto \{0, 1\}\}$ is DC.
- An efficient DC propagator does in general not exist (for $\text{LINEAR}(A, X, =, d)$ it takes time exponential in $|X|$), but there exist polynomial-time DC propagators for some predicates, such as ELEMENT (☞ see Topic 6).
- Are there efficient DC propagators for more complex predicates than ELEMENT, such as DISTINCT? ☞ Yes!



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Definition

The $\text{DISTINCT}(\{x_1, \dots, x_n\})$ constraint, also known as the $\text{ALLDIFFERENT}(\{x_1, \dots, x_n\})$ constraint, has the semantics of a conjunction of $\frac{n \cdot (n-1)}{2}$ disequality constraints:

$$\text{forall}(i, j \text{ in } 1..n \text{ where } i < j)(x_i \neq x_j)$$

Example ($\text{DISTINCT}(\{u, v, w, x, y, z\})$)

From the store

$$\left\{ \begin{array}{l} u \mapsto \{0, 1\}, v \mapsto \{1, 2\}, w \mapsto \{0, 2\}, \\ x \mapsto \{1, 3\}, y \mapsto \{2, 3, 4, 5\}, z \mapsto \{5, 6\} \end{array} \right\}$$

the pink values are pruned upon DC.



Is DC Needed for DISTINCT?

Example (Golomb Rulers)

Design a ruler with n ticks such that:

- The distances between any 2 distinct ticks are distinct.
- The length of the ruler is minimal.

For $n = 6$, an optimal ruler is $[0, 1, 4, 10, 12, 17]$.

This very hard problem has applications in crystallography.

n	value consistency	domain consistency
7	950 nodes	474 nodes
8	7,622 nodes	3,076 nodes
9	55,930 nodes	16,608 nodes
10	413,922 nodes	97,782 nodes
11	6,330,568 nodes	1,448,666 nodes

Good search-tree reduction: worth looking for a propagator!



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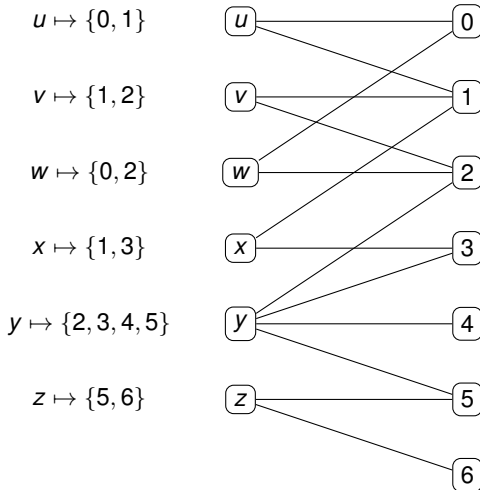
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Variable-Value Graph:

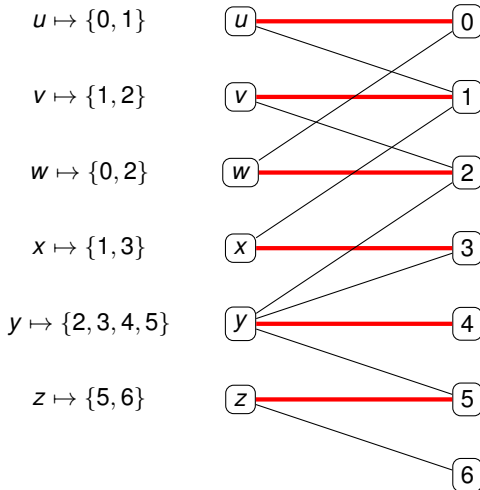
Construct from the current domains a bipartite graph:





Variable-Value Graph: Matchings Are Solutions:

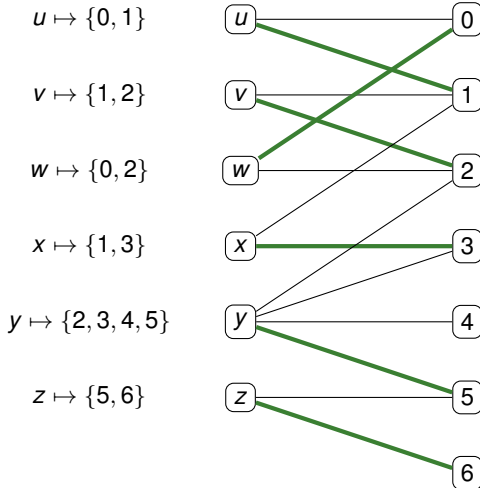
A (maximum) matching is a (maximum) subset of edges so that no vertex is incident to two of its edges. **Example 1:**





Variable-Value Graph: Matchings Are Solutions:

A (maximum) matching is a (maximum) subset of edges so that no vertex is incident to two of its edges. **Example 2:**





Naïve DC propagator:

- 1 If no maximum matching exists, then fail.
- 2 Compute all maximum matchings & mark their edges.
- 3 For every unmarked edge between a decision variable α and a value d : prune value d from $\text{dom}(\alpha)$.

But there are as many maximum matchings as solutions!

☞ We have solved the space issue, but **not** the time issue.

Matching theory to the rescue!

There is a relationship between the edges in a maximum matching and the edges in all other maximum matchings!

☞ Hence we need only compute **one** maximum matching!



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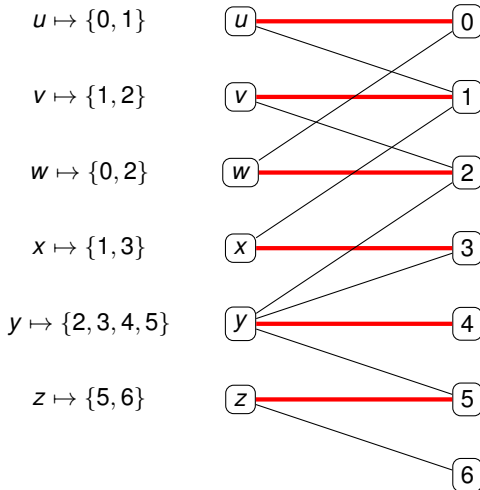
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Efficient DC propagator (Régim, 1994) (Costa, 1994):

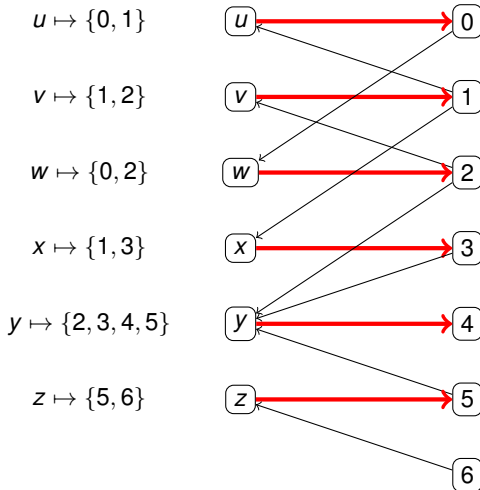
Start from a maximum matching, and orient all edges: if in matching, then from variable to value, else the other way.





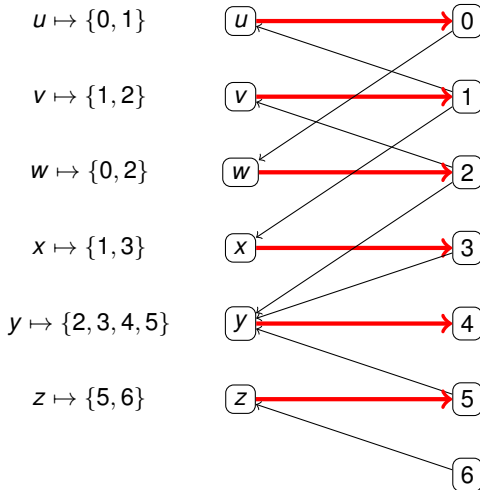
Efficient DC propagator (Régim, 1994) (Costa, 1994):

Start from a maximum matching, and orient all edges: if in matching, then from variable to value, else the other way.



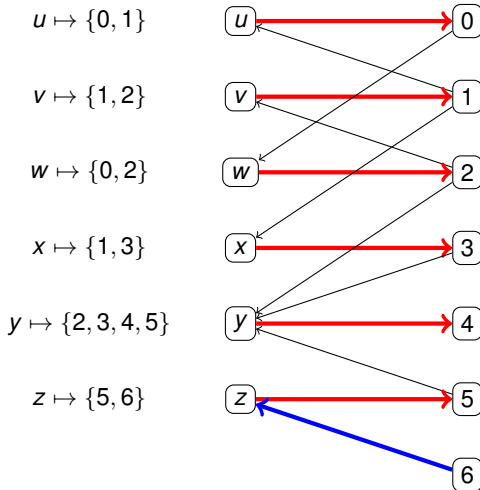


Efficient DC propagator (Régim, 1994) (Costa, 1994):
Start from all unmatched vertices (necessarily values here)
and mark all arcs on all simple paths: arcs can be flipped.



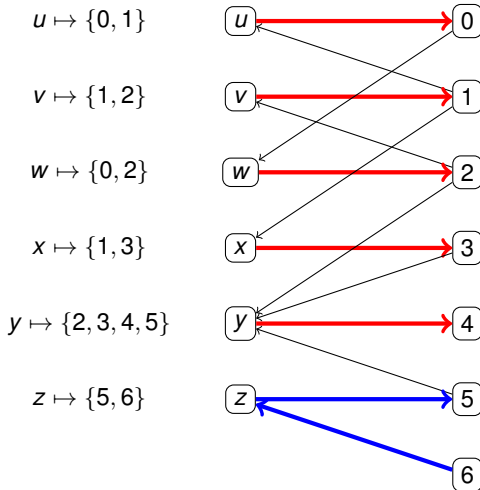


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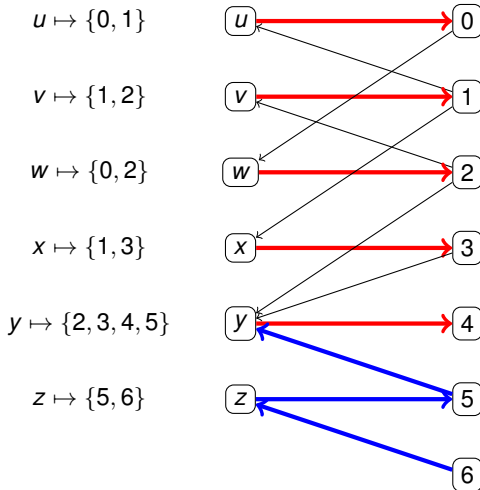


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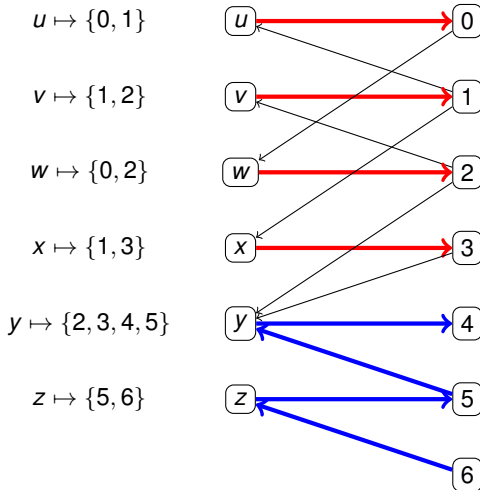


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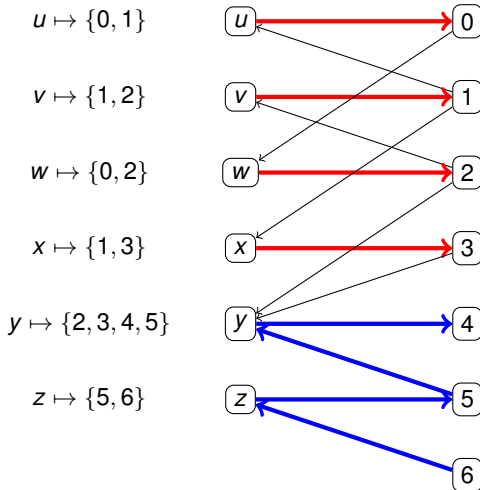


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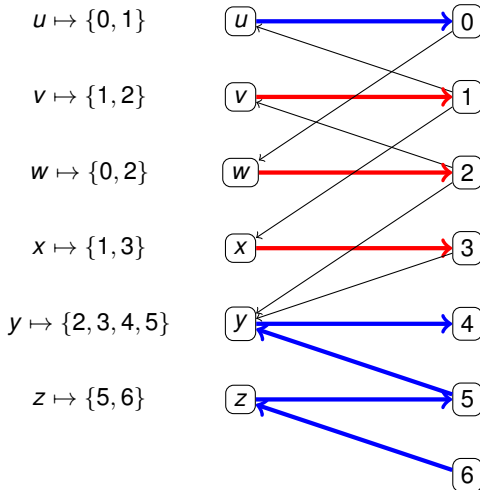


Efficient DC propagator (Régim, 1994) (Costa, 1994):
Mark all arcs in all strongly connected components (SCCs):
the variables of an SCC take all the values of that SCC.



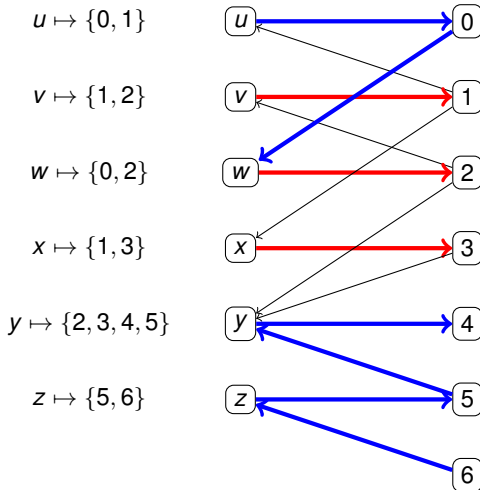


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$$u \mapsto \{0, 1\}$$



$$v \mapsto \{1, 2\}$$



$$w \mapsto \{0, 2\}$$



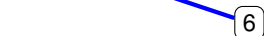
$$x \mapsto \{1, 3\}$$



$$y \mapsto \{2, 3, 4, 5\}$$

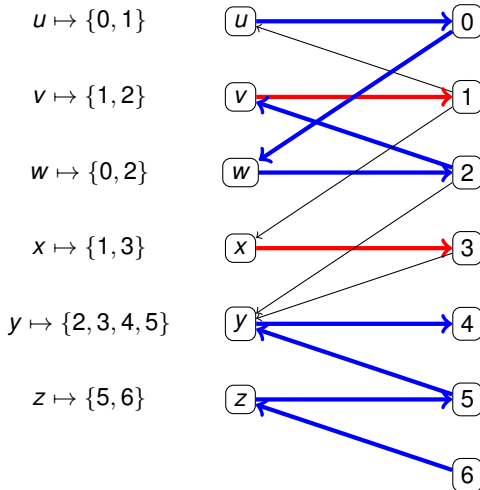


$$z \mapsto \{5, 6\}$$





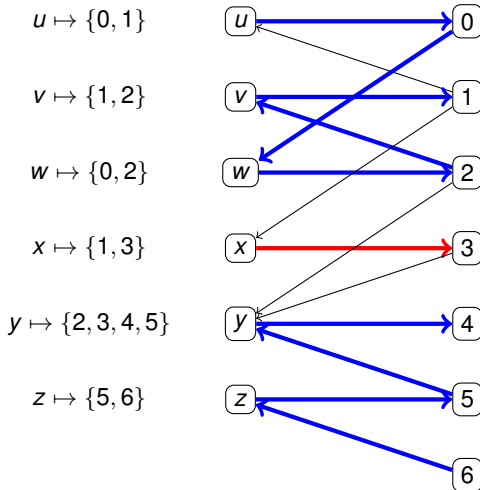
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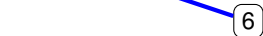
$$x \mapsto \{1, 3\}$$



$$y \mapsto \{2, 3, 4, 5\}$$



$$z \mapsto \{5, 6\}$$





Efficient DC propagator (Régim, 1994) (Costa, 1994):
Every arc that is neither **in the chosen maximum matching**
nor **marked** is in *no* maximum matching: **prune** accordingly.

$$u \mapsto \{0, 1\}$$



$$v \mapsto \{1, 2\}$$



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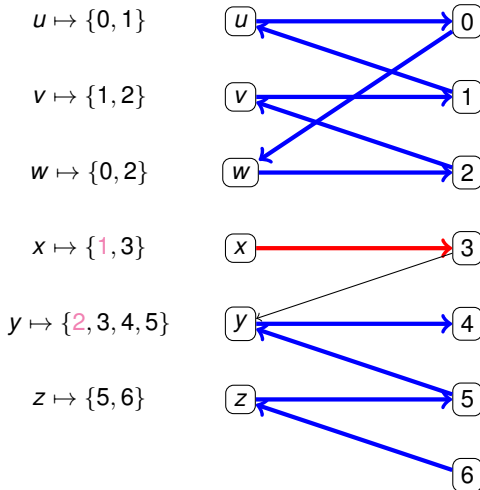


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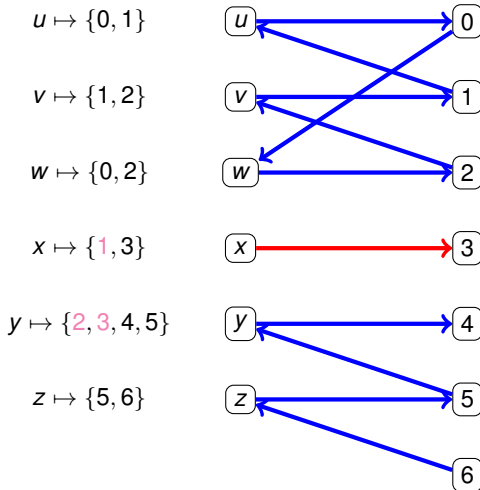


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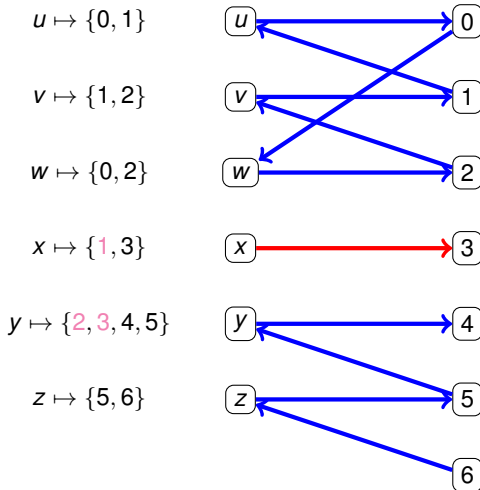


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Efficient DC propagator (Régim, 1994) (Costa, 1994):
Every arc that is **in the chosen maximum matching** but not **marked** is in *every* maximum matching: fixed variable.





Underlying Theorem from Matching Theory

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Theorem (Berge, 1970) (Petersen, 1891)

Edge e belongs to some maximum matching if and only if, for an arbitrarily chosen maximum matching M :

e belongs to a path of an even number of edges that starts at some node that is not incident to an edge of M and that alternates between edges in M and edges not in M .

or e belongs to a cycle of an even number of edges that alternates between edges in M and edges not in M (that is, the arc corresponding to e belongs to an SCC).



Complexity and Incrementality

Complexity:

The described DC propagator takes

$$\mathcal{O}(m \cdot \sqrt{n}) \text{ time and } \mathcal{O}(m \cdot n) \text{ space}$$

for n decision variables and $m \geq n$ values in their domains.

Incrementality via stateful propagator:

Keep the variable-value graph between invocations.

When the propagator is re-invoked:

- 1 Remove marks on arcs.
- 2 Remove arcs that no longer correspond to the store.
- 3 If an arc of the old maximum matching was removed, then first compute a new maximum matching.
- 4 Mark and prune.



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Is BC Needed for DISTINCT?

Propagation to BC often suffices for DISTINCT.

Example

Propagation to BC suffices to infer unsatisfiability for $\text{DISTINCT}(\{x, y, z\})$ from the store $\{x, y, z \mapsto \{4, 5\}\}$.

Efficient BC propagators:

There are BC propagators that take $\mathcal{O}(n \cdot \lg n)$ time:

- Puget @ AAI 1998
- Mehlhorn and Thiel @ CP 2000
- López-Ortiz, Quimper, Tromp, van Beek @ IJCAI 2003

The latter two run in $\mathcal{O}(n)$ time if sorting can be avoided, say when there are as many values as decision variables.



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Régin, Jean-Charles.
A filtering algo. for constraints of difference in CSPs.
AAAI 1994, pages 362 – 367, 1994.



Costa, Marie-Christine.
Persistency in maximum cardinality bipartite matchings.
Operations Research Letters, 15(3):143 – 149, 1994.



Berge, Claude.
Graphes et Hypergraphes. Dunod, 1970.



Petersen, Julius.
Die Theorie der regulären graphs.
Acta Mathematica, 15(1):193 – 220, 1891.



van Hoeve, Willem-Jan.
The Alldifferent Constraint: A Survey.
Extended from the version in *ERCIM Workshop 2001*.