# On the complexity and completeness of static constraints for breaking row and column symmetry, CP 2010

George Katsirelos, Nina Narodytska, and Toby Walsh.

December 7, 2010

Presented by Jenny Lam



#### Introduction

Overview of the Paper What is Symmetry Breaking?

#### **Definitions**

Variable and Value Symmetry Row and Column Symmetry

#### Symmetry Breaking

DoubleLex RowWiseLexLeader SnakeLex

## Overview of the Paper

(CP 2010)

Title On the Complexity and Completeness of Static Constraints for Breaking Row and Column Symmetry Authors George Katsirelos, Nina Narodytska, and Toby Walsh Submitted arXiv: July 5, 2010

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Principles and Practice of Constraint Programming

# What is Symmetry Breaking?

#### Motivations

- prune the search space
- eliminate redundant solutions
- retain one solution per symmetry class

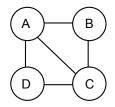
#### Concerns

- checking satisfaction can be NP-hard
- enforcing domain-consistency (DC) can be NP-hard
- more than one solution may be retained

### 4-color problem

▶ Domains: r, b, g, y

► Constraints: different color

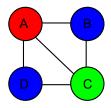


### 4-color problem

- ▶ Domains: r, b, g, y
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## Symmetric solutions

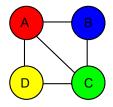
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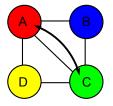
- ightharpoonup (r, b, g, b),
- ightharpoonup (r, b, g, y)



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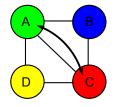
- ightharpoonup (r, b, g, b),
- (r, b, g, y)
- ► (*AC*):



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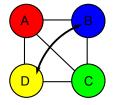
- ightharpoonup (r, b, g, b),
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- ► (*AC*): (*g*, *b*, *r*, *y*)



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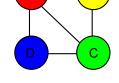
- ightharpoonup (r, b, g, b),
- ightharpoonup (r, b, g, y)
- ► (*AC*): (*g*, *b*, *r*, *y*)
- ▶ (BD):



### 4-color problem

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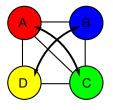
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- ▶ Domains: r, b, g, y
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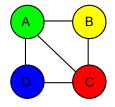
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- ► (*AC*)(*BD*):



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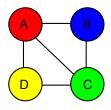
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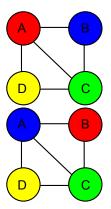
## Symmetric solutions

- $\triangleright$  (r, b, g, y)
- ► (*rb*):



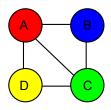
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- $\triangleright$  (r, b, g, y)
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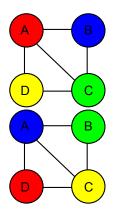
## Symmetric solutions

- ightharpoonup (r, b, g, y)
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- ▶ (*rbgy*):



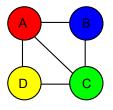
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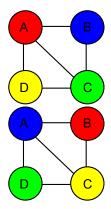
#### Symmetric solutions

- $\triangleright$  (r, b, g, y)
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- ► (*rbgy*): (*b*, *g*, *y*, *r*)
- ► (*rb*)(*gy*):



#### Symmetric solutions

- $\triangleright$  (r, b, g, y)
- ightharpoonup (rb): (b, r, g, y)
- ► (*rbgy*): (*b*, *g*, *y*, *r*)
- ▶ (rb)(gy): (b, r, y, g)



# Variable and Value Symmetry: Definitions

Let (X, D, C) be a CSP such that each variable  $x \in X$  has the same domain D.

## Variable Symmetry

a bijection  $\sigma:X\to X$  of the variables that preserves solutions

$$\{X_i = a_i \mid i \in [1, n]\} \implies \{X_i = a_{\sigma(i)} \mid i \in [1, n]\}$$

#### Value Symmetry

a bijection  $\tau:D\to D$  of the values that preserves solutions

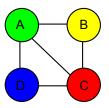
$${X_i = a_i \mid i \in [1, n]} \implies {X_i = \tau(a_i) \mid i \in [1, n]}$$

#### The LEXLEADER constraint

#### A solution satisfies LexLeader if

- of all solutions obtained by symmetry
- ▶ it is the smallest lexicographically.

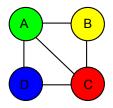
Does (g, y, r, b) satisfy LexLeader?



Does (g, y, r, b) satisfy LexLeader?

fix the variable ordering

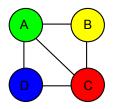
▶ Order: (*A*, *B*, *C*, *D*)



Does (g, y, r, b) satisfy LexLeader?

find all symmetric solutions

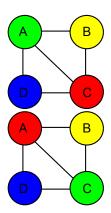
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Does (g, y, r, b) satisfy LexLeader?

#### find all symmetric solutions

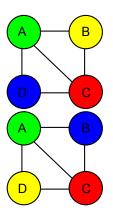
- ▶ Order: (*A*, *B*, *C*, *D*)
- $\blacktriangleright (AC) \Rightarrow (r, y, g, b)$



Does (g, y, r, b) satisfy LexLeader?

#### find all symmetric solutions

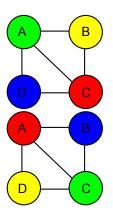
- ▶ Order: (*A*, *B*, *C*, *D*)
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Does (g, y, r, b) satisfy LexLeader?

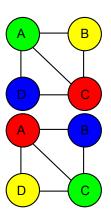
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- $ightharpoonup (AC) \Rightarrow (r, y, g, b)$
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- $(AC)(BD) \Rightarrow (r, b, g, y)$



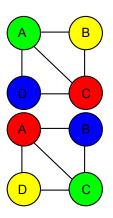
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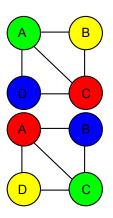
Does (g, y, r, b) satisfy LexLeader?

- ▶ Order: (*A*, *B*, *C*, *D*)
- $(g, y, r, b) \leq_{\mathsf{lex}} (r, y, g, b) \checkmark$
- $\triangleright$  (BD)  $\Rightarrow$  (g, b, r, y)
- $(AC)(BD) \Rightarrow (r, b, g, y)$



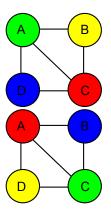
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- $\triangleright$   $(g, y, r, b) \leq_{\mathsf{lex}} (g, b, r, y) \times$
- $(AC)(BD) \Rightarrow (r, b, g, y)$



Does (g, y, r, b) satisfy LexLeader?

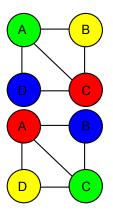
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Does (g, y, r, b) satisfy LexLeader?

#### check ordering

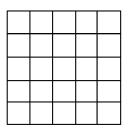
- ▶ Order: (A, B, C, D)
- $(g, y, r, b) \leq_{\mathsf{lex}} (r, y, g, b) \checkmark$
- $(g, y, r, b) \leq_{\mathsf{lex}} (g, b, r, y) \times$
- $(g, y, r, b) \leq_{\mathsf{lex}} (r, b, g, y) \checkmark$



(g, y, r, b) does not satisfy LEXLEADER

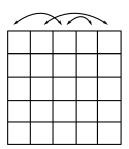
## Row and Column Symmetry: Definitions

A matrix of variables has row symmetry if any row permutation preserves solutions column symmetry if any column permutation preserves solutions



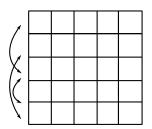
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## Row and Column Symmetry: Example

#### The EFPA problem

(Equidistant Frequency Permutation Array)

- ▶ find v codewords
- each of length  $q\lambda$
- each containing  $\lambda$  copies of symbols 0 to q-1
- each pair is Hamming distance d

 $\begin{array}{c} 0\ 2\ 1\ 2\ 0\ 1 \\ 0\ 2\ 2\ 1\ 1\ 0 \\ 0\ 1\ 0\ 2\ 1\ 2 \\ 0\ 0\ 1\ 1\ 2\ 2 \end{array}$ 

## The EFPA problem

► *v* = 4

 $\begin{array}{c} 0\ 2\ 1\ 2\ 0\ 1 \\ 0\ 2\ 2\ 1\ 1\ 0 \\ 0\ 1\ 0\ 2\ 1\ 2 \\ 0\ 0\ 1\ 1\ 2\ 2 \end{array}$ 

## The EFPA problem

- ▶ v = 4
- λ = 2

 $\begin{array}{c} 0\ 2\ 1\ 2\ 0\ 1 \\ 0\ 2\ 2\ 1\ 1\ 0 \\ 0\ 1\ 0\ 2\ 1\ 2 \\ 0\ 0\ 1\ 1\ 2\ 2 \end{array}$ 

### The EFPA problem

- v = 4
- $\lambda = 2$
- ▶ q = 3

 $\begin{array}{c} 0\ 2\ 1\ 2\ 0\ 1 \\ 0\ 2\ 2\ 1\ 1\ 0 \\ 0\ 1\ 0\ 2\ 1\ 2 \\ 0\ 0\ 1\ 1\ 2\ 2 \end{array}$ 

### The EFPA problem

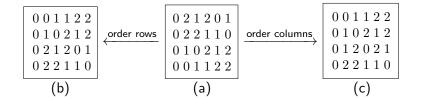
- v = 4
- $\lambda = 2$
- ► *q* = 3
- ► *d* = 4

#### The DOUBLELEX constraint

A matrix solution satisfies DoubleLex if

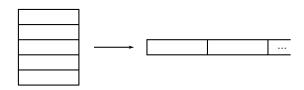
- the rows are lexicographically ordered, and
- the columns are lexicographically ordered.

# Breaking Symmetry with DOUBLELEX



- ▶ (b) and (c) satisfy DOUBLELEX
- ▶ DoubleLex does not break all symmetries.

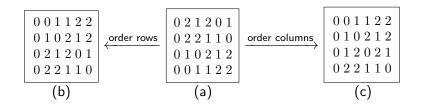
#### The ROWWISELEXLEADER constraint



#### A matrix satisfies RowWiseLexLeader if

▶ its rowwise linearization satisfies LEXLEADER.

# Breaking Symmetry with ROWWISELEXLEADER

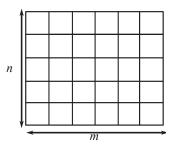


- Only (c) satisfies ROWWISELEXLEADER.
- ROWWISELEXLEADER breaks all row and column symmetries.
- ► Checking satisfaction of ROWWISELEXLEADER is NP-hard, but . . .

## Complexity of ROWWISELEXLEADER

#### **Theorem**

Checking satisfaction of ROWWISELEXLEADER is  $O(n! nm \log m)$  for an  $n \times m$  matrix.



#### Proof.

- ▶ Given one of the *n*! row permutations
- ▶ Sort the columns lexicographically in  $O(nm \log m)$ .



#### **Theorem**

There is a  $2n \times 2n$  0/1 matrix class on which DOUBLELEX leaves n! symmetric solutions.

Proof.

# DoubleLex: a Worse-Case Example

#### **Theorem**

There is a  $2n \times 2n$  0/1 matrix class on which DOUBLELEX leaves n! symmetric solutions.

#### Proof.

Consider a CSP with constraints:

- ▶ 3*n* 1-entries
- each row and column contains one or two 1-entries

#### **Theorem**

There is a  $2n \times 2n$  0/1 matrix class on which DOUBLELEX leaves n! symmetric solutions.

#### Proof.



- ▶ O is a zero matrix
- ► *I<sup>R</sup>* is the identity matrix vertically flipped
- ▶ *P* is a permutation matrix

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▶ 3*n* 1-entries  $\sqrt{ }$ 

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- ▶ 3*n* 1-entries  $\checkmark$
- ▶ each row and column contains one or two 1-entries √

## Special case: ALL-DIFFERENT

In a All-Different CSP,

ROWWISELEXLEADER is equivalent to Order1stRowCol:

- the top-left entry is the smallest
- the first row and column are ordered

## Special case: All-different

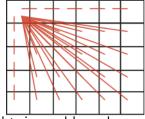
#### **Theorem**

DC can be enforced on Order1stRowCol in polynomial time.

#### Proof.

#### Constraints:

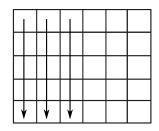
- $X_{1,1} < X_{i,j}$   $1 < i \le m$ ,  $1 < j \le n$
- $X_{i,1} < X_{i+1,1}$  $1 \le i < m$
- $X_{1,j} < X_{1,j+1}$   $1 \le j < n$



Each constraint only needs to be checked twice and bounds are enforced in constant time.

## Column symmetry breaking

- ▶  $c_1 \leq_{\mathsf{lex}} c_2, c_1 \leq_{\mathsf{lex}} c_3$
- $ightharpoonup \overline{c_2} \leq_{\mathsf{lex}} \overline{c_3}, \ \overline{c_2} \leq_{\mathsf{lex}} \overline{c_4}$
- ▶  $c_3 \leq_{lex} c_4$ ,  $c_3 \leq_{lex} c_5$
- **.**...

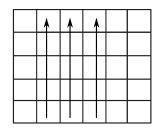


### Row symmetry breaking

$$(x_{i,1}, x_{i+1,2}, x_{i,3}, \dots) \leq_{\mathsf{lex}} (x_{i+1,1}, x_{i,2}, x_{i+1,3}, \dots)$$

### Column symmetry breaking

- $ightharpoonup c_1 \leq_{\mathsf{lex}} c_2, \ c_1 \leq_{\mathsf{lex}} c_3$
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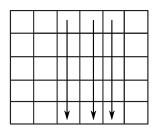


### Row symmetry breaking

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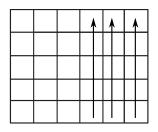


### Row symmetry breaking

$$(x_{i,1}, x_{i+1,2}, x_{i,3}, \dots) \leq_{\mathsf{lex}} (x_{i+1,1}, x_{i,2}, x_{i+1,3}, \dots)$$

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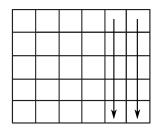


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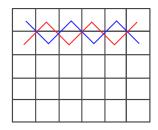


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- ▶  $c_3 \leq_{\text{lex}} c_4$ ,  $c_3 \leq_{\text{lex}} c_5$
- **.**...

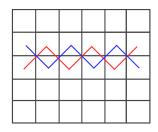


### Row symmetry breaking

$$(x_{i,1}, x_{i+1,2}, x_{i,3}, \dots) \leq_{\text{lex}} (x_{i+1,1}, x_{i,2}, x_{i+1,3}, \dots)$$

## Column symmetry breaking

- ▶  $c_1 \leq_{\mathsf{lex}} c_2, c_1 \leq_{\mathsf{lex}} c_3$
- $ightharpoonup \overline{c_2} \leq_{\mathsf{lex}} \overline{c_3}, \ \overline{c_2} \leq_{\mathsf{lex}} \overline{c_4}$
- ▶  $c_3 \leq_{lex} c_4$ ,  $c_3 \leq_{lex} c_5$
- **.**...

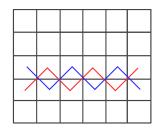


### Row symmetry breaking

$$(x_{i,1}, x_{i+1,2}, x_{i,3}, \dots) \leq_{\mathsf{lex}} (x_{i+1,1}, x_{i,2}, x_{i+1,3}, \dots)$$

### Column symmetry breaking

- $ightharpoonup c_1 \leq_{\mathsf{lex}} c_2, \ c_1 \leq_{\mathsf{lex}} c_3$
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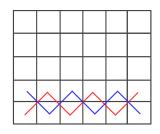


### Row symmetry breaking

$$(x_{i,1}, x_{i+1,2}, x_{i,3}, \dots) \leq_{\mathsf{lex}} (x_{i+1,1}, x_{i,2}, x_{i+1,3}, \dots)$$

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- ▶  $c_1 \leq_{\mathsf{lex}} c_2, c_1 \leq_{\mathsf{lex}} c_3$
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### Row symmetry breaking

$$(x_{i,1}, x_{i+1,2}, x_{i,3}, \dots) \leq_{\mathsf{lex}} (x_{i+1,1}, x_{i,2}, x_{i+1,3}, \dots)$$

#### **Theorem**

There is a  $2n \times 2n + 1$  0/1 matrix class on which SNAKELEX leaves  $O(4^n/\sqrt{n})$  symmetric solutions.

Proof.

$$\begin{array}{c} 0\ 1\ 0\ 0 \\ 0\ 0\ 0\ 1 \\ 0\ 0\ 1\ 0 \\ 1\ 0\ 0\ 0 \end{array}$$

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#### Proof.

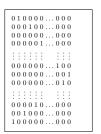
$$\begin{bmatrix}
0 & 1 & 0 & 0 & 1 \\
0 & 0 & 0 & 1 & 1 \\
0 & 0 & 1 & 0 & 0 \\
1 & 0 & 0 & 0 & 0
\end{bmatrix}
\longleftrightarrow
\begin{bmatrix}
0 & 1 & 0 & 0 & 0 \\
0 & 0 & 0 & 1 & 0 \\
0 & 0 & 1 & 0 & 0 \\
1 & 0 & 0 & 0 & 0
\end{bmatrix}
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1 & 0 & 0 & 0 & 1 & 0
\end{bmatrix}$$



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#### Proof.



In general, any column vector with exactly n 1-entries can be appended to this matrix. The matrix will still satisfy SNAKELEX.

#### **Theorem**

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#### Proof.

By Sterling's formula

$$\binom{2n}{n} = O\left(\frac{4^n}{\sqrt{n}}\right).$$



# Summary

	RowWiseLex	DoubleLex	SnakeLex
Completeness	Yes	No	No
Check Satisfaction	$O(n! nm \log m)$	Polynomial	Polynomial
DC	?	NP-hard	?

Empirical evidence suggest SnakeLex is superior to DoubleLex.

#### What we missed

- Relationship to breaking value symmetry
- Dynamic symmetry breaking methods