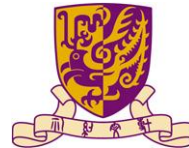


# Increasing Symmetry Breaking by Preserving Target Symmetries

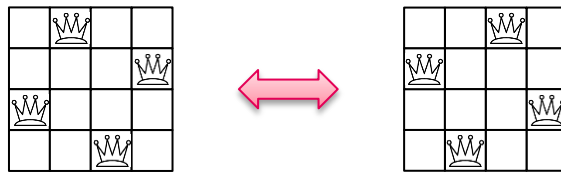
Jimmy Lee and Jingying Li



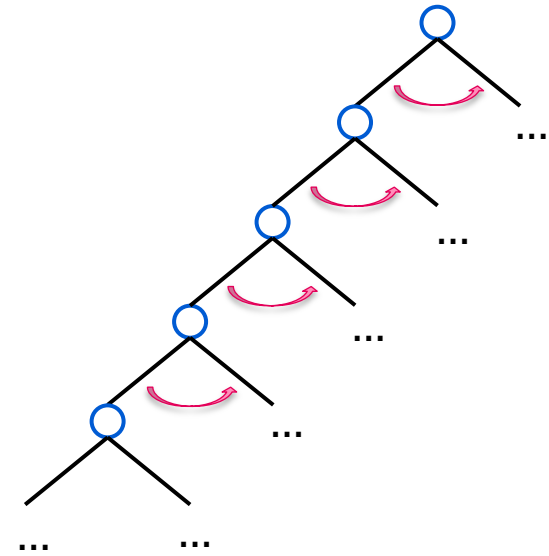
THE CHINESE UNIVERSITY OF HONG KONG

# Overview

- A lot of **CSPs** are highly **symmetric**



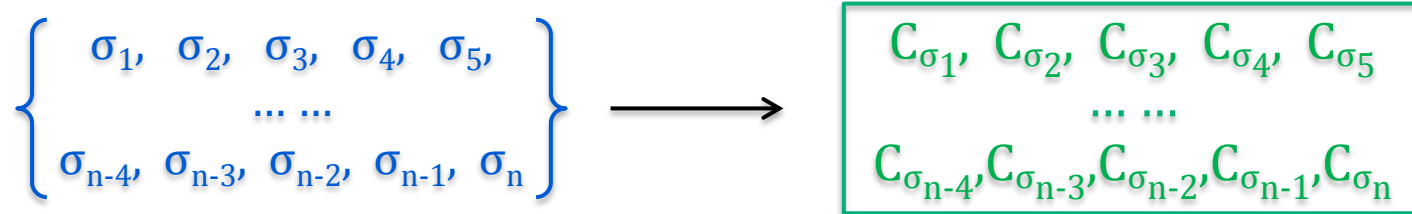
- Breaking Symmetries in CSPs significantly reduce search tree size



- Two main methods to break symmetries
  - **static symmetry breaking**
  - dynamic symmetry breaking

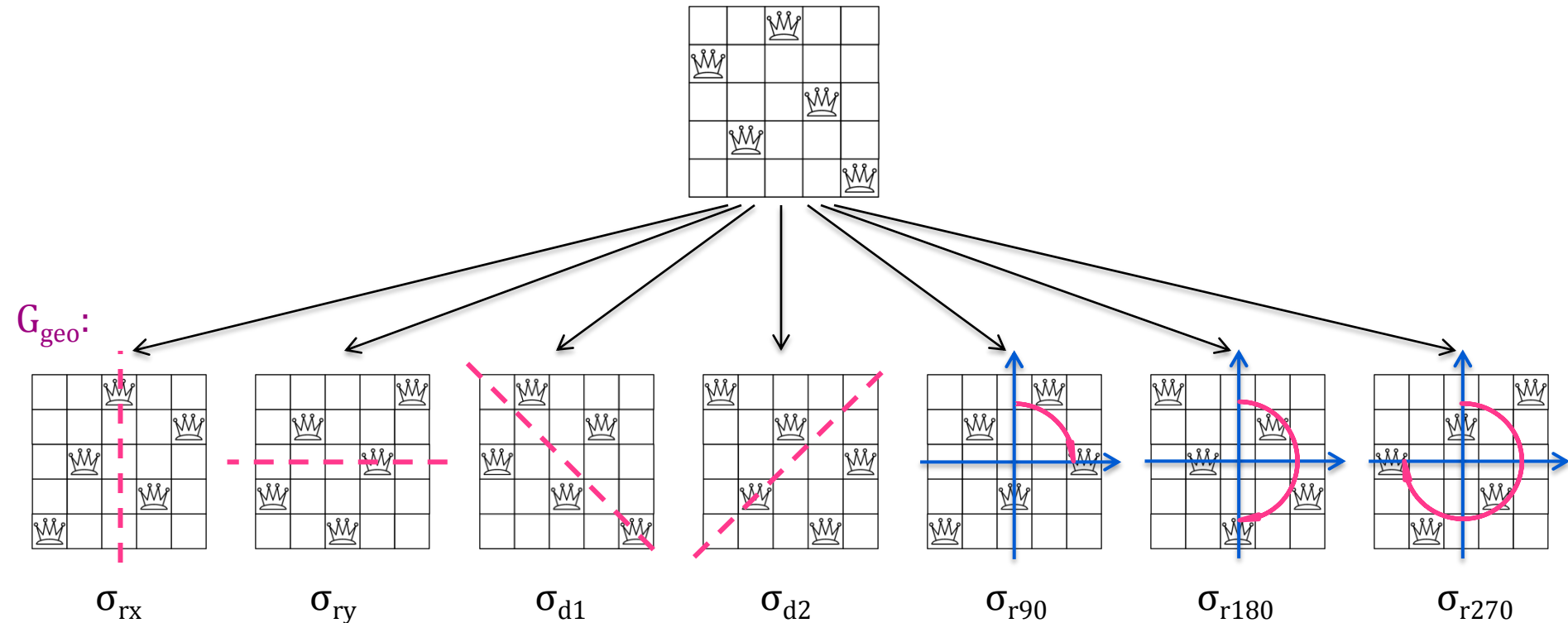
# Overview

- Generally, exponential number of **symmetries** → exponential number of **symmetry breaking constraints**



- Partial Symmetry Breaking
  1. choose which symmetries to break [Jefferson and Petrie 2011]
  2. choose what constraints to use
    - preserving target symmetries

# Symmetry



A symmetry on  $P$  (CSP Problem) for  $\text{sol}(P)$  is a **bijective mapping**  $\sigma$  on the **v-vals**( $P$ ) (variable value pairs) such that  $\text{sol}(P)^\sigma = \text{sol}(P)$ .

- variable symmetry  $\sigma$
- value symmetry  $\sigma$
- constraint symmetry  $\sigma$

$$(x_i = a_i)^\sigma \equiv x_{i\sigma} = a_i$$

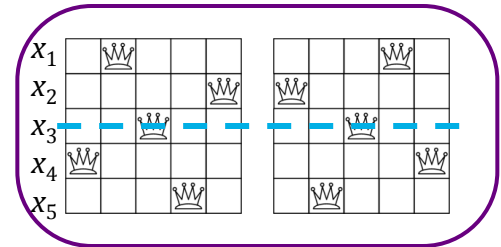
$$(x_i = a_i)^\sigma \equiv x_i = a_i^\sigma$$

preserve the set of constraints

# Symmetry Breaking Constraints

vertical reflection  $\sigma_{ry}$

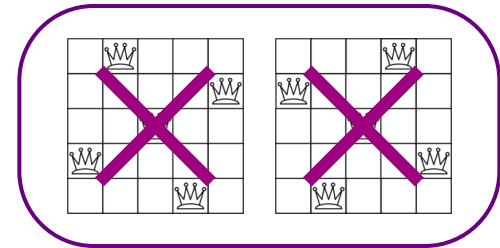
$$[x_1, x_2, x_3, x_4, x_5] \rightarrow \sigma_{ry}([x_1, x_2, x_3, x_4, x_5])$$



# Symmetry Breaking Constraints

vertical reflection  $\sigma_{ry}$

$$[X_1, X_2, X_3, X_4, X_5] \rightarrow [X_5, X_4, X_3, X_2, X_1]$$



**LEXLEADER** [Crawford *et al.* 1996] constraint enforces lexicographical ordering on variable sequence:

$$X \leq_{\text{lex}} \sigma(X)$$

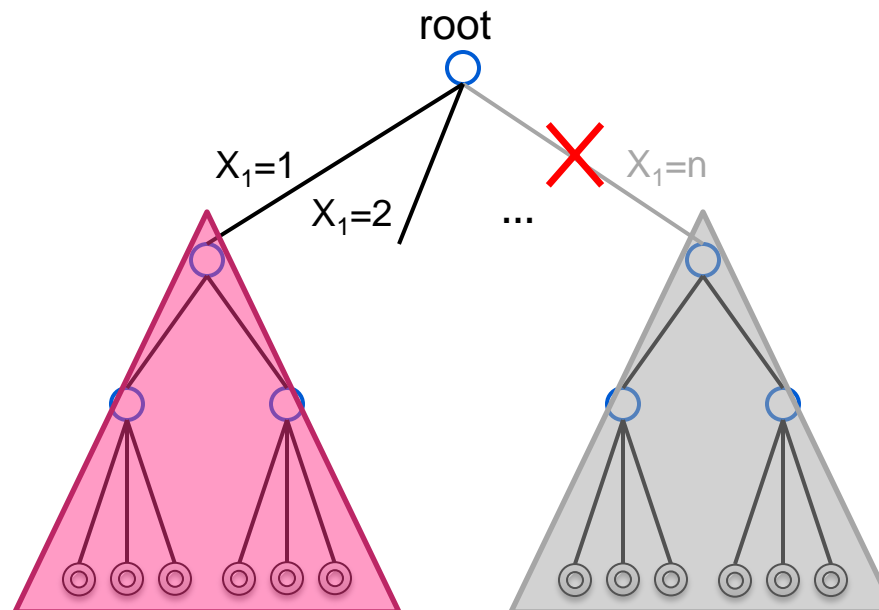
$$C_{\sigma_{ry}} \quad [X_1, X_2, X_3, X_4, X_5] \leq_{\text{lex}} [X_5, X_4, X_3, X_2, X_1] \rightarrow X_1 < X_5$$

$$[X_5, X_4, X_3, X_2, X_1] \leq_{\text{lex}} [X_1, X_2, X_3, X_4, X_5] \rightarrow X_5 < X_1$$

⋮

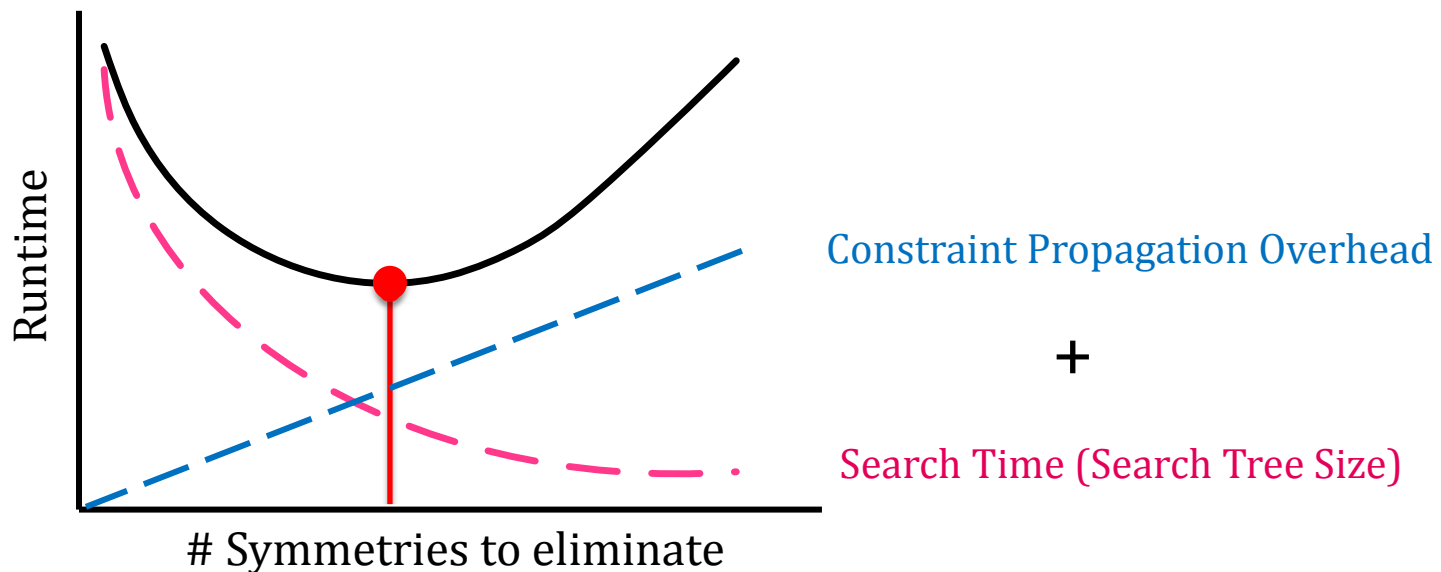
# Symmetry Breaking in Search Tree

- The **goal** of breaking symmetries is to avoid the exploration of a **search space** with assignments that can be mapped by a representative in symmetry class via symmetry function.



# Partial Symmetry Breaking

[McDonald and Smith 2002]



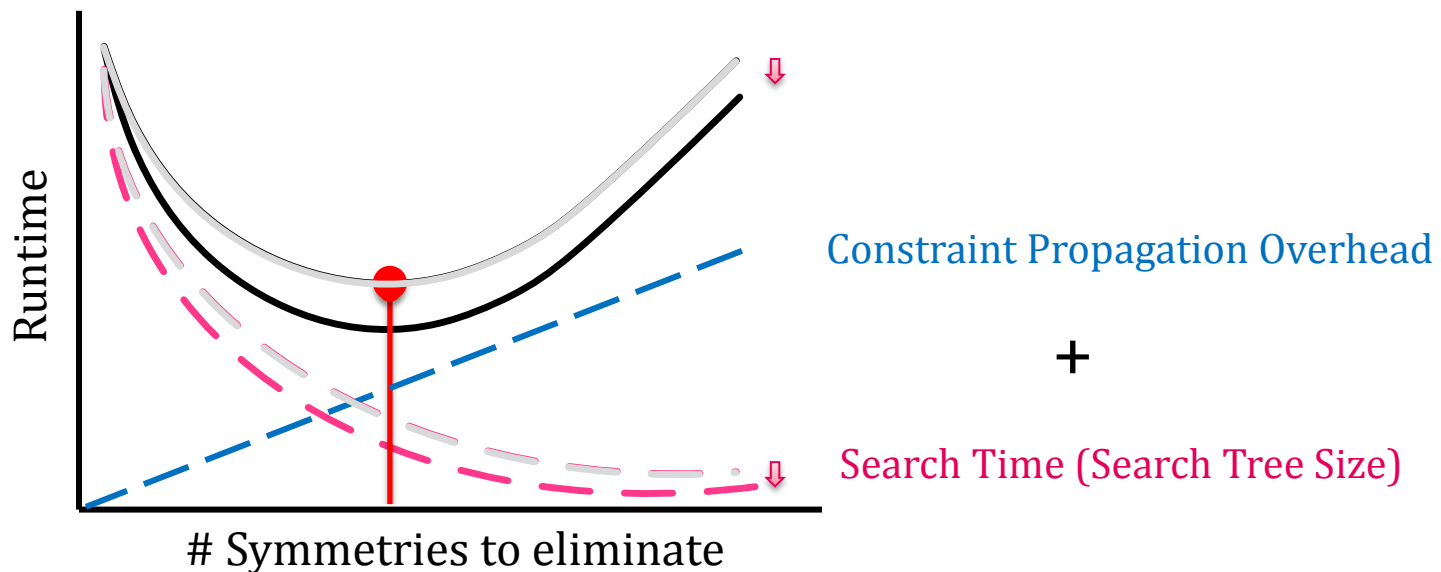
$$\begin{aligned}
 \{\sigma_1, \sigma_2, \sigma_3, \dots, \dots, \dots, \sigma_{n-1}, \sigma_n\} &\supseteq \{\sigma_{i_1}, \sigma_{i_2}, \dots, \sigma_{i_m}\} \\
 \{C_{\sigma_1}, C_{\sigma_2}, C_{\sigma_3}, \dots, \dots, \dots, C_{\sigma_{n-1}}, C_{\sigma_n}\} &\supseteq \{C_{\sigma_{i_1}}, C_{\sigma_{i_2}}, \dots, C_{\sigma_{i_m}}\}
 \end{aligned}$$

Target Symmetries!



# Motivation and Goal

- Select a set of symmetry breaking constraints that aims to eliminate only **target symmetries** but is able to eliminate **as much symmetries as possible**.
  - **similar overhead** but **turn out to prune more space finally**



$$\begin{array}{l}
 \{\sigma_1, \sigma_2, \sigma_3, \dots, \dots, \dots, \sigma_{n-1}, \sigma_n\} \\
 \{C_{\sigma_1}, C_{\sigma_2}, C_{\sigma_3}, \dots, \dots, \dots, C_{\sigma_{n-1}}, C_{\sigma_n}\}
 \end{array}
 \supseteq
 \begin{array}{l}
 \text{Target Symmetries!} \\
 \{\sigma_{i_1}, \sigma_{i_2}, \dots, \sigma_{i_m}\} \\
 \{\cancel{C_{\sigma_{i_1}}}, \cancel{C_{\sigma_{i_2}}}, \dots, \cancel{C_{\sigma_{i_m}}}\}
 \end{array}
 \quad
 \{C'_{\sigma_{i_1}}, C'_{\sigma_{i_2}}, \dots, C'_{\sigma_{i_m}}\}$$

# Symmetry Preservation - Definition

**Definition 4.2:** Given a CSP  $P = (V, D, C)$  with a symmetry  $\sigma$ . The symmetry  $\sigma$  is **preserved** by a set of symmetry breaking constraints  $C^{sb}$  iff  $\sigma$  is a symmetry of  $P' = (V, D, C \cup C^{sb})$ .

Diagonal Latin Square

1	3	5	2	4
3	2	4	5	1
4	5	3	1	2
5	1	2	4	3
2	4	1	3	5

6 choices of value symmetry breaking constraints

1	2	3	4	5

none

1				
2				
3				
4				
5				

none

1	2	3	4	5

vertical  
reflection

		1		
		2		
		3		
		4		
		5		

horizontal  
reflection

1				
	2			
		3		
			4	
				5

main  
diagonal  
reflection

				1
			2	
		3		
	4			
5				

minor  
diagonal  
reflection

# Symmetry Preservation - Properties

If  $C_{\sigma_1}$  preserve  $\sigma_2$ ,

- **Theorem 4.3:** *Eliminating* the target symmetries already eliminates their *compositions*.

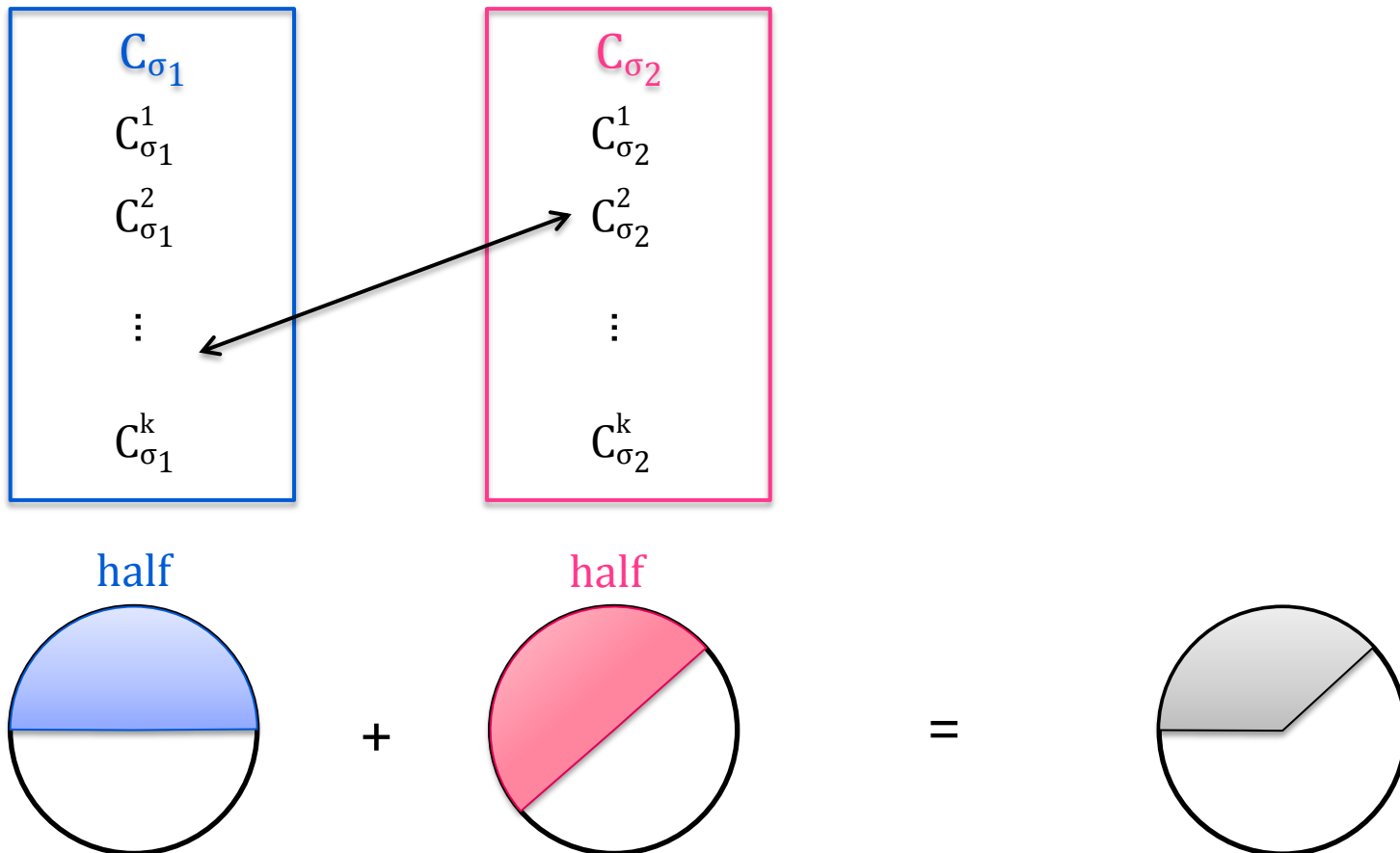
– eliminate  $\sigma_1, \sigma_2 \rightarrow$  eliminate  $\sigma_1 \circ \sigma_2, \sigma_2 \circ \sigma_1$

- **Theorem 4.4:** *The combination* of two sound symmetry breaking constraints is still *sound*.

– sound  $C_{\sigma_1}, C_{\sigma_2} \rightarrow$  sound  $C_{\sigma_1} \cup C_{\sigma_2}$

# Why is Preservation good?

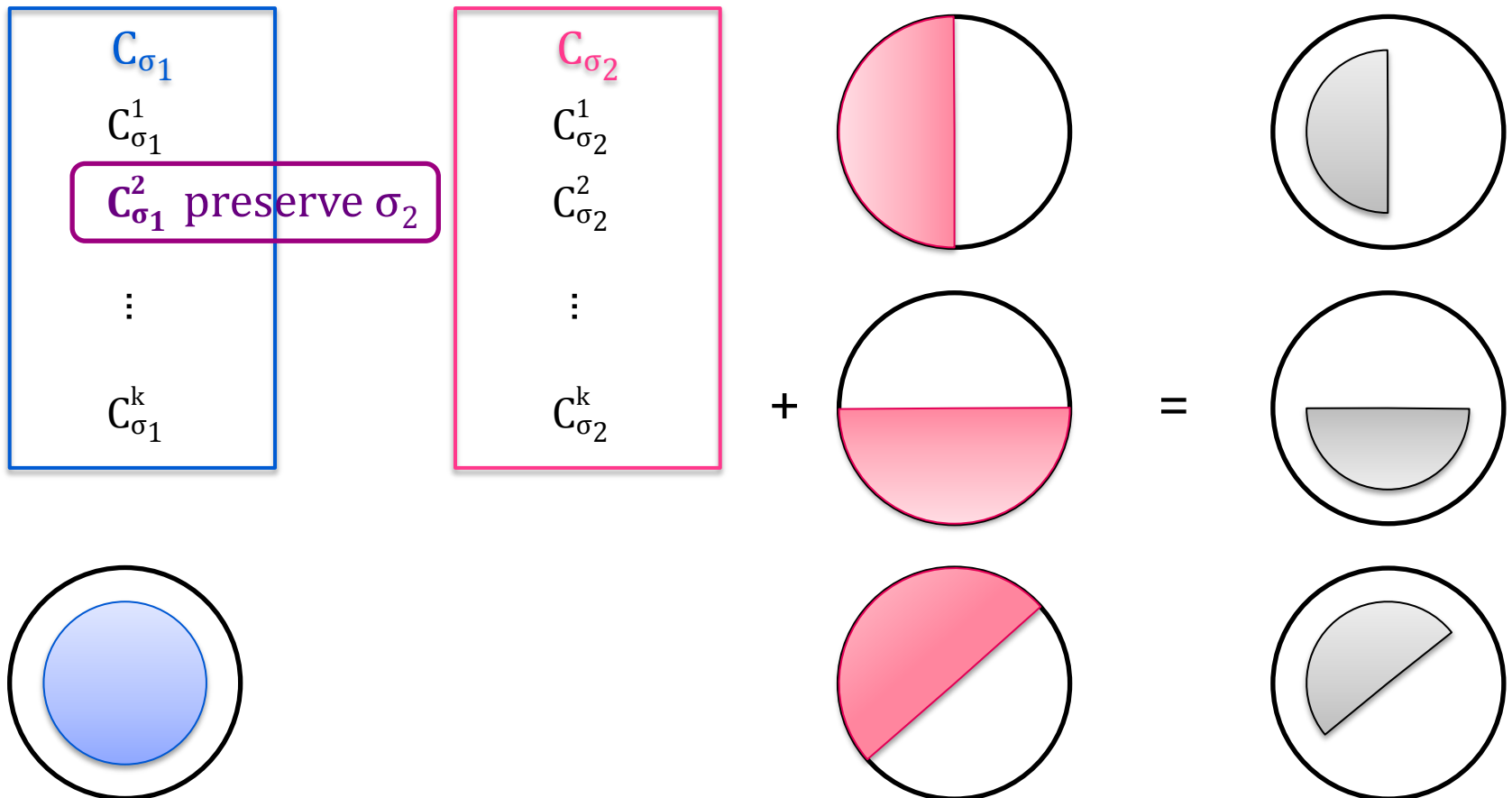
- Solution reduction of combining constraints



# Why is Preservation good?

- guarantee good solution reduction

always  $\frac{1}{4}$



# Experimental Results

- 3GHz Intel Core2 Duo PC running Gecode-3.7.0
- # solutions, runtime (second), # fails
- Preserving Target Symmetries
  - Diagonal Latin Square Problem
  - NN-Queen Problem
  - Cover Array Problem (ILOG6.0)
  - Error Correcting Code - Lee Distance

# Diagonal Latin Square (n)

- ROWWISE :  $[X_{11}, X_{12}, \dots, X_{1n}] = [1, 2, \dots, n]$
- Our Method :  $[X_{11}, X_{22}, \dots, X_{nn}] = [1, 2, \dots, n]$  ,  $X_{1n} < X_{n1}$

n	RowWISE			Our Method		
	#sol	time	#fails	#sol	time	#fails
5	8	0.001	7	<b>4</b>	0.001	<b>1</b>
6	128	0.029	3000	<b>64</b>	<b>0.004</b>	<b>652</b>
7	171200	12.891	1413K	<b>85600</b>	<b>1.954</b>	<b>163K</b>
8		0.002	140		<b>0.001</b>	<b>17</b>
9		40.04	4327K		<b>0.001</b>	<b>25</b>
10		0.031	2025		<b>0.002</b>	<b>175</b>
11		12052	1204124K		<b>0.005</b>	<b>339</b>

all solutions

---

one solution

# Diagonal Latin Square (n)

- ROWWISE :  $[X_{11}, X_{12}, \dots, X_{1n}] = [1, 2, \dots, n]$
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	#sol	time	#fails	#sol	time	#fails
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6	128	0.029	3000	64	0.004	652
7	171200	12.891	1413K	85600	1.954	163K
8		0.002	140		0.001	17
9		40.04	4327K		0.001	25
10		0.031	2025		0.002	175
11		12052	1204124K		0.005	339

all solutions

half of the solution set size



# Diagonal Latin Square (n)

- ROWWISE :  $[X_{11}, X_{12}, \dots, X_{1n}] = [1, 2, \dots, n]$
- Our Method :  $[X_{11}, X_{22}, \dots, X_{nn}] = [1, 2, \dots, n]$  ,  $X_{1n} < X_{n1}$

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all solutions

# Diagonal Latin Square (n)

- ROWWISE :  $[X_{11}, X_{12}, \dots, X_{1n}] = [1, 2, \dots, n]$
- Our Method :  $[X_{11}, X_{22}, \dots, X_{nn}] = [1, 2, \dots, n]$  ,  $X_{1n} < X_{n1}$

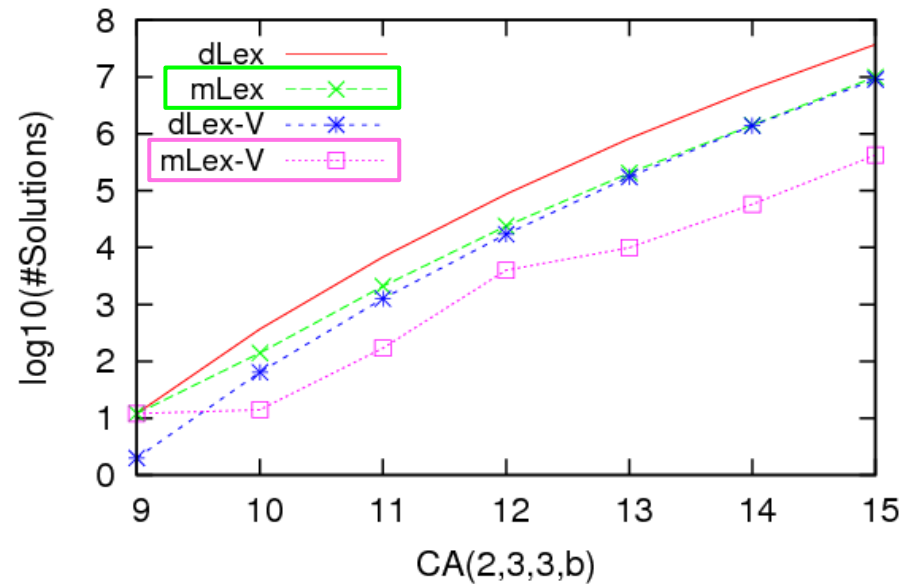
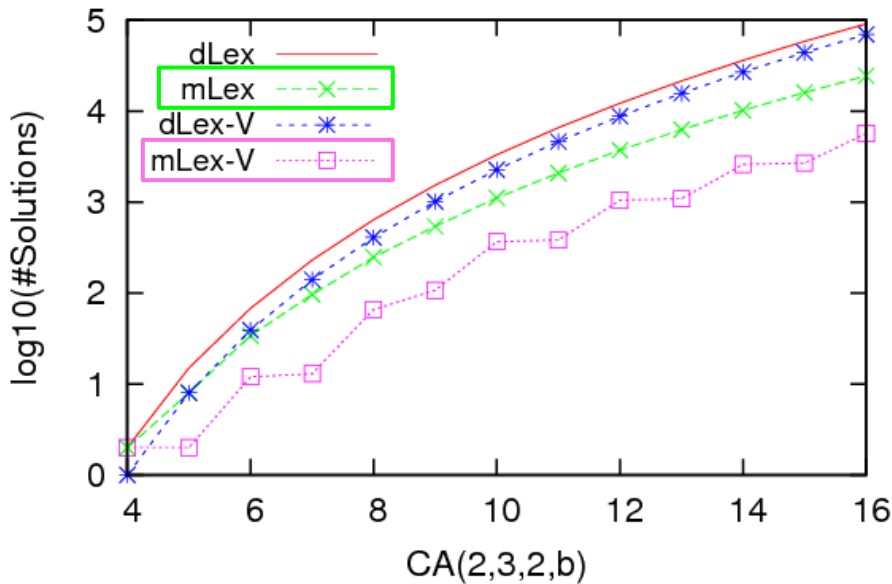
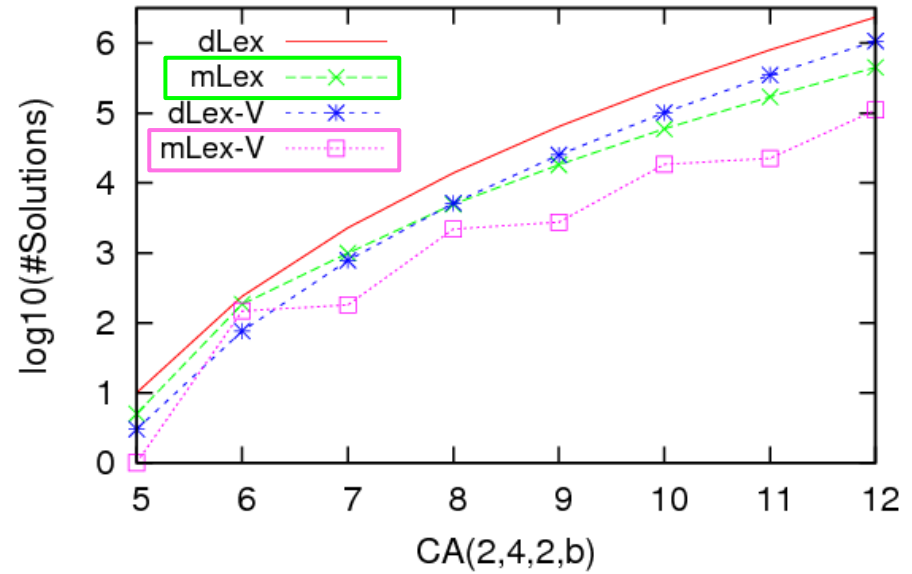
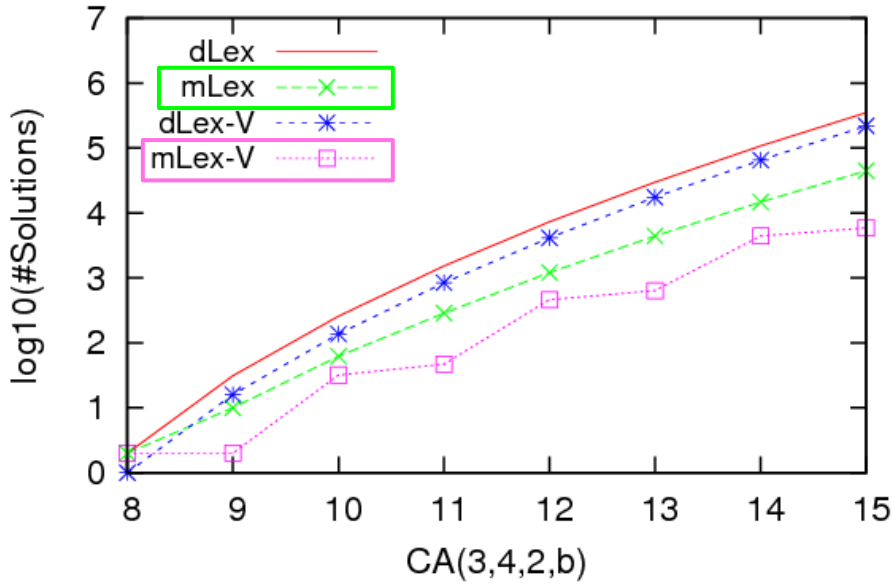
n	RowWISE			Our Method		
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10		0.031	2025		<b>0.002</b>	<b>175</b>
11		12052	1204124K		<b>0.005</b>	<b>339</b>

one solution

# Cover Array Problem [Hnich *et al.* 2006]

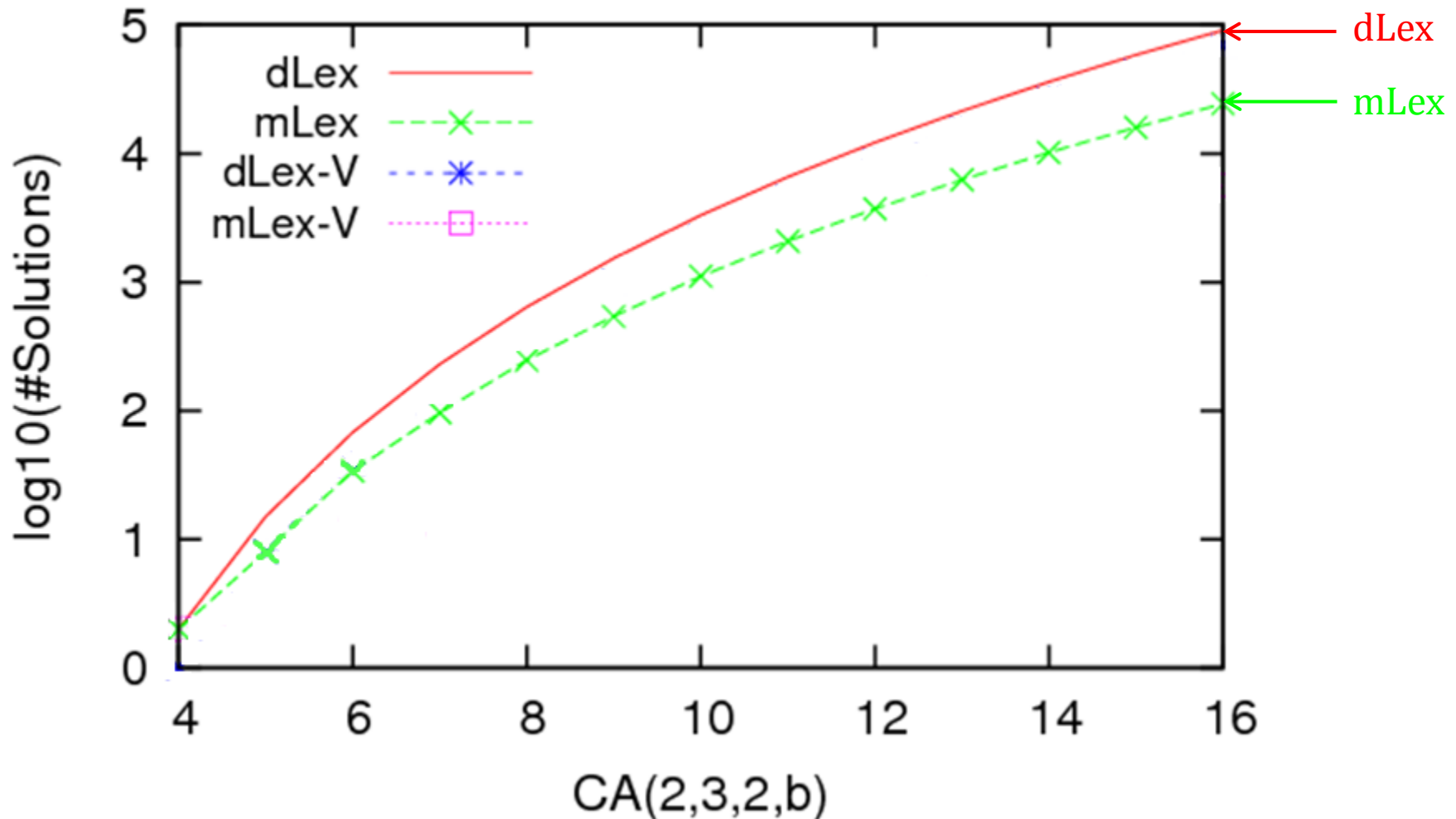
- Target Symmetries:
  - row, column  $\{G_{\text{row}}, G_{\text{col}}\}$ 
    - dLex [Flener *et al.* 2002]
    - **mLex** :  $C_{G_{\text{col}}}$  [Frisch *et al.* 2003] preserves  $G_{\text{row}}$
  - row, column, value  $\{G_{\text{row}}, G_{\text{col}}, G_{\text{val}}\}$ 
    - dLex-V [Law and Lee 2004]
    - **mLex-V** :  $C_{G_{\text{val}}}$  preserves  $\{G_{\text{row}}, G_{\text{col}}\}$ ,  $C_{G_{\text{col}}}$  preserves  $G_{\text{row}}$
- Experiments are conducted with various problem sizes  $CA(t,k,g,b)$  .

# Preserving Target Symmetries - CA ( $\log_{10}\#\text{solutions}$ )



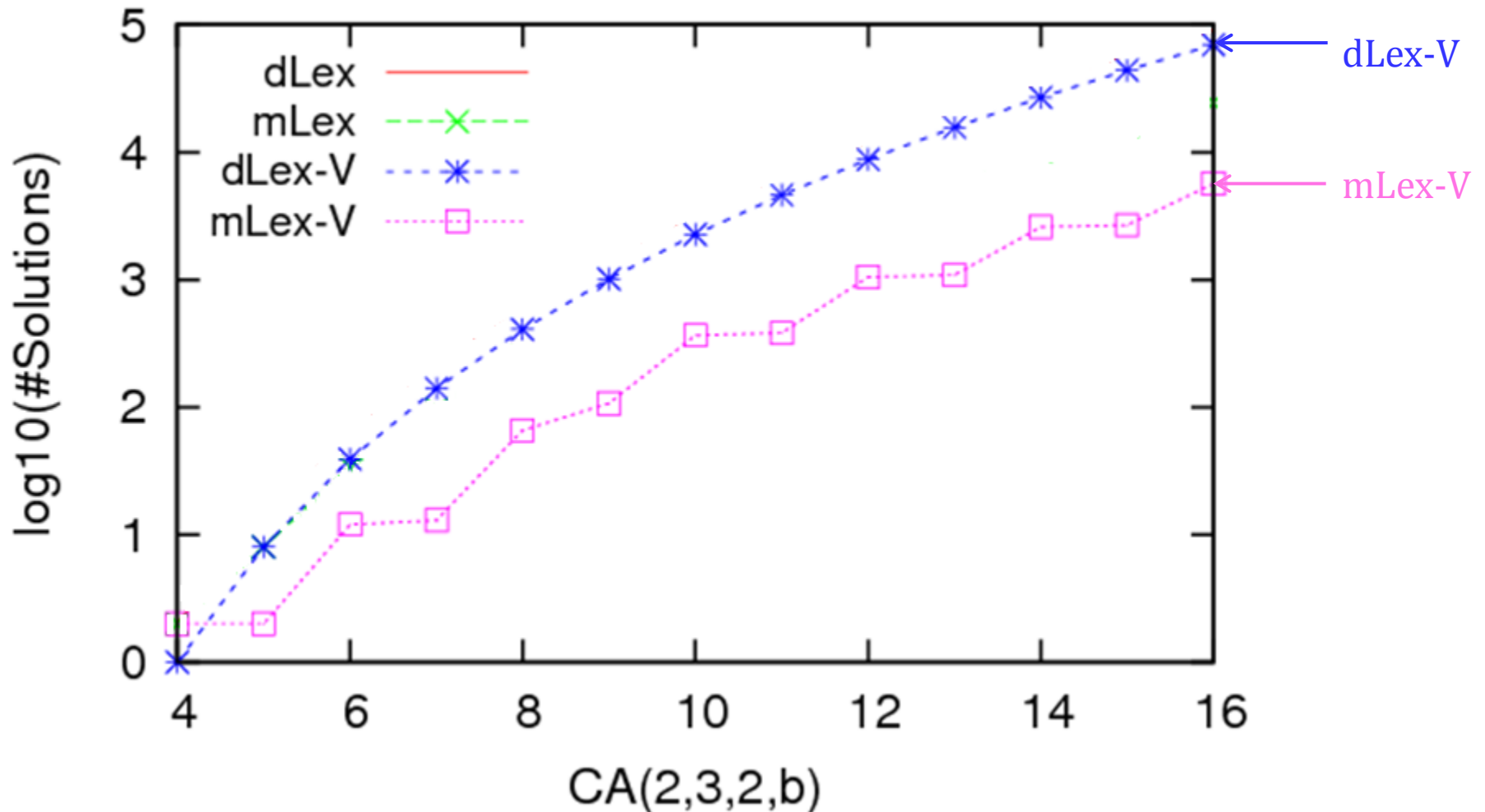
# Cover Array Problem ( $\log_{10}\#\text{solutions}$ )

Target Symmetries	Tradition	Our Method
row, column	dLex	mLex
row, column, value	dLex-V	mLex-V



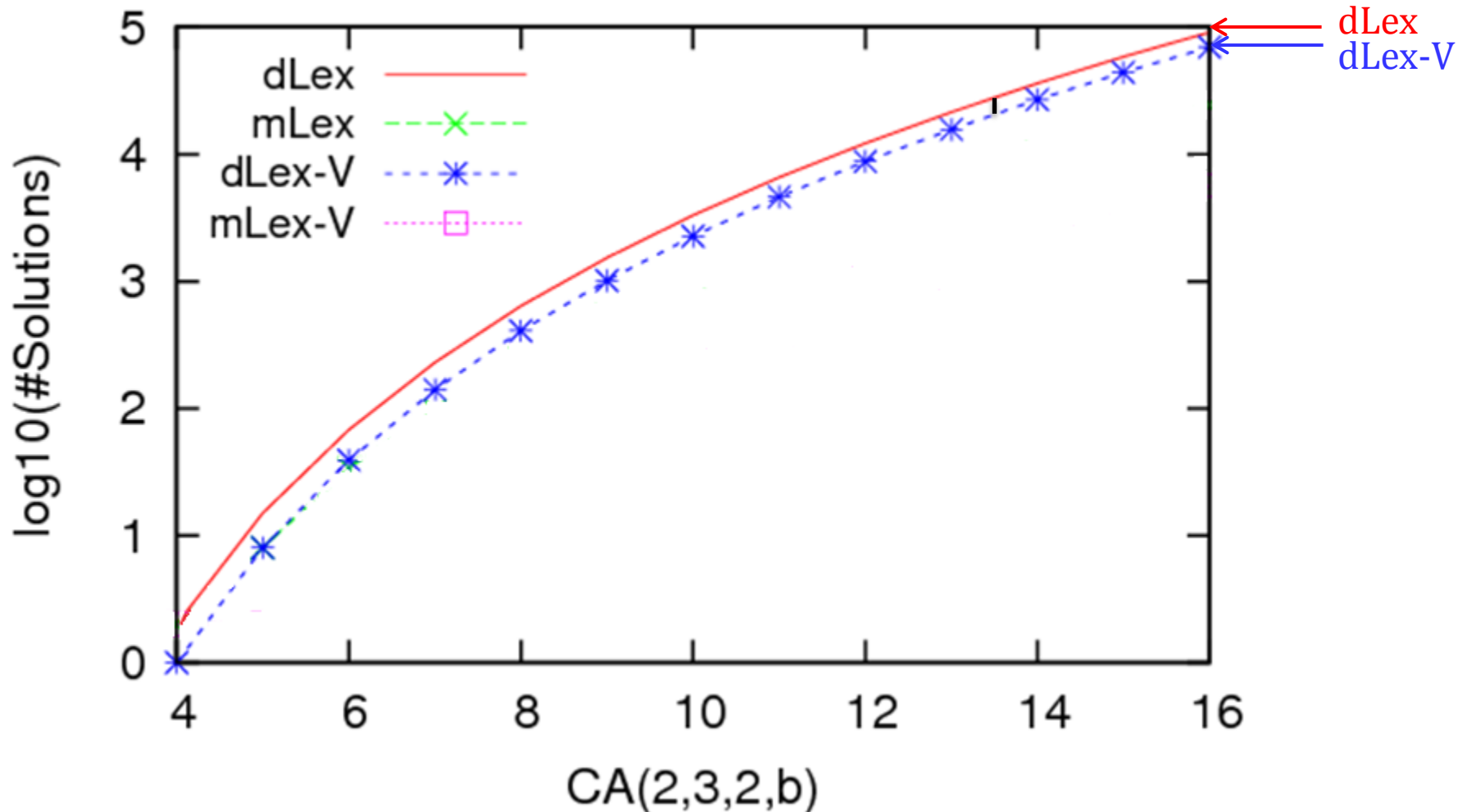
# Cover Array Problem ( $\log_{10}\#\text{solutions}$ )

Target Symmetries	Tradition	Our Method
row, column	dLex	mLex
row, column, value	dLex-V	mLex-V



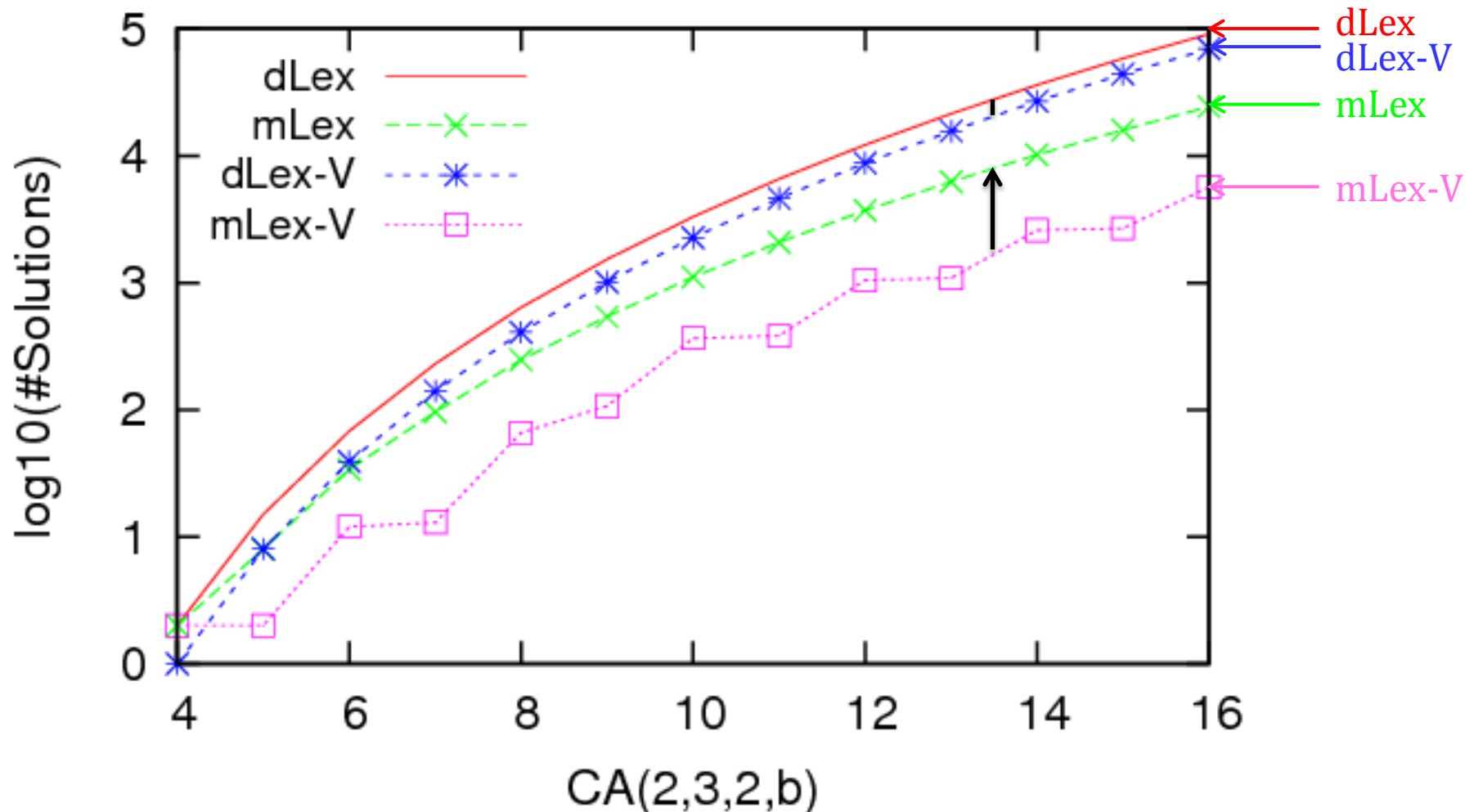
# Cover Array Problem ( $\log_{10}\#\text{solutions}$ )

Target Symmetries	Tradition	Our Method
row, column	dLex	mLex
row, column, value	dLex-V	mLex-V



# Cover Array Problem ( $\log_{10}\#\text{solutions}$ )

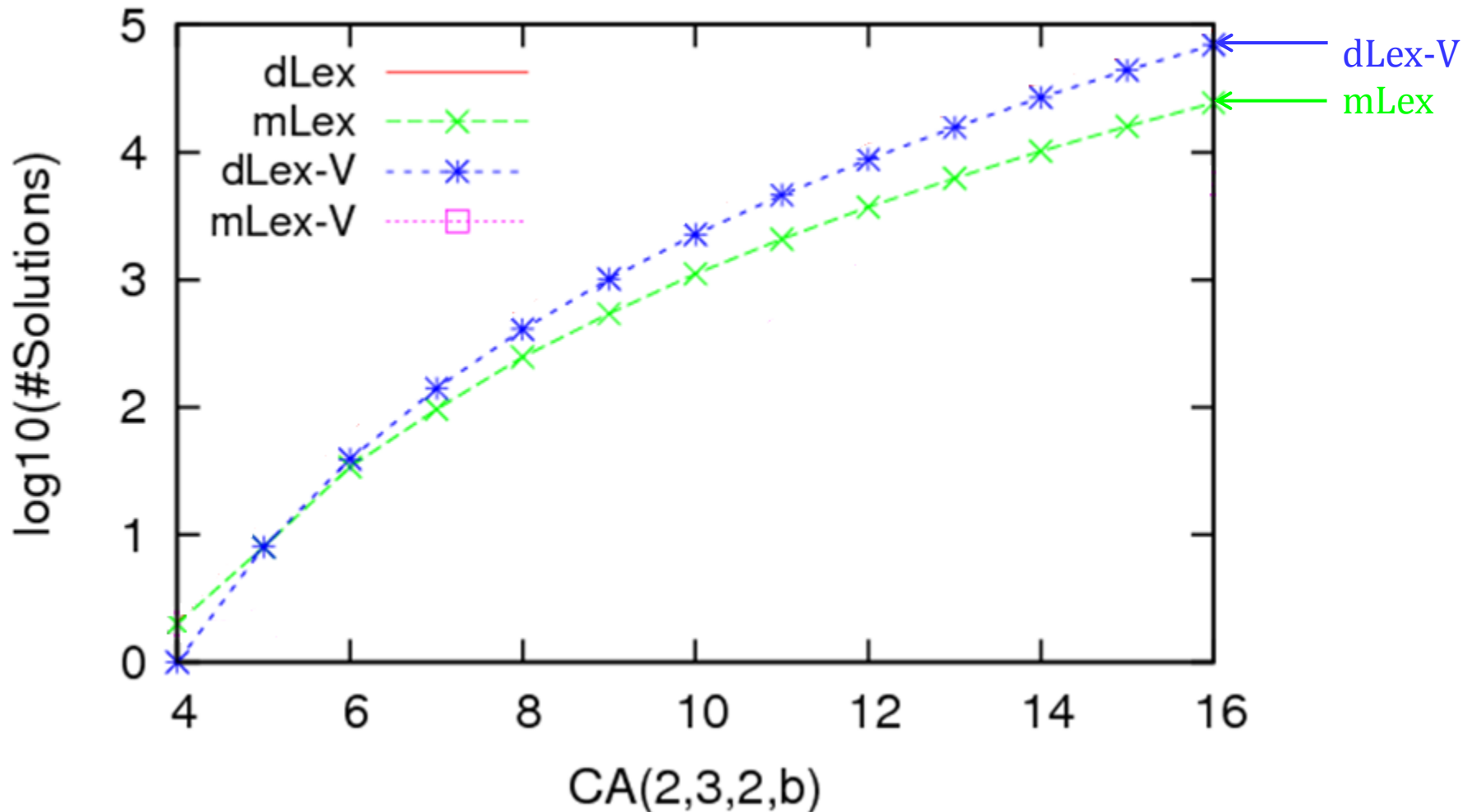
Target Symmetries	Tradition	Our Method
row, column	dLex	mLex
row, column, value	dLex-V	mLex-V



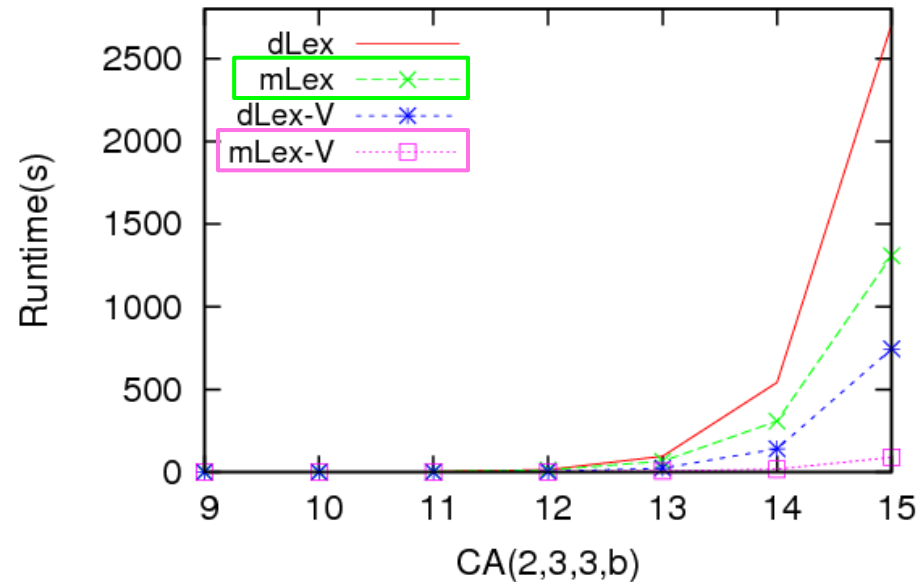
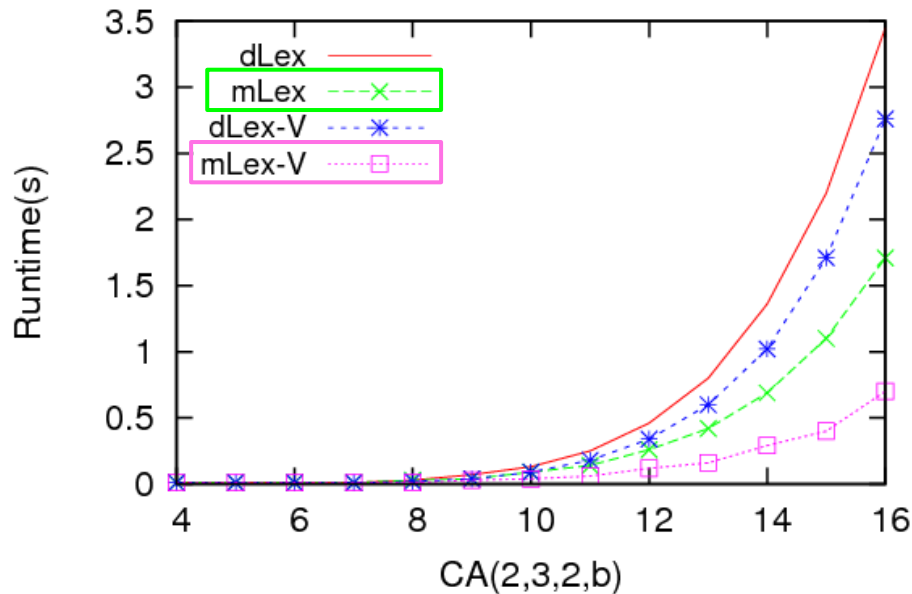
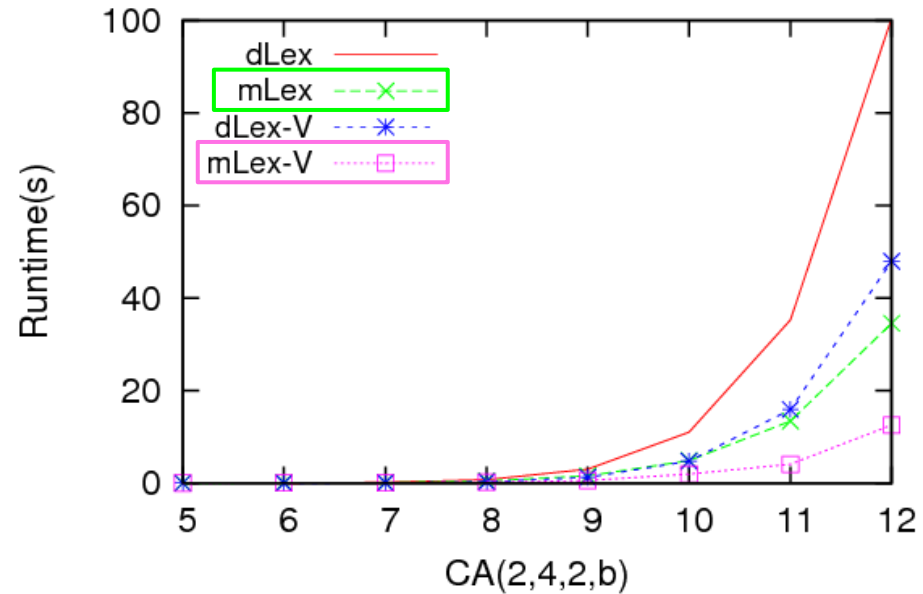
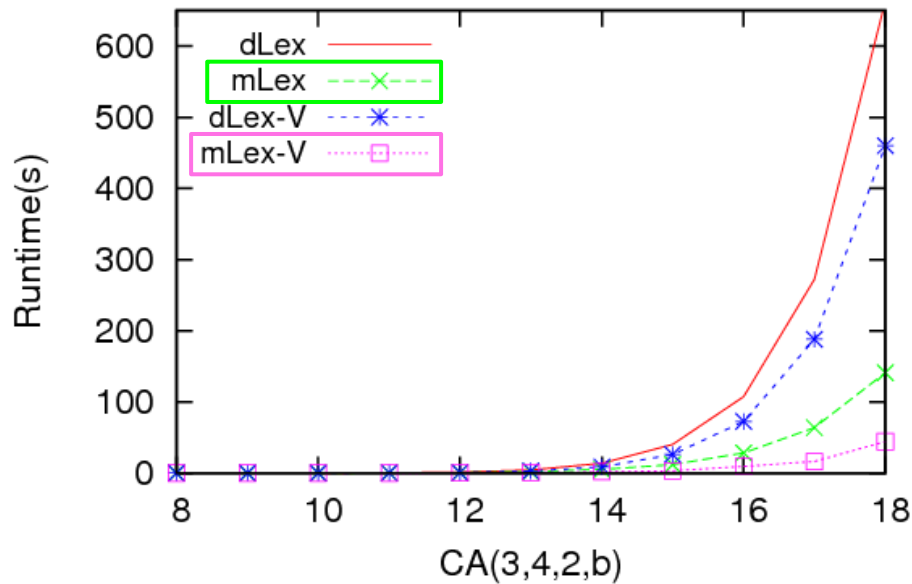


# Cover Array Problem ( $\log_{10}\#\text{solutions}$ )

Target Symmetries	Tradition	Our Method
row, column	dLex	mLex
row, column, value	dLex-V	mLex-V



# Preserving Target Symmetries - CA (runtime)



# Concluding Remarks

1. formally define **symmetry preservation**
2. propose method to post symmetry breaking constraints for **only target symmetries** but they turn out to **eliminate more symmetries**
3. demonstrate the feasibility and efficiency of our proposals by experimental results

# Future Work

- Combination with other approaches
  - choose better target symmetries [Jefferson and Petrie 2011]
  - model restart [Heller *et al.* 2008]
  - symmetries of sb constraints [Katsirelos and Walsh 2010]
- Automating the procedure of selecting constraints

**THANK YOU!**