

# CSP Review

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# CSPs definition

- ▶ A constraint satisfaction problem consists of **three elements**:
  - ▶ A set of **variables**,  $X = \{X_1, X_2, \dots, X_n\}$
  - ▶ A set of **domains** for each variable:  $D = \{D_1, D_2, \dots, D_n\}$
  - ▶ A set of **constraints**  $C$  that specify allowable combinations of values.

# Basic Algorithm for CSP

## ► Backtracking Search(BTS)

```
250 def backtracking_search(csp,  
251                         select_unassigned_variable=first_unassigned_variable,  
252                         order_domain_values=unordered_domain_values,  
253                         inference=no_inference):  
254     """[Figure 6.5]"""  
255  
256     def backtrack(assignment):  
257         if len(assignment) == len(csp.variables):  
258             return assignment  
259         var = select_unassigned_variable(assignment, csp)  
260         for value in order_domain_values(var, assignment, csp):  
261             if 0 == csp.nconflicts(var, value, assignment):  
262                 csp.assign(var, value, assignment)  
263                 removals = csp.suppose(var, value)  
264                 if inference(csp, var, value, assignment, removals):  
265                     result = backtrack(assignment)  
266                     if result is not None:  
267                         return result  
268                 csp.restore(removals)  
269             csp.unassign(var, assignment)  
270         return None  
271  
272     result = backtrack({})  
273     assert result is None or csp.goal_test(result)  
274     return result
```

# Backtracking Search(BTS)

Backtracking search is simple and systematic:

- ▶ Start with no assignment Pick a variable and assign it.
- ▶ Repeat.
- ▶ If we hit a dead end, backtrack up the search tree until we find a variable that can have its value set to something different
- ▶ Backing all the way up the tree to the root and finding no more values means No solution.

DFS that chooses one variable at a time

# How to improving BTS

- ▶ Which variable should be assigned next?
- ▶ In what order should its values be tried?
- ▶ Can we detect inevitable failure early?



# Reference code

```
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266                     if result is not None:
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268                 csp.restore(removals)
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272     result = backtrack({})
273     assert result is None or csp.goal_test(result)
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```

# Improving Backtracking Efficiency

- ▶ **Which variable should be assigned next?**

**Minimum Remaining Values heuristic** :Choose the variable with the fewest legal values in its domain.)

- ▶ **In what order should its values be tried?**

**Least constraining value heuristic**: Given a variable, choose the least constraining value: the one that rules out the fewest values in the remaining variables )

- ▶ **Can we detect inevitable failure early?**

**Inference**: FC and using constraint propagation, e.g., arc consistency test.

# Eight-Queen Problem(1)

Q	X	X	X	X	X	X	X
X	X						
X		X					
X			X				
X				X			
X					X		
X						X	
X							X

Q	X	X	X	X	X	X	X
X	X	X					
X	Q	X	X	X	X	X	X
X	X	X	X				
X	X		X	X			
X	X			X	X		
X	X				X	X	
X	X					X	X

4+4+4+4+5

- ▶ Assign a queen to a position and remove all assignments inconsistent with it
- ▶ We have 8 possible choices for the 1st queen
- ▶ We have 6 possible choices for the 2nd queen



# Eight-Queen Problem(2)

Q	X	X	X	X	X	X	X
X	X	X			X		
X	Q	X	X	X	X	X	X
X	X	X	X				
X	X	Q	X	X	X	X	X
X	X	X	X	X	X		
X	X	X		X	X	X	
X	X	X			X	X	X

Q	X	X	X	X	X	X	X
X	X	X	X		X		X
X	Q	X	X	X	X	X	X
X	X	X	X	X	Q	X	X
X	X	Q	X	X	X	X	X
X	X	X	X	X	X		X
X	X	X		X	X	X	
X	X	X			X	X	X

- ▶ Assign a queen to a position and remove all assignments inconsistent with it
- ▶ We choose the variable with minimal possible values: principle of Minimum remaining values
- ▶ We have 4 possible choices for the 3rd queen
- ▶ We have 1 possible choice for the 4th queen

# Eight-Queen Problem(3)

Q	X	X	X	X	X	X	X
X	X	X	X		X		X
X	Q	X	X	X	X	X	X
X	X	X	X	X	Q	X	X
X	X	Q	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X		X	X	X	Q
X	X	X			X	X	X

Q	X	X	X	X	X	X	X
X	X	X	X	X	X	Q	X
X	Q	X	X	X	X	X	X
X	X	X	X	X	Q	X	X
X	X	Q	X	X	X	X	X
X	X	X	X	X	X	X	X
X	X	X	X	X	X	X	Q
X	X	X	X	Q	X	X	X

- ▶ Assign a queen to a position and remove all assignments inconsistent with it
- ▶ We choose the variable with minimal possible values: Minimum remaining values
- ▶ We have 1 possible choice for the 5th queen
- ▶ We have 1 possible choice for the 6th queen
- ▶ We assign the position for the 7th queen and find no inconsistent for the 8th queen
- ▶ backtrack to the 3rd queen