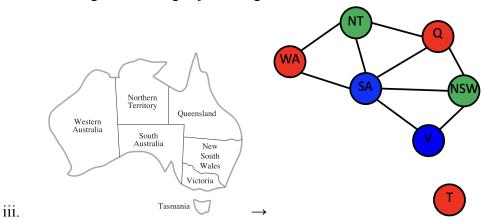
## CSP I

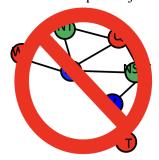
- 1. Tree Search
  - a. Expand tree to a new level
    - i. Consider new moves to apply!
    - ii. Leaf nodes in tree should be terminal states
      - 1. Problem when leaf nodes are nonterminals! (pretend our utility values are heuristic values)
  - b. Can apply this to single player games
- 2. Example
  - a. Want to assign a color (RGB) to each region of Australia
    - i. Model each region as a graph
    - ii. Add edge connecting adjacent regions

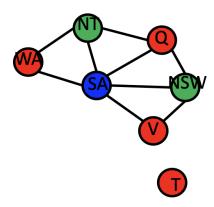


3. Trouble with Tree Search

ii.

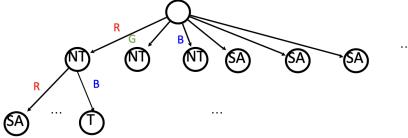
- a. What if we have constraints?
  - i. In this example: adjacent regions can't have the same color



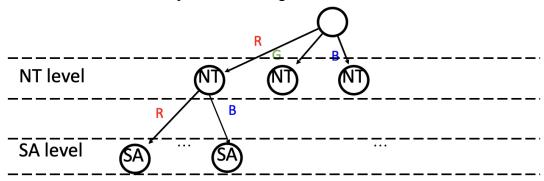


iii.

- b. Tree Search crazy inefficient
  - i. Will find correct answer (if one exists)
  - ii. Tree will consider all possible orderings of vertices!



- d. Tree is massive
- e. Ordering of Vertices doesn't need to be permuted!
  - i. Wasteful!
  - ii. Solution doesn't depend on ordering of vertices!



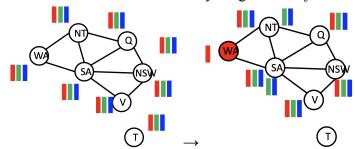
f.

- 4. CSP
  - a. A CSP or "Constrained Satisfaction Problem" meets this template
  - b. Variables  $X = \{X_1, X_2, ..., X_n\}$ 
    - i. Each variable X has its own domain
      - 1. Possible values that can be assigned to
    - ii. Each variable must be assigned a value
  - c. Constraints  $C = \{C_1, C_2, ..., C_m\}$ 
    - i. Each constraint is Boolean: relates variables to each other
    - ii. In map coloring:

1. Adjacent variables must have different colors

a. 
$$C_i \leftarrow X_1 != X_p$$

- d. An assignment:
  - i. Set of variables with their assignments
  - ii. A partial assignment = not all variables have an assignment
  - iii. A complete assignment = all variables have an assignment
  - iv. A legal assignment = assignment satisfies contraints
- e. Search for a complete & legal assignment:
  - i. Pick ordering of variables (reduces tree size)
  - ii. Dfs the tree!
- f. It is possible to not be able to find a complete & legal assignment!
- 5. Tree Pruning
  - a. Typically model CSPs as a constraint graph
    - i. Every n-ary (n > 2) constraint can be converted to a bunch of binary constraints
    - ii. Each variable becomes a vertex
    - iii. (unary/binary) constraints becomes edges
  - b. Prune the tree?
    - i. Tree is still massive
    - ii. Once we make partial assignment {WA = red}:
      - 1. Can we infer anything about adjacent vertices?

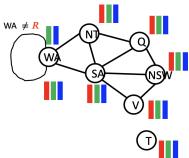


- 6. Node & Arc Consistency
  - a. Goal: prune domain D<sub>i</sub> for variable X<sub>i</sub>
    - i. Pruning domain = pruning tree!
  - b. How?

c.

- i. Lets say variable  $X_i$  has some unary constraints:
  - 1. Reduce domain to all values that satisfy this constraint
  - 2. Node Consistency (1-consistency)
- ii. Let's say X<sub>i</sub>, X<sub>j</sub> participate in some binary constraint c
  - 1. When we have an assignment  $X_i = v$ 
    - a. Reduce  $X_j$ 's domain to values that satisfy c knowing  $D_i = \{v\}$
    - b. Arc Consistency (2-consistency)

- c. After pruning  $D_j$  if  $D_j = 0$ 
  - i. Cannot find legal assignment!
  - ii. Stop expanding that branch!



7. AC-3 + REVISE: Forward Checking Neighbors

d.

```
a. queue \leftarrow \{C(X_i, X_i)\}_{(i,j)}
                                          # All constraints (assume to be binary)
while queue not empty:
        C(X_i, X_i) \leftarrow \text{queue.pop()}
        D_i, D_i \leftarrow domains of X_i & X_j
        Revised \leftarrow False
        for each x_i in D_i:
                 if no x_i in D_i satisfies C(X_i, X_i):
                 Possible Implementation:
                 for xj in Dj:
                         if \{Xi=xi, Xj=xj\} satisfies C(Xi, Xj):
                                  return False
                 return True
                 ,,,,,,
                         D_i.remove(x_i)
                         Revised ← True
        if revised is True:
        If Di becomes empty after revision, that means the constraint C(Xi, Xi)
        cannot be satisfied. Because there exists a constraint that cannot be
        satisfied, announce Failure.
        ,,,,,,
```

if D<sub>i</sub> empty.

return False

for each  $X_k$  in  $X_i$ .neighbors.remove( $X_j$ ):

queue.append( $C(X_k, X_i)$ )

return True

- b. If all constraints are satisfied, AC-3 returns True; otherwise, AC-3 returns False
- c. Sometimes AC-3 finds the solution too!