

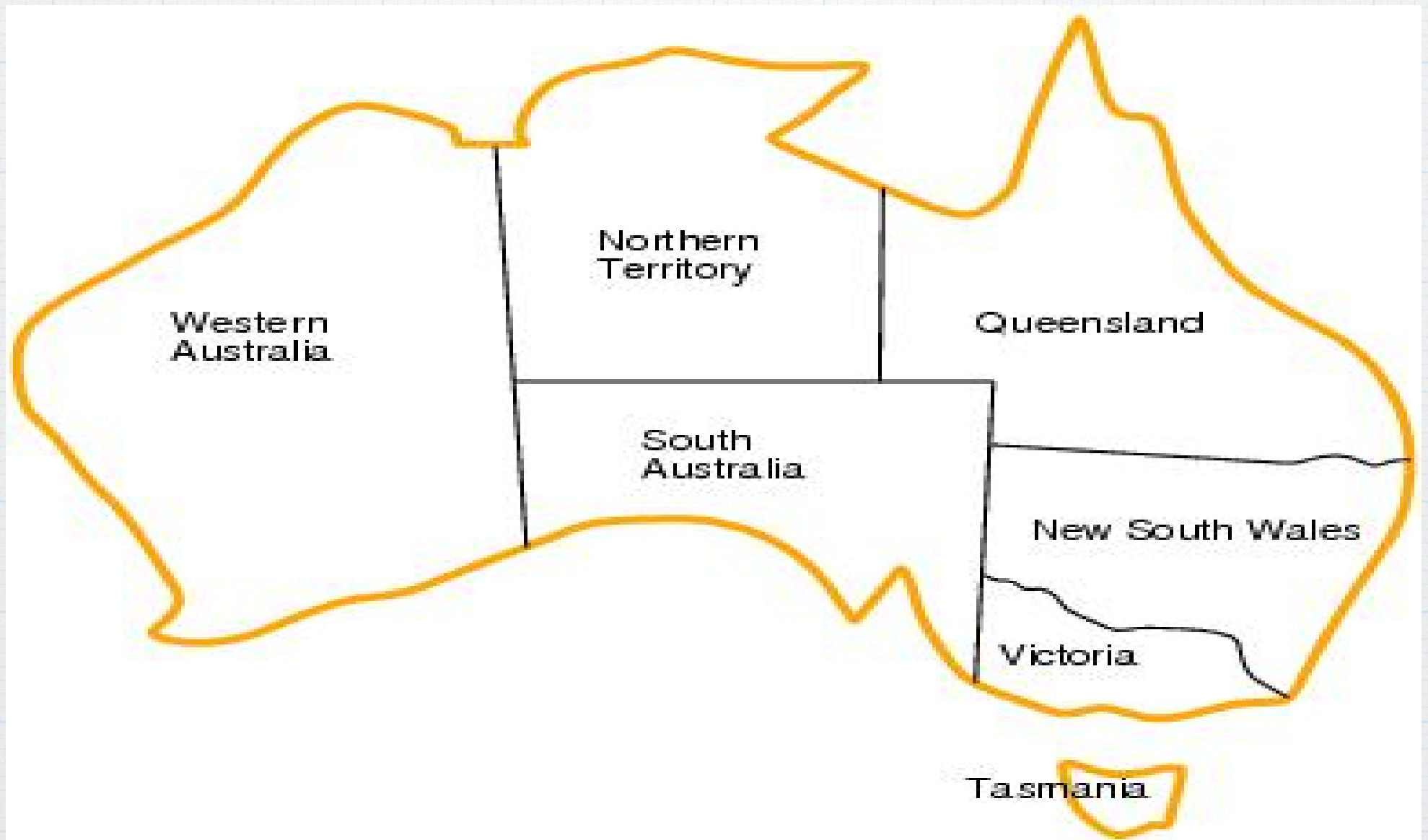
# Project One

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Graph Coloring: A Constraint Satisfaction Problem



# Map Colouring









# An example CSP

## (Constraint Satisfaction Problem)

- \* Variables (Regions): WA, NT, Q, NSW, V, SA, T
- \* Domains (Colours): {red, green, blue}
- \* Constraints: Adjacent regions must have different colours.



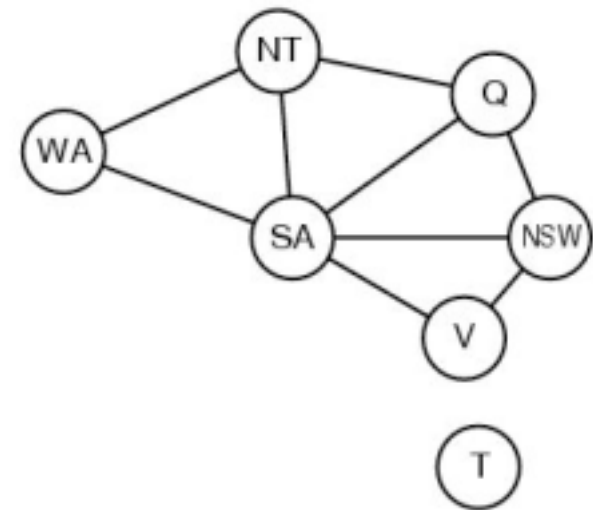
# Solution



- \* WA=red, NT=green, Q=red, NSW=green, V=red, SA=blue, T=green



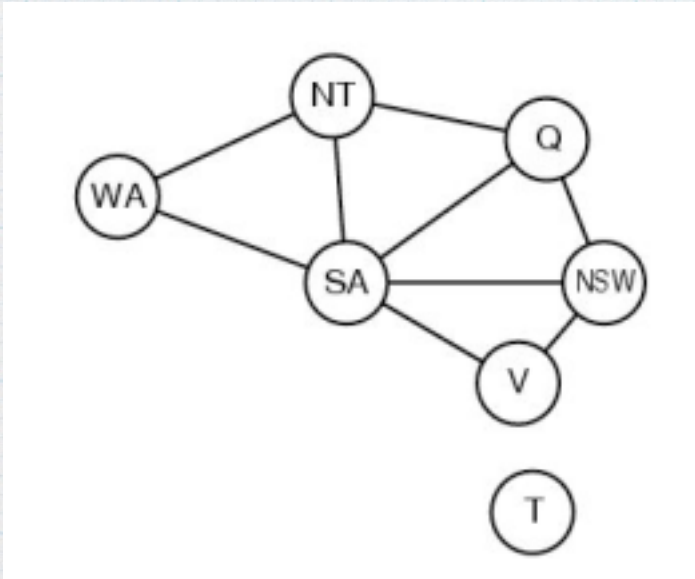
# Representation: Graph





# Benefits of Representation

## Constraint Graph



- \* Nodes are variables
- \* Edges show constraints
- \* Standard data structure
- \* Standard algorithms



# More about CSP: Variables

- \* Discrete Variables

- \* Finite Domains

- \* (Boolean satisfiability, Map Coloring)

- \* Infinite Domains

- \* (Job Scheduling - start/ending dates)

- \* Continuous Variables



# More about CSP: Constraints

- \* Unary Constraints

- \* e.g. SA  $\neq$  green (involves one var)

- \* Binary Constraints

- \* e.g. SA  $\neq$  WA (involves two vars)

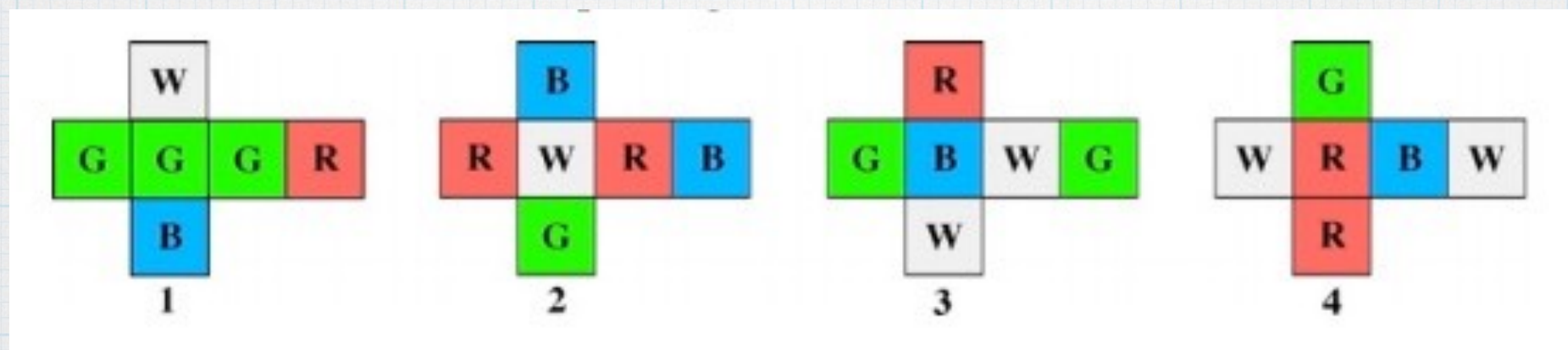
- \* Higher Order

- \* e.g. cryptarithmic problems

- \* Preference (soft constraints)

- \* e.g. red is better than blue (use costs)





Patented by F. Schossow 1900, popularized by Parker Brothers 1967



# Instant Insanity represented as a Graph

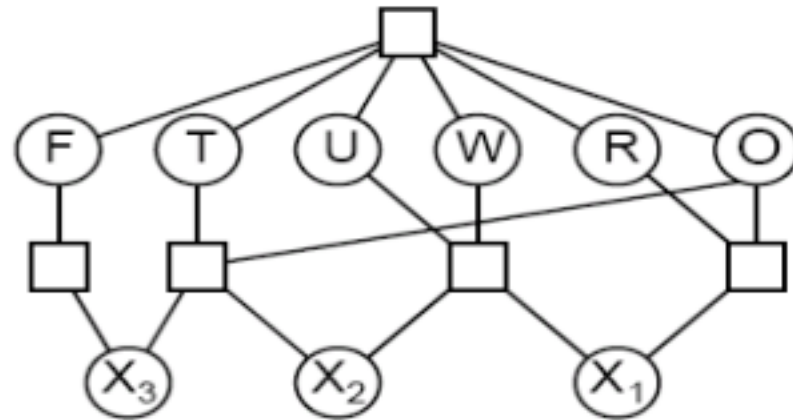
1. Draw four *vertices*, and label them *green*, *white*, *blue*, *red*; it doesn't matter how they are arranged (after solving, the figure below was re-drawn to look nicer).
2. Number the cubes from 1 to 4 and for each of the three pairs of opposite faces on each cube, draw an *edge* between the two vertices of the corresponding colors and label that edge by that cube number (a total of 12 edges).
3. Look for a *Hamilton cycle* (that passes through each vertex once) with a different label on each edge; this cycle is shown with the thick edges below (it is also ok to use set of smaller disjoint cycles but that doesn't help here).
4. Find a second Hamilton cycle (or set of cycles) with a different label on each edge, that does not use any of the edges in the first cycle; this cycle is shown with the hashed edges in the figure below.
5. Traverse the thick edge cycle to set the top edges (green to blue set the top and bottom of cube 3, blue to white to set the top and bottom of cube 2, white to red to set the top and bottom of cube 4, and red to green to set the top and bottom of cube 1).
6. Set the front/back edges with the hashed cycle by rotating each cube (without changing the top and bottom).

Solution on wikipedia



# Cryptarithmic

$$\begin{array}{r} \text{TWO} \\ + \text{TWO} \\ \hline \text{FOUR} \end{array}$$



**Variables:**  $F T U W R O X_1 X_2 X_3$

**Domains:**  $\{0, 1, 2, 3, 4, 5, 6, 7, 8, 9\}$

**Constraints**

$\text{alldiff}(F, T, U, W, R, O)$

$O + O = R + 10 \cdot X_1$ , etc.

For n-ary constraints,  
add nodes that represent combinations of values.



# CSP as Search

- \* Initial State: all variables unassigned
- \* Successor: Assign a value to unassigned variable without violating constraints
- \* Goal: Assign every variable a value
- \* Path: Assignment order unneeded; just print result



# CSP as Search

- \* All solutions are found at depth  $N$ 
  - \* can (should) use depth first search
- \* Branching factor is  $N\mathcal{D}$  (variables \* domain) at top level, or  $(N-L)\mathcal{D}$  at level  $L$ .
- \* This means  $N!\mathcal{D}^N$  leaves;  $\mathcal{D}^N$  assignments



# Backtracking

- \* Depth first search
- \* Choose a value for one variable;  
backtrack if there are no available values
- \* Uniformed (Blind) Search
  - \* Generally, poor performance



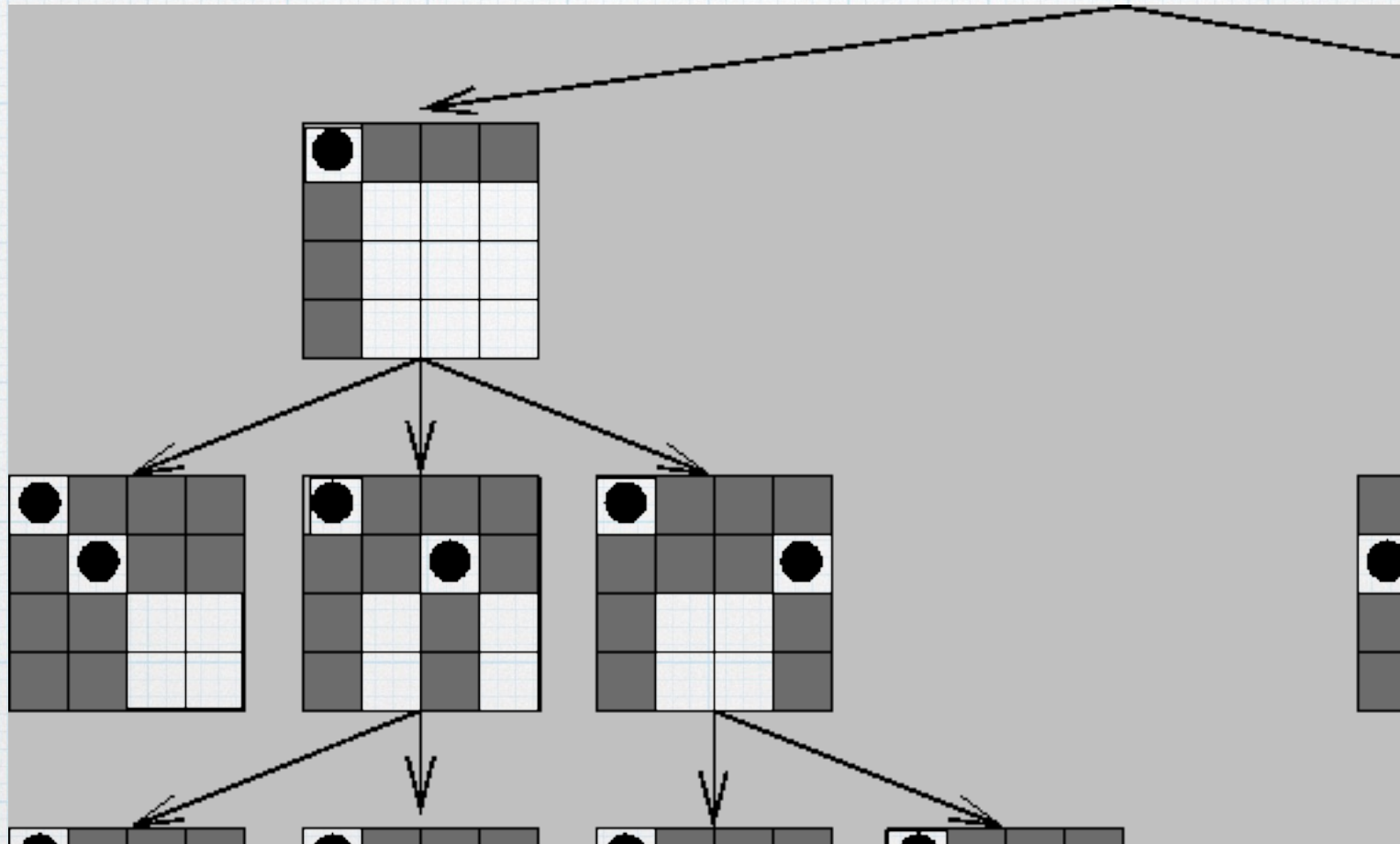
# Backtracking Search

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function BACKTRACKING-SEARCH(csp)
  return RECURSIVE-BACKTRACKING({}, csp)
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```



# ex: N-Queens Problem





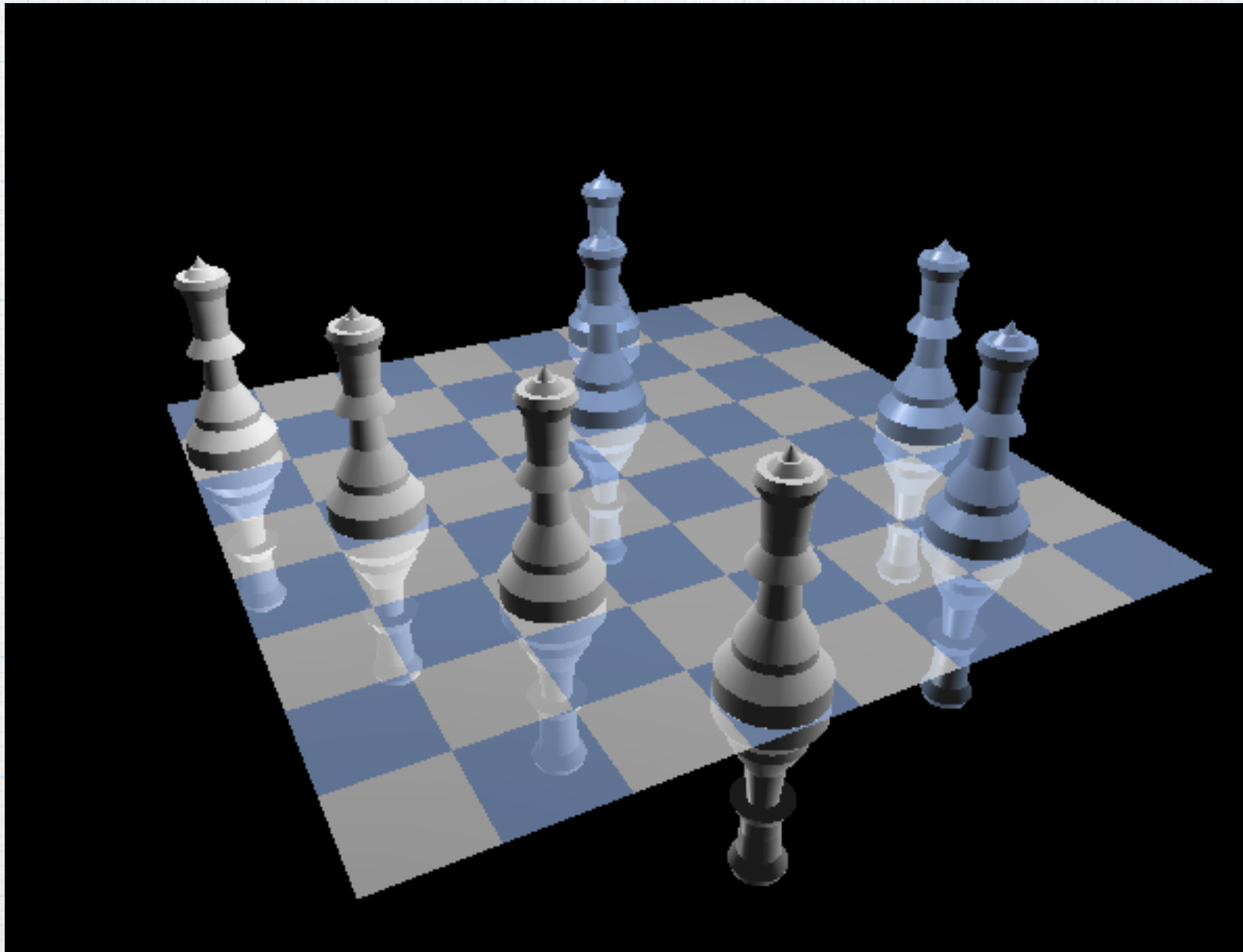
# N-Queens as a CSP

- Chessboard puzzle
- e.g. when  $n = 8$ ...
  - place 8 queens on a 8x8 chessboard so that no two attack each other
- Variable  $x_i$  for each row  $i$  of the board
- Domain =  $\{1, 2, 3 \dots, n\}$  for position in row
- Constraints are:
  - $x_i \neq x_j$  queens not in same column
  - $x_i - x_j \neq i - j$  queens not in same SE diagonal
  - $x_j - x_i \neq i - j$  queens not in SW diagonal



Often, the most difficult part of solving a CSP is formulating the problem.





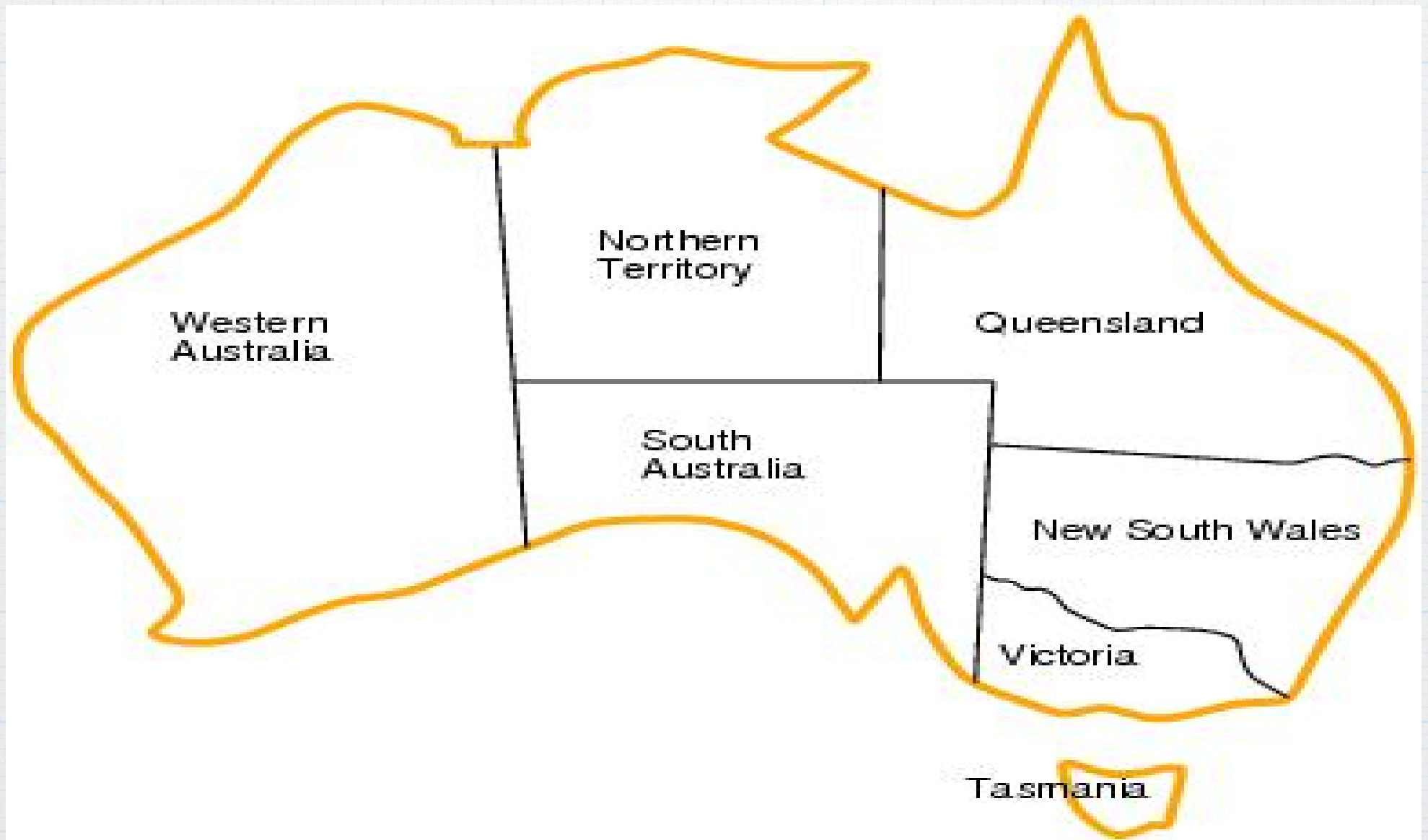
<http://www.sirgalahad.org/paul/sw/winlock/img/queens.png>



(n-queens soln)



# Map Colouring



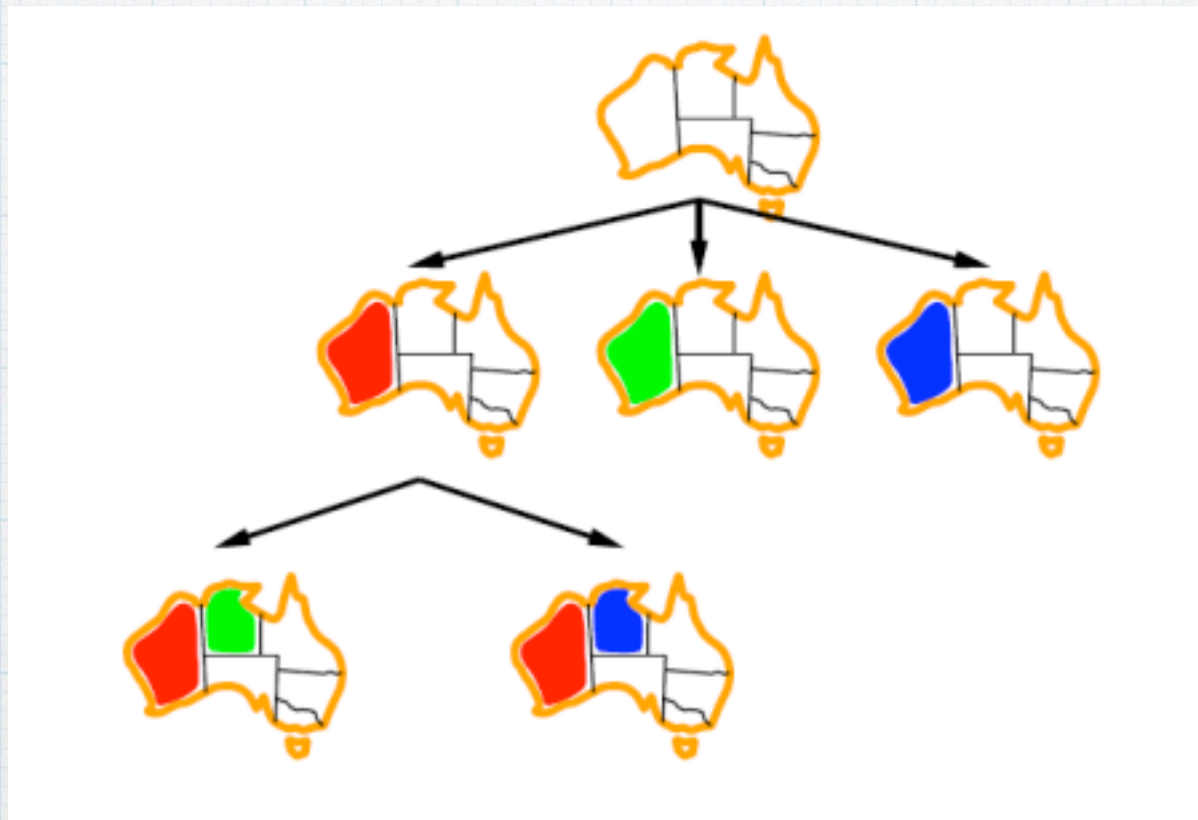


# Example



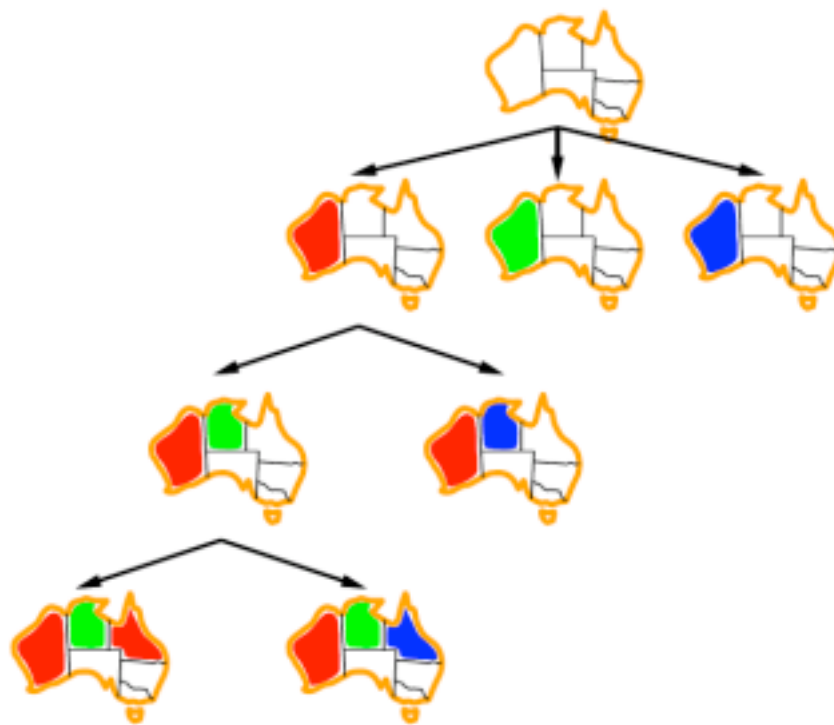


# Example





# Example





# Your Assignment

- \* Read a graph (map) from data file
- \* Color it with 4 colors
- \* Check online problem for particulars



# input data file - usa.txt

```
al, fl, ms, tn, ga  
ar, la, tx, ok, mo, tn, ms  
az, ca, nv, ut, nm  
ca, az, nv, or  
co, wy, ut, nm, ok, ks, ne  
ct, ny, ma, ri  
de, md, pa, nj  
fl, al, ga  
:
```



# Why Four Colors?

The four color theorem states that any plane separated into regions, such as a political map of the counties of a state, can be colored using no more than four colors in such a way that no two adjacent regions receive the same color. Two regions are called adjacent if they share a border segment, not just a point.

Conjectured in 1852 by Francis Guthrie.

[http://en.wikipedia.org/wiki/Four\\_color\\_theorem](http://en.wikipedia.org/wiki/Four_color_theorem)



# Why Four Colors?

**It was not until 1976 that the four-color conjecture was proven by Kenneth Appel and Wolfgang Haken at the University of Illinois. They were assisted in some algorithmic work by J. Koch.**

[http://en.wikipedia.org/wiki/Four\\_color\\_theorem](http://en.wikipedia.org/wiki/Four_color_theorem)



J. Koch ?



# Why Four Colors?

The proof reduced the infinitude of possible maps to 1,936 configurations which had to be checked one by one by computer. The work was independently double checked with different programs and computers. However, the proof was over 500 pages of hand written counter-counter-examples. The computer program ran for hundreds of hours.

[http://en.wikipedia.org/wiki/Four\\_color\\_theorem](http://en.wikipedia.org/wiki/Four_color_theorem)



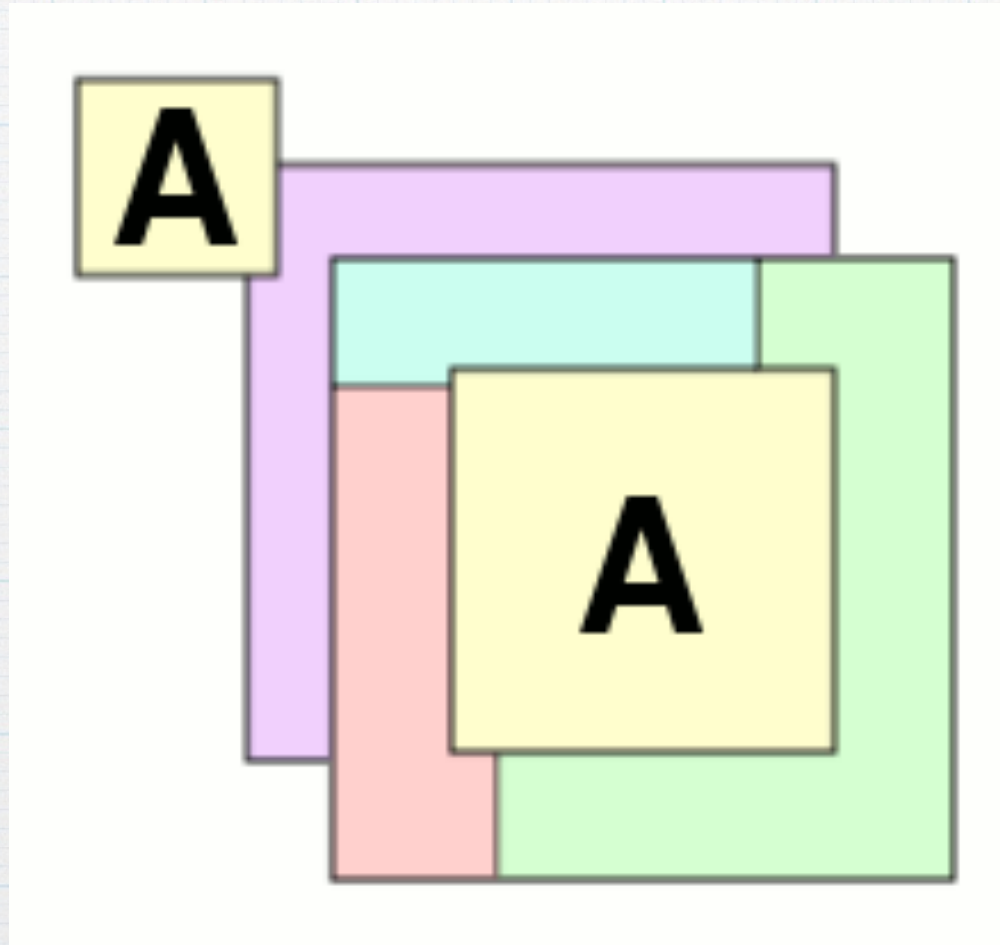
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**In 2004 Benjamin Werner and Georges Gonthier formalized a proof of the theorem inside the Coq theorem prover. This removes the need to trust the various computer programs used to verify particular cases — it is only sufficient to trust the Coq prover.**

[http://en.wikipedia.org/wiki/Four\\_color\\_theorem](http://en.wikipedia.org/wiki/Four_color_theorem)



# Contiguous, Planar Maps



[http://en.wikipedia.org/wiki/Four\\_color\\_theorem](http://en.wikipedia.org/wiki/Four_color_theorem)





<http://www.barron.palo-alto.ca.us/history/graphics/crayons2.jpg>



# How Good is Backtracking?

- \* USA 4 coloring (>1,000,000)
- \* n-Queens 2 to 50 (>40,000,000)
- \* Zebra 3,859,0000

[Russel & Norvig 2003]



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# The Zebra Problem



There are five houses, each of a different color, inhabited by men of different nationalities, with different pets, drinks, and cigarettes. The Englishman lives in the red house. The Spaniard owns the dog. The ivory house is immediately to the left of the green house, where the coffee drinker lives. The milk drinker lives in the middle house. The man who smokes Old Golds also keeps snails. The Ukrainian drinks tea. The Norwegian resides in the first house on the left. The Chesterfields smoker lives next door to the fox owner. The Lucky Strike smoker drinks orange juice. The Japanese man smokes Parliaments. The horse owner lives next to the Kools smoker, whose house is yellow. The Norwegian lives next to the blue house.

- 1 Who drinks water?
- 2 Who owns the Zebra?
- 3 Is there only a unique solution to this problem?



Often, the most difficult part of solving a CSP is formulating the problem.

(now you are convinced!)



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# Improve efficiency

- \* Which variable should be assigned next?
- \* In what order should its values be tried?
- \* Can we detect failure earlier?
- \* Can we take advantage of structure?



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- \* Which variable should be assigned next?
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- \* Can we take advantage of structure?

⇒ Informed Search



# Study Question

**Design a representation  
to solve the Zebra Problem.**



# Now Get To Work!



[http://www.randypeterman.com/g2/albums/  
userpics/10001/normal\\_abby\\_crayons.jpg](http://www.randypeterman.com/g2/albums/userpics/10001/normal_abby_crayons.jpg)