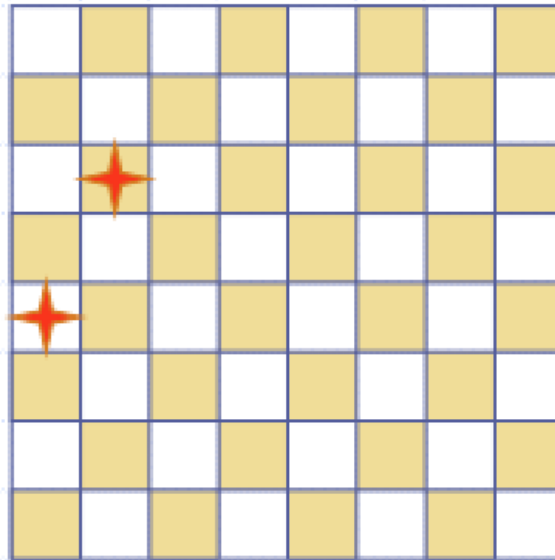


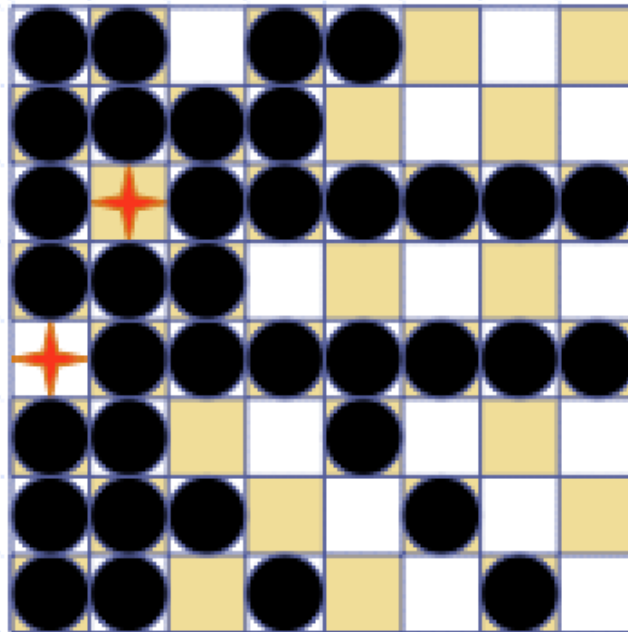
# **Constraint Satisfaction Problems**

# Intro Example: 8-Queens



Generate-and-test:  $8^8$  combinations

# Intro Example: 8-Queens



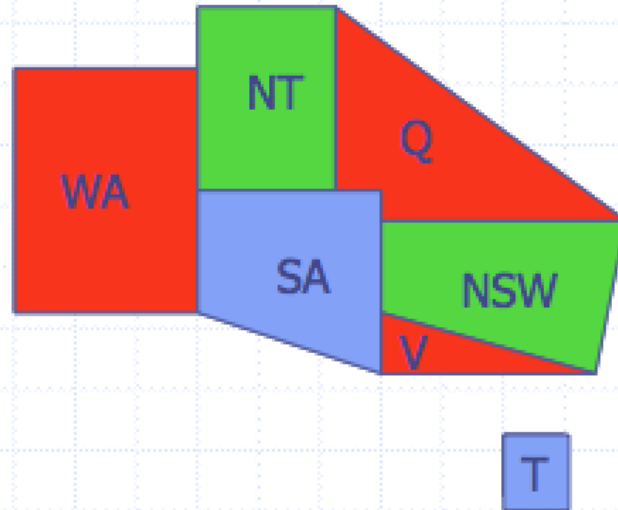
# Constraint Satisfaction Problem

- ◆ Set of variables  $\{X_1, X_2, \dots, X_n\}$
- ◆ Each variable  $X_i$  has a domain  $D_i$  of possible values
  - Usually  $D_i$  is discrete and finite
- ◆ Set of constraints  $\{C_1, C_2, \dots, C_p\}$ 
  - Each constraint  $C_k$  involves a subset of variables and specifies the allowable combinations of values of these variables
- ◆ Assign a value to every variable such that all constraints are satisfied

# Example: 8-Queens Problem

- ◆ 8 variables  $X_i$ ,  $i = 1$  to  $8$
- ◆ Domain for each variable  $\{1, 2, \dots, 8\}$
- ◆ Constraints are of the forms:
  - $X_i = k \rightarrow X_j \neq k$  for all  $j = 1$  to  $8$ ,  $j \neq i$
  - $X_i = k_i, X_j = k_j \rightarrow |i-j| \neq |k_i - k_j|$ 
    - ◆ for all  $j = 1$  to  $8$ ,  $j \neq i$

# Example: Map Coloring

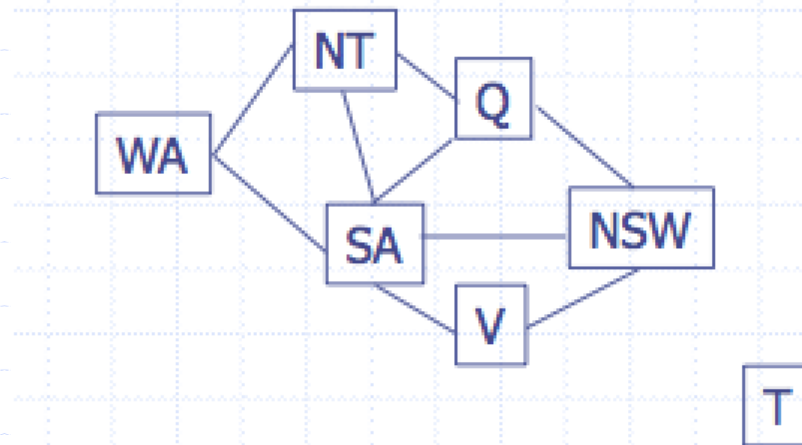


- 7 variables  $\{WA, NT, SA, Q, NSW, V, T\}$
- Each variable has the same domain  $\{\text{red}, \text{green}, \text{blue}\}$
- No two adjacent variables have the same value:

$WA \neq NT, WA \neq SA, NT \neq SA, NT \neq Q, SA \neq Q, SA \neq NSW, SA \neq V, Q \neq NSW, NSW \neq V$

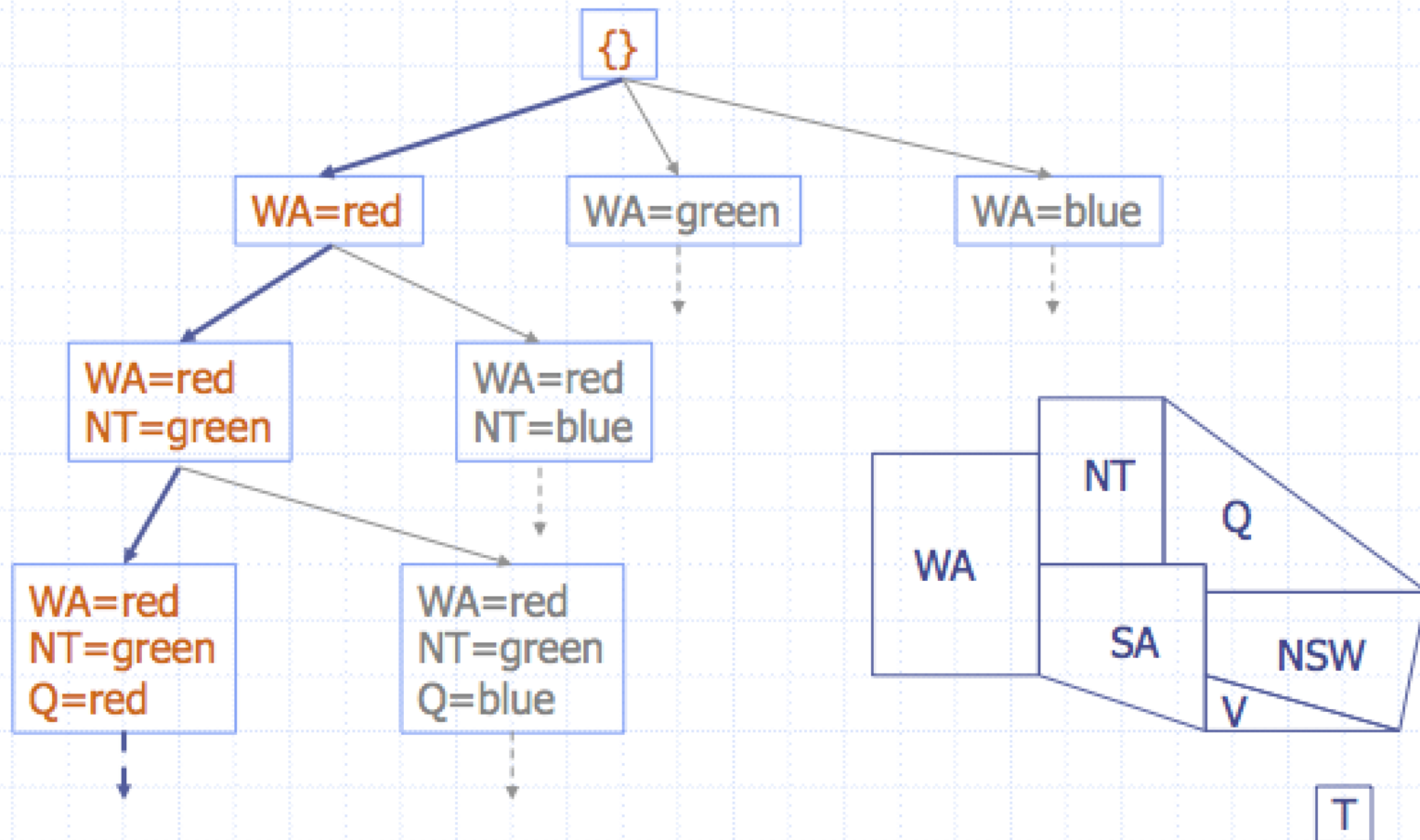
# Constraint Graph

Binary constraints



Two variables are adjacent or neighbors if they are connected by an edge or an arc

# Map Coloring





# Backtracking Algorithm

CSP-BACKTRACKING(PartialAssignment **a**)

- If **a** is complete then return **a**
- **X**  $\leftarrow$  select an unassigned variable
- **D**  $\leftarrow$  select an ordering for the domain of **X**
- For each value **v** in **D** do
  - ◆ If **v** is consistent with **a** then
    - Add (**X** = **v**) to **a**
    - **result**  $\leftarrow$  CSP-BACKTRACKING(**a**)
    - If **result**  $\neq$  *failure* then return **result**
- Return *failure*

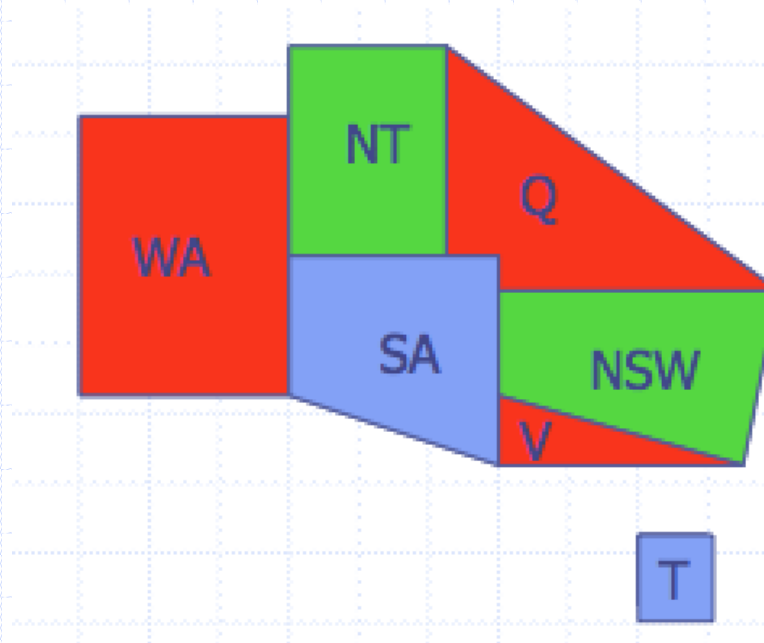
CSP-BACKTRACKING({})

# Questions

1. Which variable  $X$  should be assigned a value next?
2. In which order should its domain  $D$  be sorted?
3. In which order should constraints be verified?

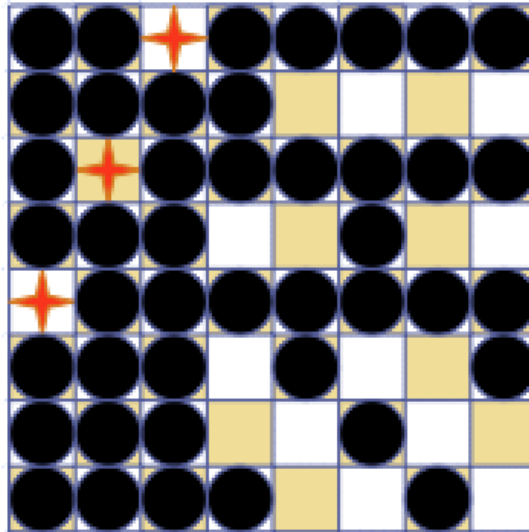
# Choice of Variable

## ◆ Map coloring



# Choice of Variable

## ◆ 8-queen



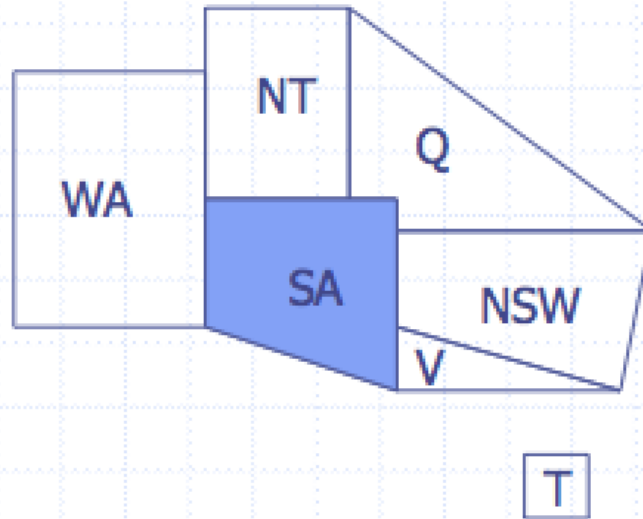
# Choice of Variable

Most-constrained-variable heuristic:

Select a variable with the fewest remaining values

= Fail First Principle

# Choice of Variable

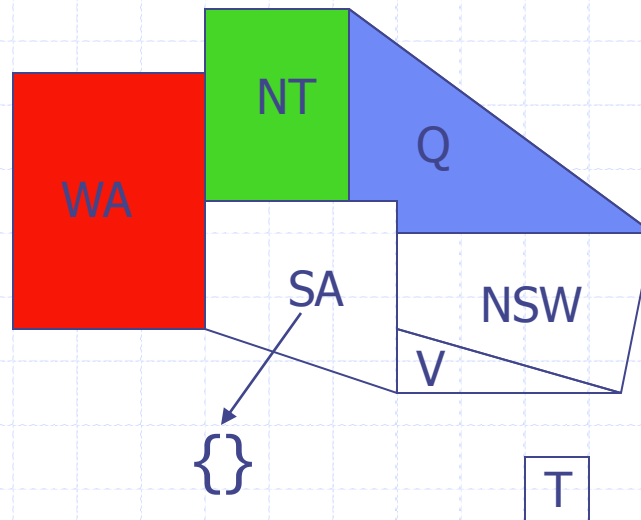


**Most-constraining-variable heuristic:**

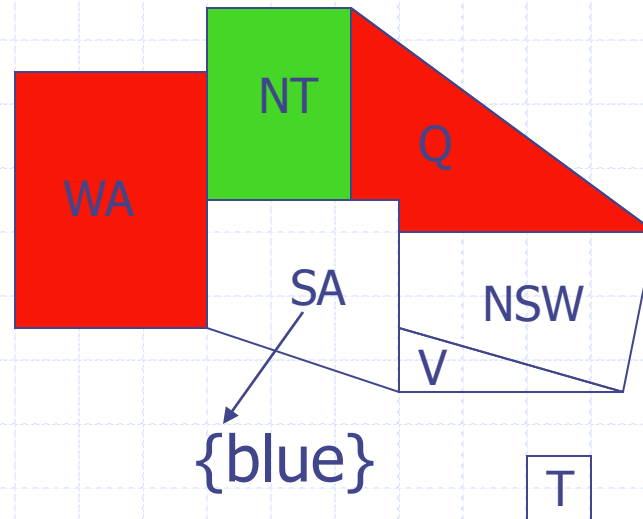
Select the variable that is involved in the largest number of constraints on other unassigned variables

= Fail First Principle again

# Choice of Value



# Choice of Value



**Least-constraining-value heuristic:**

Prefer the value that leaves the largest subset of legal values for other unassigned variables



# Choice of Constraint to Test

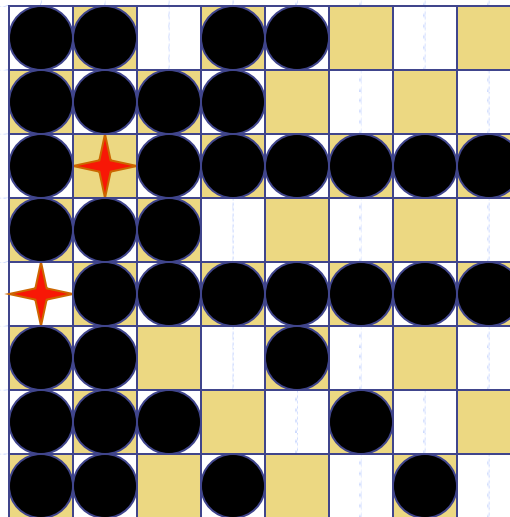
## Most-constraining-Constraint:

Prefer testing constraints that are more difficult to satisfy

= Fail First Principle

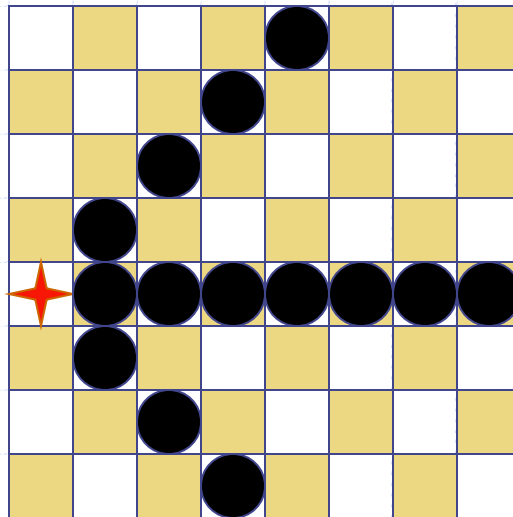
# Constraint Propagation ...

... is the process of determining how the possible values of one variable affect the possible values of other variables

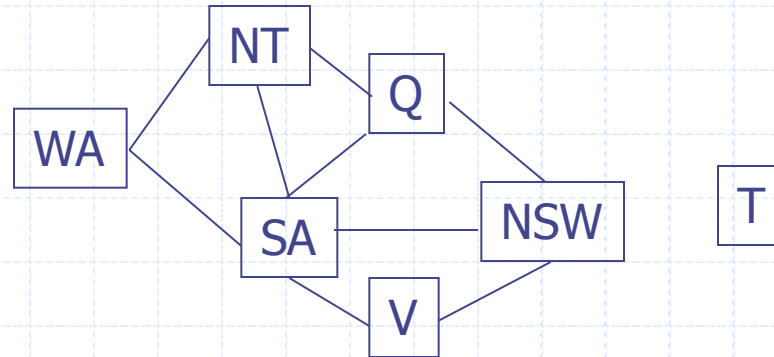


# Forward Checking

After a variable **X** is assigned a value **v**, look at each unassigned variable **Y** that is connected to **X** by a constraint and deletes from **Y**'s domain any value that is inconsistent with **v**

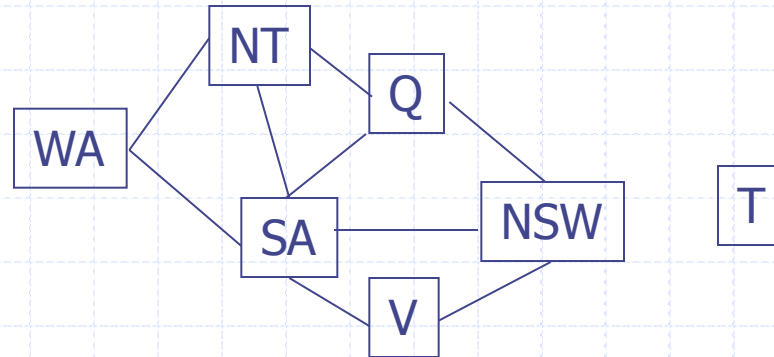


# Map Coloring



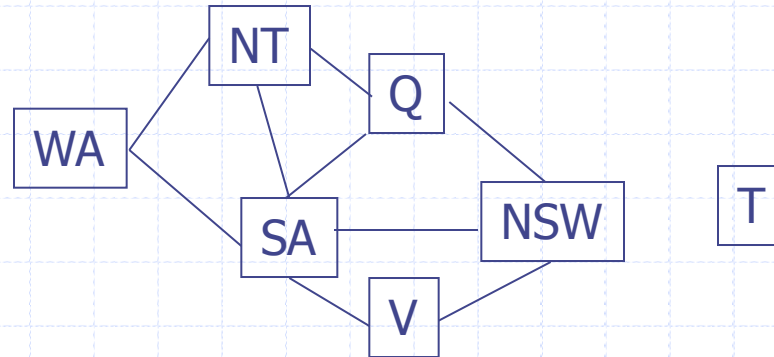
WA	NT	Q	NSW	V	SA	T
RGB	RGB	RGB	RGB	RGB	RGB	RGB

# Map Coloring



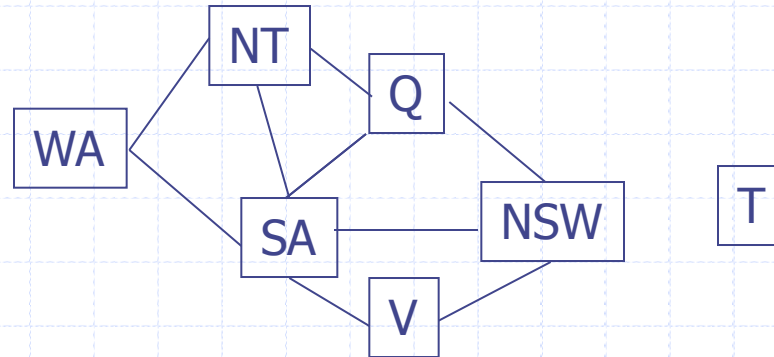
WA	NT	Q	NSW	V	SA	T
RGB	RGB	RGB	RGB	RGB	RGB	RGB
R	GB	RGB	RGB	RGB	GB	RGB

# Map Coloring



WA	NT	Q	NSW	V	SA	T
RGB	RGB	RGB	RGB	RGB	RGB	RGB
R	GB	RGB	RGB	RGB	GB	RGB
R	B	G	RB	RGB	B	RGB

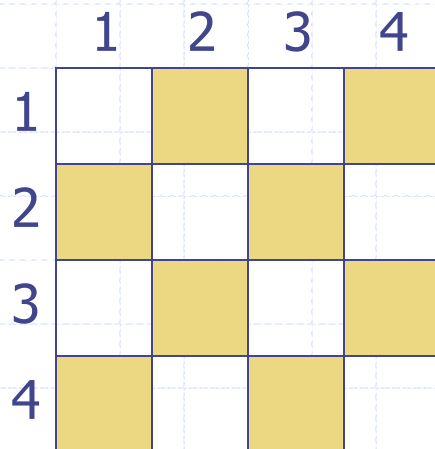
# Map Coloring



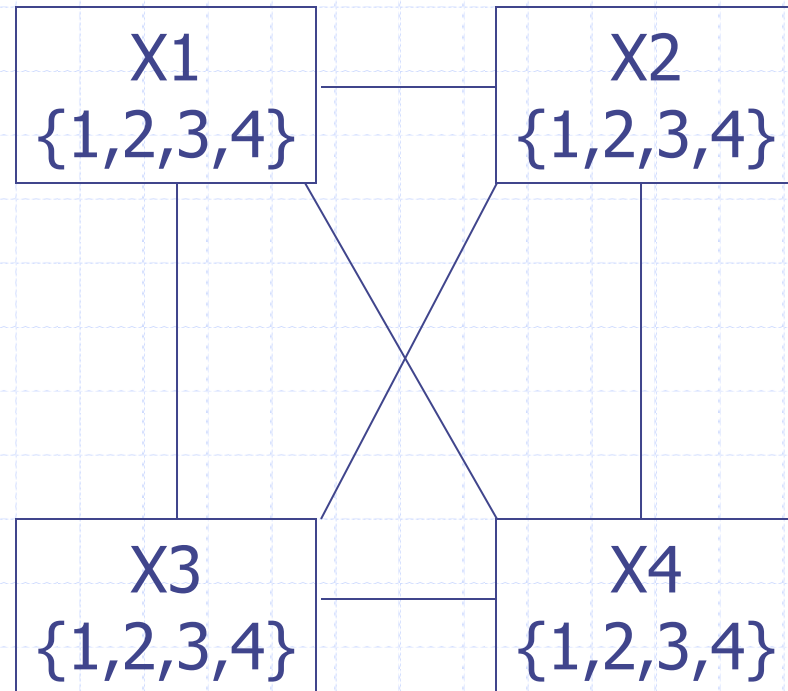
Impossible assignments that forward checking do not detect

WA	NT	Q	SA	NSW	V	T
RGB	RGB	RGB	RGB	RGB	RGB	RGB
R	GB	RGB	RGB	RGB	GB	RGB
R	B	G	RB	RGB	B	RGB
R	B	G	R	B		RGB

# Example: 4-Queens Problem

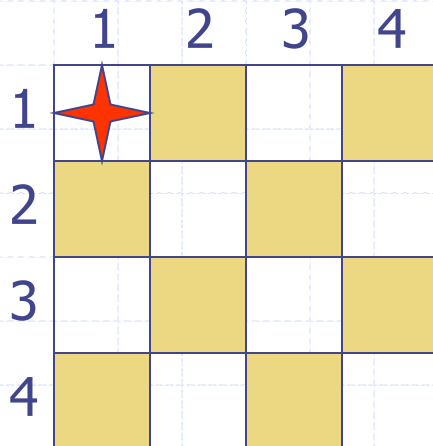


	1	2	3	4
1		Queen		Queen
2	Queen		Queen	
3		Queen		Queen
4	Queen		Queen	

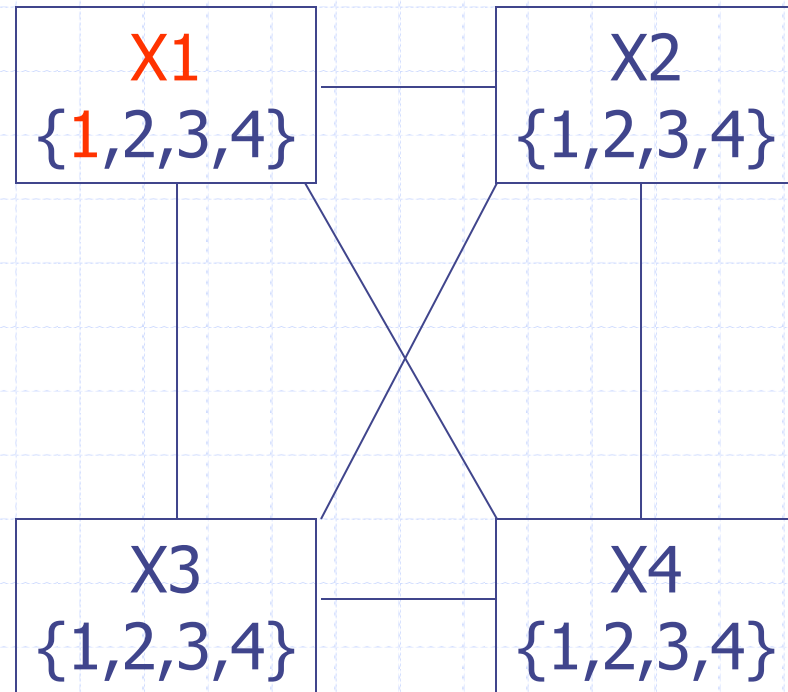











# Example: 4-Queens Problem

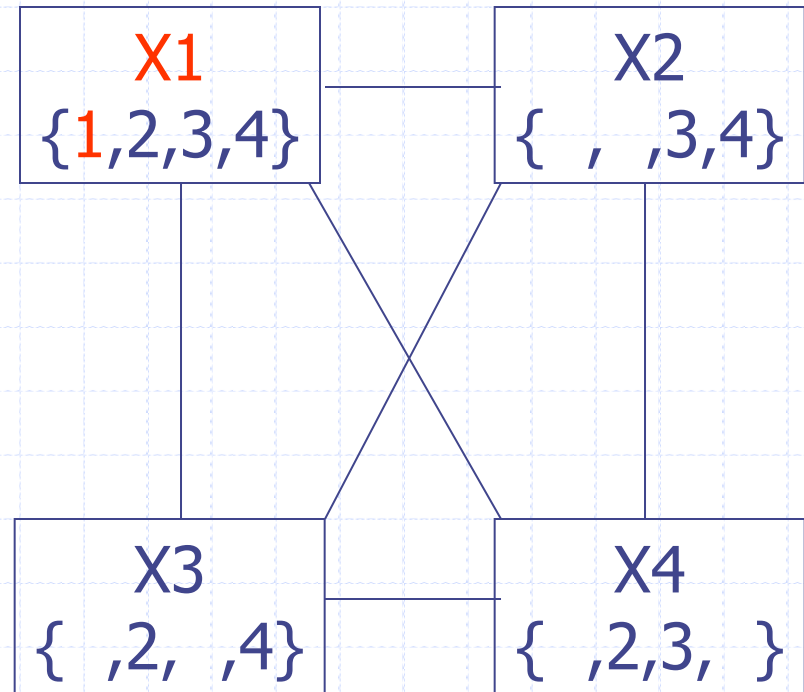


	1	2	3	4
1	★			
2				
3				
4				



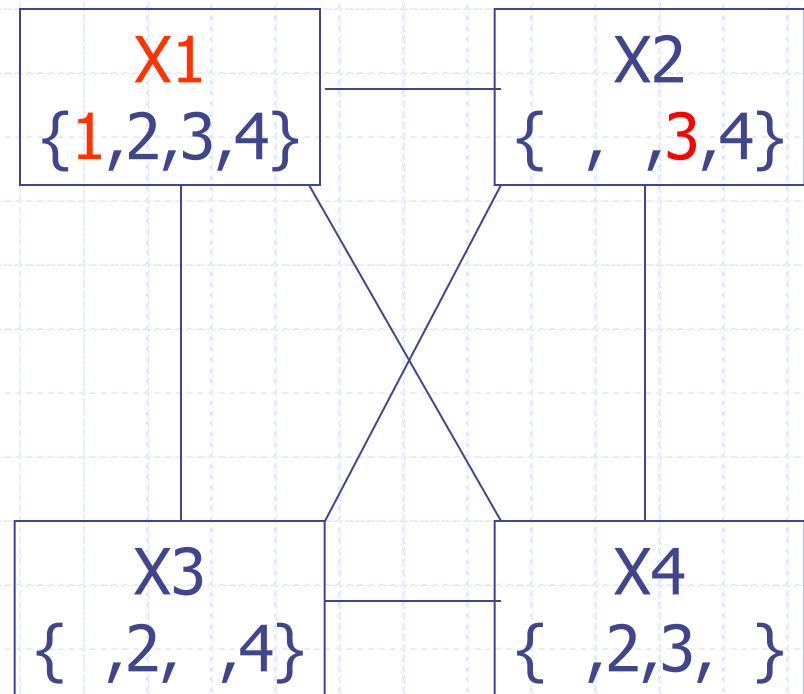
# Example: 4-Queens Problem

	1	2	3	4
1				
2				
3				
4				



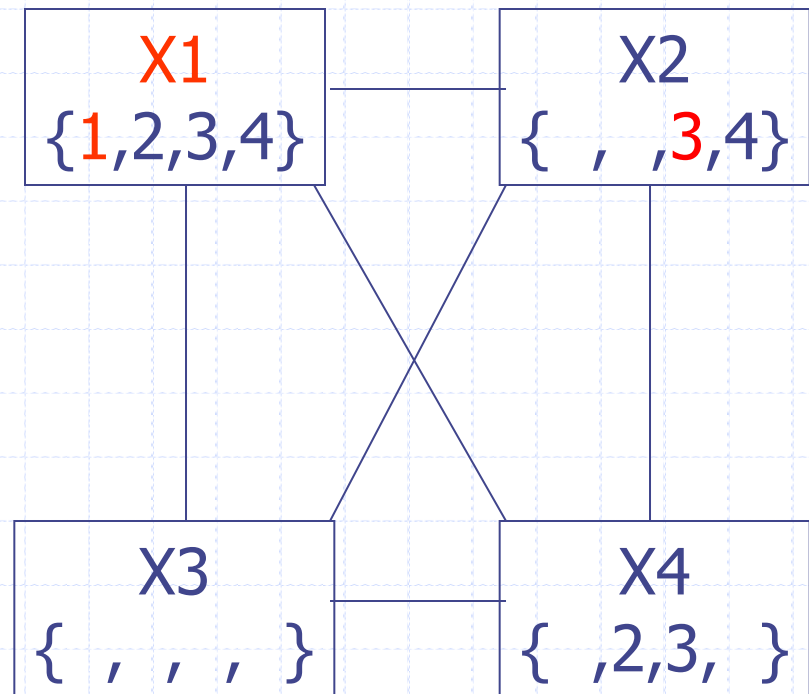
# Example: 4-Queens Problem

	1	2	3	4
1	★			
2	●	●	★	
3	●		●	
4	●			●



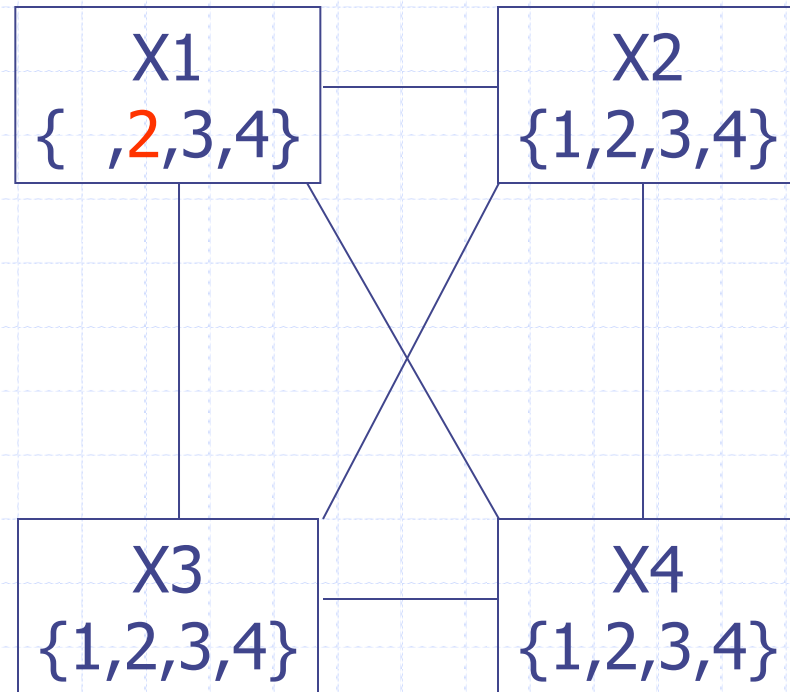
# Example: 4-Queens Problem

	1	2	3	4
1	★			
2	●	●	★	
3	●	●	●	●
4	●		●	●










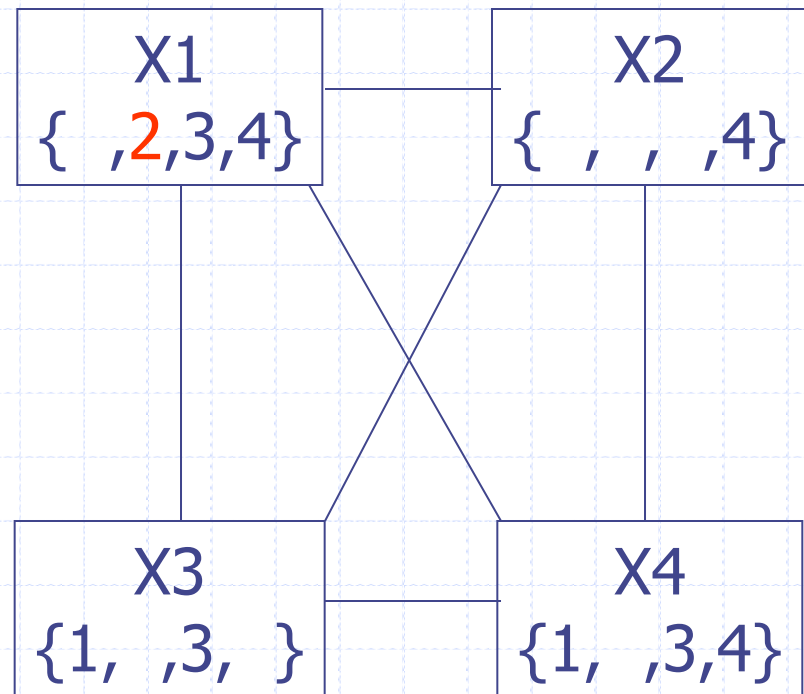
# Example: 4-Queens Problem

	1	2	3	4
1	BT			
2				
3				
4				



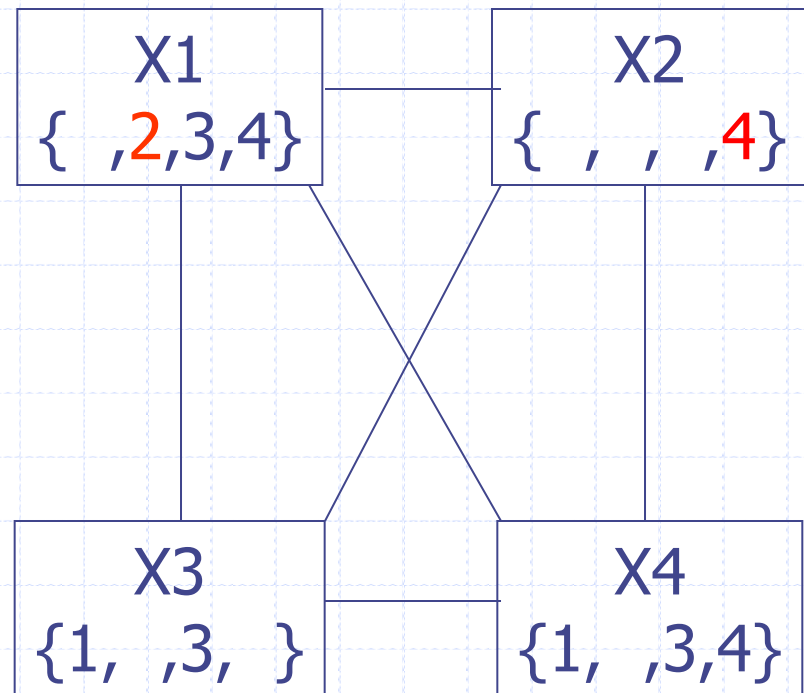
# Example: 4-Queens Problem

	1	2	3	4
1	BT			
2				
3				
4				



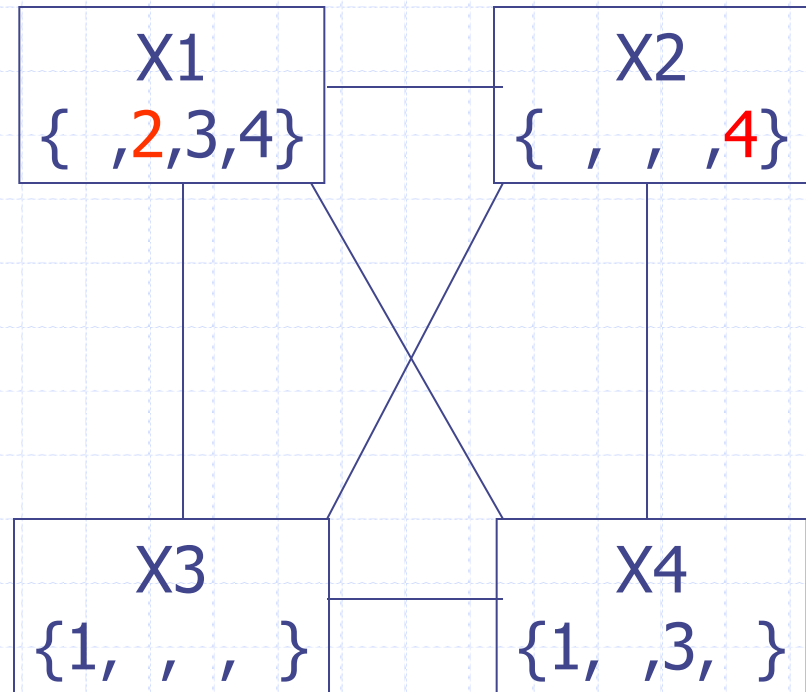
# Example: 4-Queens Problem

	1	2	3	4
1	BT	★		
2	●	●	●	★
3		●		●
4		●		



# Example: 4-Queens Problem

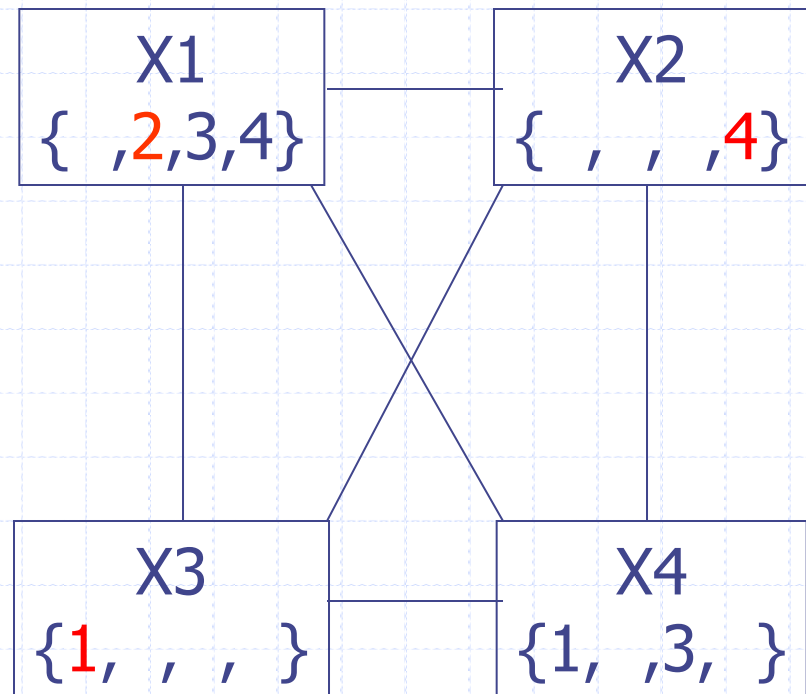
	1	2	3	4
1	BT	★		
2	●	●	●	★
3		●	●	●
4		●		●





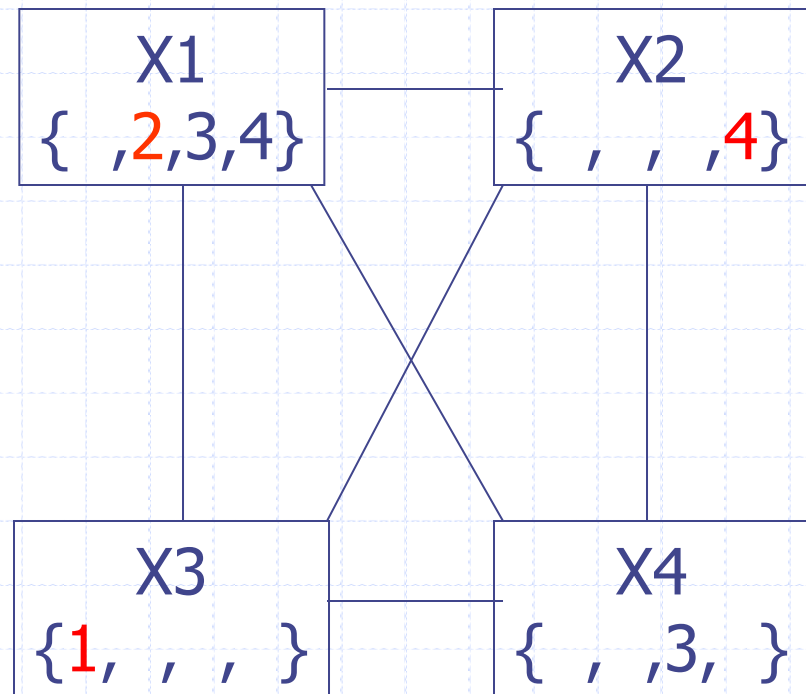
# Example: 4-Queens Problem

	1	2	3	4
1	BT	★		
2	●	●	●	★
3	★	●	●	●
4		●		●



# Example: 4-Queens Problem

	1	2	3	4
1	BT	★		
2	●	●	●	★
3	★	●	●	●
4	●	●		●



# Example: 4-Queens Problem

	1	2	3	4
1	BT	★		
2	●	●	●	★
3	★	●	●	●
4	●	●	★	●

