## CS 188 Summer 2024 Midterm Review CSPs Solutions

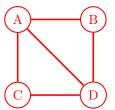
# Q1. CSPs: Apartments

Four people, A, B, C, and D, are all looking to rent space in an apartment building. There are three floors in the building, 1, 2, and 3 (where 1 is the lowest floor and 3 is the highest). Each person must be assigned to some floor, but it's ok if more than one person is living on a floor. We have the following constraints on assignments:

- A and B must not live together on the same floor.
- If A and C live on the same floor, they must both be living on floor 2.
- If A and C live on *different* floors, one of them must be living on floor 3.
- D must not live on the same floor as anyone else.
- D must live on a higher floor than C.

We will formulate this as a CSP, where each person has a variable and the variable values are floors.

(a) Draw the edges for the constraint graph representing this problem. Use binary constraints only. You do not need to label the edges.



(b) Suppose we have assigned C = 2. Apply forward checking to the CSP, filling in the boxes next to the values for each variable that are eliminated:



(c) Starting from the original CSP with full domains (i.e. without assigning any variables or doing the forward checking in the previous part), enforce arc consistency for the entire CSP graph, filling in the boxes next to the values that are eliminated for each variable:

Α	1	$\Box_2$	$\Box_3$
В	$\Box_1$	$\Box_2$	$\Box_3$
С	$\Box_1$	$\Box_2$	3
D	1	$\Box_2$	$\Box_3$

(d) Suppose that we were running local search with the min-conflicts algorithm for this CSP, and currently have the following variable assignments.

 $\begin{array}{c|c|c} A & 3 \\ B & 1 \\ C & 2 \\ D & 3 \end{array}$ 

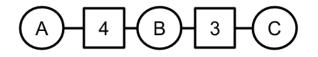
Which variable would be reassigned, and which value would it be reassigned to? Assume that any ties are broken alphabetically for variables and in numerical order for values.

A is reassigned value 2.

### Q2. Dudoku

Here we introduce Dudokus, a type of CSP problem. A Dudoku consists of variables and summation constraints. The circles indicate variables that can take integer values in a specified range and the boxes indicate summation constraints, which specify that the variables connected to the constraint need to add up to the number given in the box.

(a) Let's begin with linear Dudokus, where the variables can be arranged in a linear chain with constraints between adjacent pairs. For example, in the linear Dudoku below, variables A, B, and C need values assigned to them in the set  $\{1, 2, 3\}$  such that A + B = 4 and B + C = 3.



(i) How many solutions does this Dudoku have?



We can enumerate possible values of A and propagate to find the values of the other variables (or a contradiction). A=1, B=3 leaves no value for C. A=2, B=2, C=1. A=3, B=1, C=2. So two solutions.

(ii) Consider the general case of a linear Dudoku with n variables  $X_1, \ldots, X_n$ , each taking a value in  $\{1, \ldots, d\}$ . What is the complexity for solving such a Dudoku using the generic tree-CSP algorithm?

 $\bigcirc \mathcal{O}(nd^3) \qquad \bigcirc \mathcal{O}(n^2d^2) \qquad igodot \mathcal{O}(nd^2) \qquad \bigcirc \mathcal{O}(d^n)$ 

This is the standard complexity for tree-CSP, from a backward pass running O(n) arc consistency checks costing  $O(d^2)$  each.

- (iii) One proposal for solving linear Dudokus is as follows: for each possible value i of the first variable  $X_1$  in the chain, instantiate  $X_1$  with that value and then run generic arc consistency beginning with the pair  $(X_2, X_1)$  until termination; keep going until a solution is found or there are no more values to try for  $X_1$ . Which of the following are true?
  - This will correctly detect any unsolvable Dudoku.
  - This will always solve any solvable Dudoku.
  - This will sometimes terminate without finding a solution when one exists.
  - The runtime is  $O(nd^3)$ .

d iterations, each  $O(nd^2)$  for n consistency checks.

(iv) Binary Dudoku constraints are *one-to-one*, meaning that if one variable in a binary constraint has a known value, there is only one possible value for the other variable. Suppose we modify arc consistency to take advantage of one-to-one constraints instead of checking all possible pairs of values when checking a constraint. Now the runtime of the algorithm in the previous part becomes:

 $\bigcirc \mathcal{O}(nd) \qquad \bigcirc \ \mathcal{O}(nd^3) \qquad \bigcirc \ \mathcal{O}(n^2d^2) \qquad \bigcirc \ \mathcal{O}(nd^2)$ 

The cost of a consistency check becomes O(1), so d iterations, each O(n) for n consistency checks.

(b) Branching Dudokus

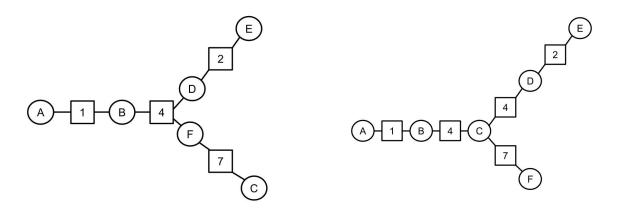


Figure 1: Example A

Figure 2: Example B

A branching Dudoku is one in which multiple linear chains are joined together. Chains can be joined at a summation node, as in example A above, or at a variable, as in example B above. Recall that a cutset is a set of nodes that can be removed from a graph to ensure some desired property. Which of the following are true?

Dudoku A is a binary CSP. No, it has a ternary constraint

Dudoku B is a binary CSP. Yes, all constraints are binary.

Dudoku A is a tree-structured CSP. No, this concept applies only to binary CSPs

Dudoku B is a tree-structured CSP. Yes, no cycles in the constraint graph

If variables B, D, and F are merged into a single megavariable, Dudoku A will be a tree-structured CSP. Yes, all remaining constraints will be binary

 $\Box$  If variables A and E are merged into a single megavariable, Dudoku B will be a tree-structured CSP. No, this creates a cycle

L The minimum cutset that turns Dudoku A into a set of disjoint linear Dudokus contains 3 variables. No, the smallest cutset has size 1 (any of B, D, F)

The minimum cutset that turns Dudoku B into a set of disjoint linear Dudokus contains 1 variable. Yes, any one of B, C, D, or F.

(c) Circular Dudokus

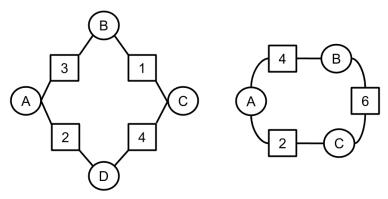


Figure 3: Example 1

(i) The figure above shows two examples of circular Dudokus. If we apply cutset conditioning with a minimal cutset and a tree-CSP solver, what is the runtime for a circular Dudoku with n variables and domain size d?

 $\bigcirc \mathcal{O}(d^{n-1}) \bigcirc \mathcal{O}(n^2d^2)$ 

The cutset size is 1, any variable will do. Instantiate it d times and solve  $O(nd^2)$  tree-CSP, so  $O(nd^3)$ .

 $\bigcirc \mathcal{O}(nd)$ 

 $\bigcirc \mathcal{O}(nd^3)$ 

(ii) Suppose that the variables in the circular Dudokus in the figure are assigned values such that all the constraints are satisfied. Assume also that the variable domains are integers in  $[-\infty, \infty]$ . Now consider what happens if we add 1 to the value of variable A in each Dudoku and then re-solve with A fixed at its new value. Which of the following are true?

Dudoku 1 now has no solution. False—we can subtract 1 from B and D and add 1 to C.

Dudoku 2 now has no solution. True—we can subtract 1 from B and C but then the 6 constraint is violated.

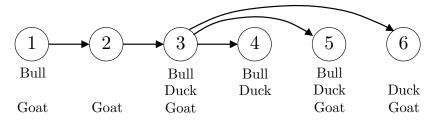
(iii) What can you conclude about the number of solutions to a circular Dudoku with n variables?

For even n, if there are any solutions, there will be infinitely many solutions, since we can add any number to A and make alternating changes around the circle to re-satisfy the constraints. For odd n, there can be at most one solution, because adding any number x to A and then propagating around the circle causes x to be subtracted again from A.

#### Q3. Farmland CSP

The animals in Farmland aren't getting along and the farmers have to assign them to different pens. To avoid fighting, animals of the same type cannot be in connected pens. Fortunately, the Farmland pens are connected in a tree structure.

(a) Consider the following constraint diagram that shows six pens with lines indicating connected pens. The remaining domains for each pen are listed below each node.



After assigning a bull to pen 5, enforce arc consistency on this CSP considering only the *directed* arcs shown in the figure. What are the remaining values for each pen?

Pen	Values
1	Bull
2	Goat
3	Duck, Goat
4	Bull, Duck
5	Bull
6	Duck, Goat

(b) What is the computational complexity of solving general tree structured CSPs with n nodes and d values in the domain? Give an answer of the form  $O(\cdot)$ .

#### $O(nd^2)$

- (c) This True/False question is worth 1 points. Leaving a question blank is worth 0 points. Answering incorrectly is worth −1 points.
  - (i) [<u>true</u> or false] If root to leaf arcs are consistent on a general tree structured CSP, assigning values to nodes from root to leaves will not back-track if a solution exists.
    True. Because the arcs are consistent, there is a valid value not matter which parent value was assigned.
- (d) Given 3 animal types, what is the most number of pens a tree structure could have, such that the computational complexity to solve the tree CSP is no greater than the computational complexity to solve a fully connected CSP with 10 pens?

 $3^8$ . A fully connected CSP is  $O(d^n)$ , while a tree structure is  $O(nd^2)$ . The intent of this question was to show that you could have  $3^8$  nodes in a tree structure and that would be roughly same amount of computation as a fully connected problem with 10 nodes ( $3^{10} = 3^8 3^2$ ). Unfortunately, this question is poorly worded, because computational complexity doesn't quite work with specific values like this.