

Checking Consistency

Node consistency:

Ensure values in domain of variable X satisfy unary constraints

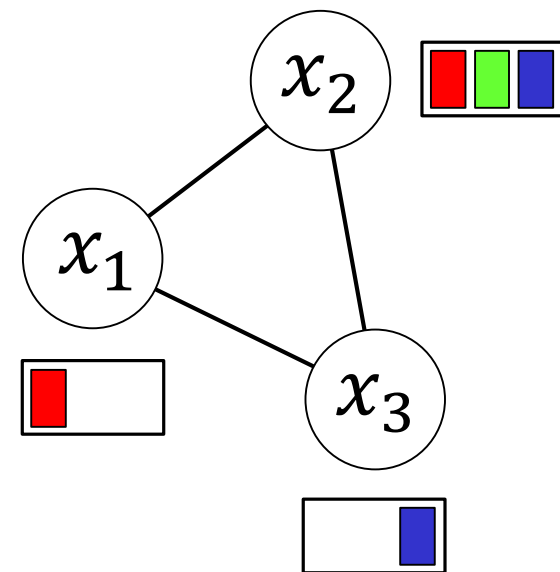
Arc Consistency (AC):

Ensure each value in domain D_i of X_i satisfies binary constraints

Binary constraint $C_{i,j}$ for vars $X_i \leftrightarrow X_j$

If X_i is AC with X_j then:

for each $x \in D_i$ there exists $y \in D_j$
such that $(x, y) \in C_{i,j}$



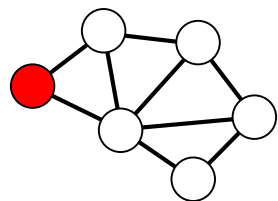
x_1 is AC with x_2 and x_3

x_3 is AC with x_1 and x_2

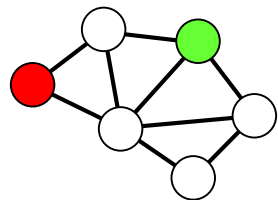
x_2 is **not** AC with x_1 and x_3

Forward Checking

Whenever a variable X is assigned, enforce arc consistency for all links $Y \rightarrow X$ for unassigned variables Y

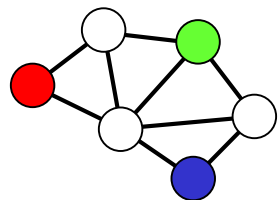


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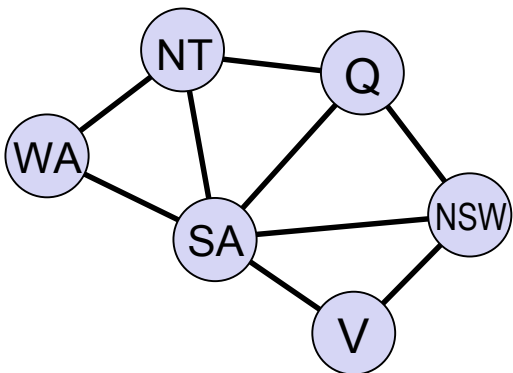
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But we could have identified it here!

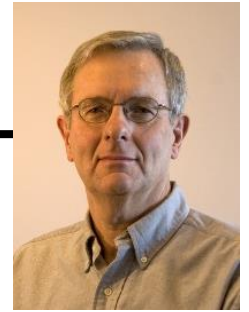


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No valid assignment!



Recursively Enforcing Arc Consistency



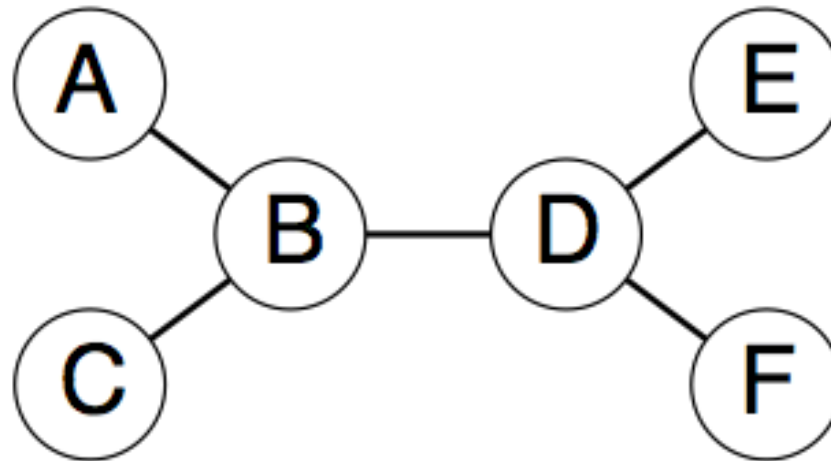
Alan Mackworth
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```
function AC-3(csp)  
  while queue is not empty do  
     $(X_i, X_j) \leftarrow \text{queue.POP}()$   
    revised  $\leftarrow$  false  
    for each  $x$  in  $D_i$  do  
      if there is no value  $y \in D_j$  satisfying  $C_{i,j}$  then  
        remove  $x$  from  $D_i$   
        revised  $\leftarrow$  true  
      if revised then  
        if  $\text{size}(D_i) = 0$  then return false  
        for each  $X_k$  neighbor of  $X_i$  (excluding  $X_j$ ) do  $\text{queue.PUSH}((X_k, X_i))$   
  return true
```

Goes beyond forward checking by propagating constraints

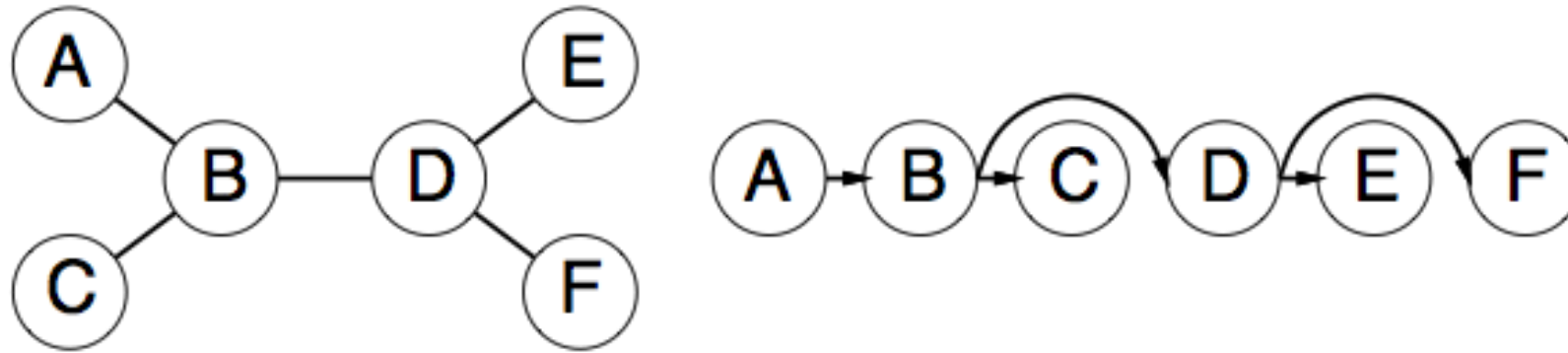
Tree-Structured CSPs

If the constraint graph has no loops (also called cycles), then the CSP can be solved in $O(nd^2)$ time (vs $O(d^n)$ in general)



Solving Tree-Structured CSPs

1. Choose a variable as root, order variables from root to leaves such that every node's parent precedes it in the ordering



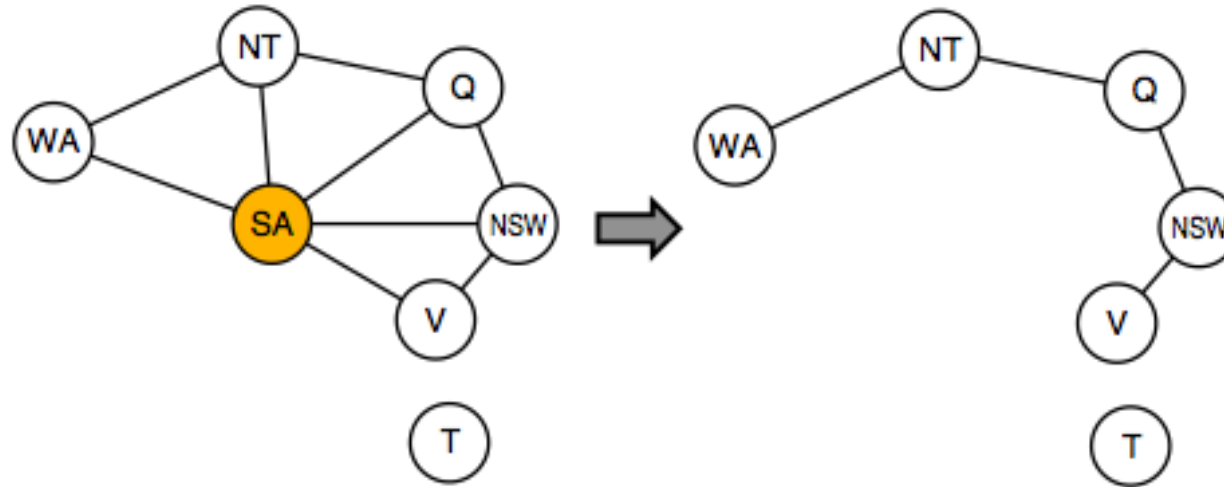
2. For j from n down to 2, apply REMOVEINCONSISTENT($Parent(X_j), X_j$)
3. For j from 1 to n , assign X_j consistently with $Parent(X_j)$

Cutset Conditioning



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Conditioning: instantiate a variable, prune its neighbors' domains



Cutset conditioning: instantiate (in all ways) a set of variables such that the remaining constraint graph is a tree

Cutset size $c \Rightarrow$ runtime $O(d^c \cdot (n - c)d^2)$, very fast for small c

Summary

Node and arc consistency refer to whether the domains for a set of variables satisfy the constraints

Forward checking enforces arc consistency for all neighbors of a variable that has been assigned during search

Constraint propagation goes further and enforces arc consistency recursively until all domains are consistent (AC-3 algorithm)

The **Maintaining Arc Consistency** version of backtracking search calls AC-3 after each variable assignment

Tree-structured graphs can be solved orders of magnitude faster than general graphs. **Cutset conditioning** can be used with graphs that are “close” to trees