

## (General) Problem Solving

Many problems can be solved by  
*searching* a "problem space" of  
*representations*

## Law of Representation

- Objects of Interest are MAPPED into bits/symbolic form, held as bits or state
- mechanical operations are performed *on the representations*
- Results hold through the inverse map

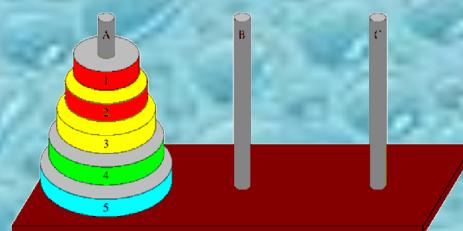


## Can a computer "solve" problems?

- Puzzles are an area where human intelligence seems necessary
  - Few animals can solve Rubiks Cube!
- Many kinds
  - Towers of Hanoi
  - Sliding Block Puzzles
  - Combination Puzzles
  - Interlocking Puzzles
  - Jigsaw Puzzles
  - Cryptographic Puzzles
  - etc.

## Towers of Hanoi

- Three posts with n disks
- Goal is to move disks from one post to another without ever putting larger on smaller
- Takes  $2^n - 1$  steps



## Water Jug Problem

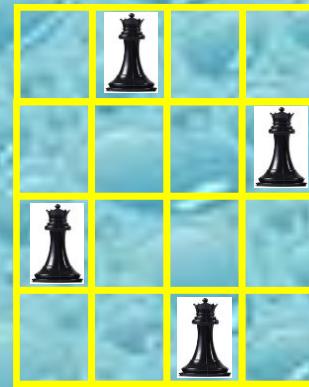
- Two friends who have an eight-quart jug of water wish to share it evenly. They also have two empty jars, one holding five quarts, the other three. How can they each measure exactly 4 quarts of water *since pouring 4 qts from 8->5 is not a legal move?*

## Coin Puzzle

- infinite family of puzzles
  - what 5 coins add up to 42c?
  - what 6 coins add up to 88c?
- many puzzles are insoluble
  - but its trivial to create solvable puzzles!
- humans use heuristics
  - try quarters first
  - take pennies to get to multiple of 5
  - etc

## N Queens

- **Problem:** Place N queens on an N by N chessboard without them attacking each other



**How big are these problems?  
Roughly how many configurations?**

Water Jug	20
Hanoi	$n^3$
Coin Puzzle	polynomial in c coins
TicTacToe	$3^9$
N-queens	$n!$ placements
Game	Pieces positions

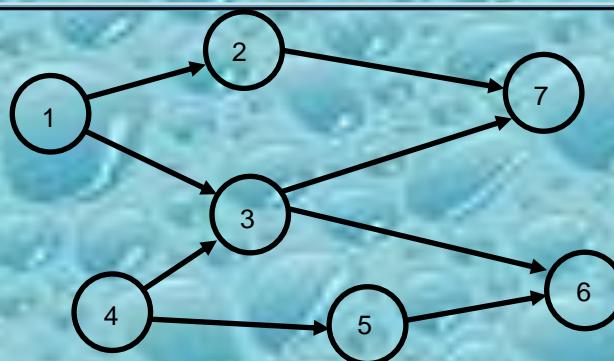
*We often cannot store the whole thing!*

## Problem Space Approach

- **Formalize Task as**

- A set of discrete states
- Operations which make legal transitions between the states
- Initial and Goal States
  - or goalp function
  - Solving the problem means finding a path from an initial state to a goal state
  - **REPRESENTATION PLUS SEARCH**

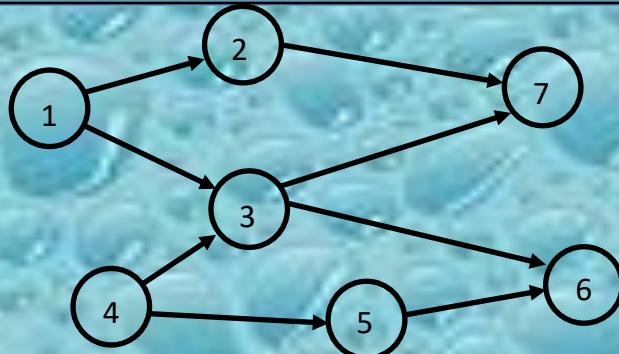
## A Graph is a set $\{V, E\}$



$$V = \{1, 2, 3, 4, 5, 6, 7\}$$

$$E = \{(1, 2), (1, 3), (2, 7), (3, 7), (4, 3), (4, 5), (5, 6), (3, 6)\}$$

## A Problem Space is a graph..



Vertices are representations of problem states  
 Edges are transitions corresponding to "Moves",  
 calculated by logical rules or code

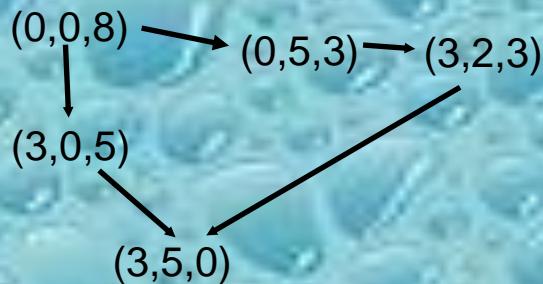
Usually, we don't enumerate the whole space.

### Water Jug Problem

capacity is (3,5,8)

state is (x y z) oz in each jug ALL < capacity

You pour from one to another the max you can



Goal is (0 4 4)

# Towers of Hanoi

- Three posts with n disks
- Goal is to move all disks from one post to another without ever putting larger on smaller
- Representations can be in 3 lists of symbols
  - (1 2 3) nil nil
  - (2 3) (1) nil
  - (3) (1) (2)
  - (3) nil (1 2)
  - nil (3) (1 2)
  - (1) (3) (2)
  - (1) (2 3) nil
  - nil (1 2 3) nil

## Hanoi as a problem space

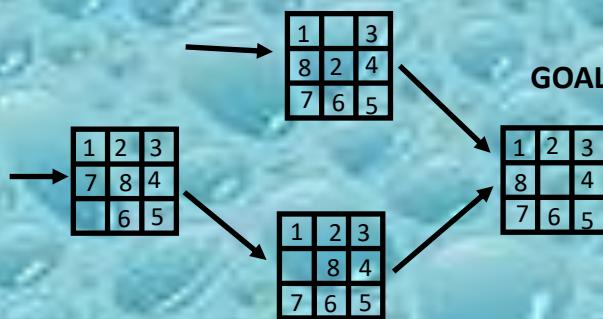
- (defun hlegal (post1 post2)
  - (and post1 (or (null post2)(< (car post1)(car post2)))))
- (defun hnnext (state &aux ans)
  - (let ((one (car state)))
    - (two (cadr state))
      - (thr (caddr state)))
    - (if (hlegal one two)
      - (push (list (cdr one)(cons (car one) two) thr) ans))
        - (if (hlegal one thr)
          - (push (list (cdr one) two (cons (car one) thr)) ans))
            - (if (hlegal two one)
              - (push (list (cons (car two) one) (cdr two) thr) ans))
                - (if (hlegal two thr)
                  - (push (list one (cdr two)(cons (car two) thr)) ans))
                    - (if (hlegal thr one)
                      - (push (list (cons (car thr) one) two (cdr thr)) ans))
                        - (if (hlegal thr two)
                          - (push (list one (cons (car thr) two) (cdr thr)) ans))
                            - ans))

## N Queens

- **Problem:** Place N queens on an N by N chessboard without them attacking each other
- **Representation can be**
  - array of N xN with 1-N integers for queens
  - list of (row,col) pairs where queens are
  - bit array with 1's where queens are placed
  - Vector of N columns (implicit row order)

## 8-Puzzle Example

- **Each Vertex is an arrangement of tiles**
- **Edges correspond to simple movements**
- **Goal is tiles in particular order**



## How to represent the Problem?

- **Each state is 3 by 3 matrix**
  - Numbers 1-8 represent tiles
  - Number 0 represents empty space
  - (Or just a list of 9 numbers 0-8)
- **Transitions correspond to legal moves of the puzzle (Law of representation)**

## How to compute the transitions?

- Use Logical Rules, encoded as computer programs which act upon the chosen representation to construct new vertices:
  - 1) If the hole is in the middle, move in a side (4 rules)  
 if  $a[2,2]=0$  then pick [1,2] [3,2] [2,1] or [3,1]
  - 2) If the hole is in corner, move a side (8 rules)  
 if  $a[1,1]=0$ , pick [1,2] or [2,1]
  - 3) if the hole is in side, move middle or corner (12 rules)  
 if  $a[1,2]=0$  then pick [1,1] [2,2] or [1,3]

## Setup for 8-puzzle

- (defparameter \*goal\* '(1 2 3 8 0 4 7 6 5))
- (defparameter \*moves\*
 • '((d r)(d r l)(d l)
 • (u d r)(u d l r)(u d l)
 • (u r)(u r l)(u l)))
 • ;;;effect of left right up and down on a tile index
- (defparameter \*delta\*
 • '((l . -1)(r . 1)(u . -3)(d . 3)))

## find all moves from a state

- (defun move (state m)
 • (let\* ((i (index 0 state)) ;find the 0
 • (j (+ i (cdr (assoc m \*delta\*))))))
 • (loop for k from 0 to (- (length state) 1) collect
 • (cond ((eq k i)(nth j state))
 ((eq k j)(nth i state))
 (t (nth k state))))))
 • (defun allmoves (state)
 • (loop for m in (nth (index 0 state) \*moves\*) collect
 (move state m))))

## utility fns

- (defun index (item list)  
• (cond ((null list) -1)  
• ((eq (car list) item) 0)  
• (t (+ 1 (index item (cdr list))))))
- (defun pick (items) (nth (random (length items)) items))

## Relation between Representation and Rules

- Compact representation, e.g. bitcoded enumeration of only possible states, means:
  - Larger subgraph can be stored in memory
  - But rules of transition get more complex (and slower)
- Using a more expansive state representation means
  - Less graph can be stored in memory
  - often more efficient rule application
    - *Moral: Transition rules are expressed with respect to state representation*

## Sometimes Mathematics can Help

Eg: gray-coding the 8 puzzle reduces 3 kinds of rules to one rule (to ring them all)

- Represent state as nine 4-bit codes according to the following array:

|            |            |            |
|------------|------------|------------|
| 6<br>0110  | 7<br>0111  | 3<br>0011  |
| 14<br>1110 | 15<br>1111 | 11<br>1011 |
| 12<br>1100 | 13<br>1101 | 9<br>1001  |

- Transition Rule: swap the hole with any tile whose label differs by single bit

GOAL STATE

| Tile  |    | 1 | 2 | 3 | 4  | 5 | 6  | 7  | 8  |
|-------|----|---|---|---|----|---|----|----|----|
| Label | 15 | 6 | 7 | 3 | 11 | 9 | 13 | 12 | 14 |

## Math Trick

- $x = |a - b|$
- Is  $x$  a power of 2?
- (`zerop (logand x (- x 1))`)
  - Why?  $2^k = 100000$  and  $2^{k-1} = 011111$
  - Bitwise “AND” then together  $\rightarrow 0$

## using math trick for 8 puzzle

- (defvar \*goal\* '(15 6 7 3 11 9 13 12 14))
- (defun pow2 (x) (if (>= x 1) (zerop (logand x (- x 1)))))
- (defun swap (board t1 t2)
 • (sublis (list (cons t1 t2)(cons t2 t1)) board))
- (defun allmoves (state)
 • (loop for tile in (cdr state) with hole = (car state)
 • when (pow2 (abs (- hole tile))))
 • collect (swap state hole tile)))

## Weak Methods

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- **General Purpose Methods**
  - No Domain Knowledge
  - But sometimes it can be heuristically added
- Often weak methods arise through human introspection on our own problem-solving techniques.
- **Brute force/enumeration**
- **Random Generate & Test**
- **Hill Climbing**

## So Whats a Strong Method?

- A strong method is based on knowledge of the domain, and can make for much faster algorithms.
- Example Hanoi:
  - To move n discs from peg A to peg C:
    1. move n-1 discs from A to B. This leaves disc n alone on peg A
    2. move disc n from A to C
    3. move n-1 discs from B to C so they sit on disc n

strong method for hanoi

- (defun hanoi (n source target other)
  - (if (= 1 n) (print (list 'move source target)))
  - (progn (hanoi (- n 1) source other target)
    - (hanoi 1 source target other)
    - (hanoi (- n 1) other target source))))

# The Random Search Algorithm

▪ While Current State is not Goalstate:

- 1) Pick one rule that applies
- 2) Move to next state

– What's Wrong with This?

## Water Jug random Walk

```

▪(defparameter *jugs* '(3 5 8)) ;;;size of containers to pour

▪(defun nextjug (config)
  ▪ (loop for (x y) in '((0 1)(0 2)(1 0)(1 2)(2 0)(2 1)) ;source-dest pairs
    ▪      when (and (not (zerop (nth x config))) ; source has content
    ▪          (< (nth y config)(nth y *jugs*)));goal below capacity
    ▪      collect (movewater config x y (min (- (nth y *jugs*))(nth y config))
    ▪                  (nth x config)))))

▪(defun movewater (config source dest amount)
  ▪ (loop for i from 0 to 2 as x in config collect
    ▪      (cond ((= i source)(- x amount)) ;subtract from source
    ▪          ((= i dest)(+ x amount)) ;add to destination
    ▪          (t x)))) ;leave third jug alone

```

## Stupid approach to WaterJug continued

```
▪(defun jugggoal (config)(equal config '(0 4 4)))  
  
▪(defun randomwalk (config goalp) ;use #'jugggoal  
  ▪ (cond  
    ▪ ((funcall goalp config) config)  
    ▪ (t (randomwalk (pick (nextjug config)) goalp))))  
  
▪(defun pick (items) (nth (random (length items))  
  items)) ;;uniform pick one thing from a list  
▪
```

can we randomwalk the coin puzzle?

- The coinpuzzle is DISSIPATIVE
  - each step adds a coin and lowers total-to-go
- Random walk needs to not overshoot

## Brute Force Enumeration

- It Really Works
- Shunned by AI historically because as problems scale, computers become inadequate.
  - But for Moore's Law!
  - But it works for cracking passwords!!!
- Examples:
  - Finding assignment of variables for logical statement by enumerating the whole truth table.
  - Calculating all permutations or rotations, and searching through them with a for loop

## Brute Forcing the N queens

- Representation is the 8 columns in a list
  - Row number is implicit
- Every permutation of 1-8 is possible solution
  - $N!$
- Lets have a “legal solution test” and loop through all  $n!$  permutations.

## Brute Forcing the N queens

```

▪(defun permute (lst)
  ▪ (if (= 1 (length lst)) (list lst)
    ▪ (loop for x in lst append
      ▪ (loop for y in (permute (remove x lst :count 1))
        ▪ collect (cons x y))))))
  ▪(defun iota (n) (loop for i from 1 to n collect i))
  ▪(defun testperm (p)
    ▪ (loop for tail on p always
      ▪ (openq (car tail)(cdr tail))))))
  ▪(defun bruteq (n) (loop for perm in (permute (iota n))
    ▪ when (testperm perm) collect perm)))

```

## testing for queen attack

- (defun openq (p list) ; test if proposed column p is clear
  - (and (not (member p list))
    - (loop for i in list as j from 1
      - never (eql (abs (- p i)) j))))
- (defun printq (board)
  - (loop for i from 1 as col in board do
    - (loop for j from 1 to (length board) do
      - (if (= j col)
        - (format t " Q")
        - (format t ".")))
    - (terpri)))

## Generate & Test (G&T)

- Generate a random guess (or path)
- Test it.
  
- GT can be faster than Brute Force but not guaranteed.
  - Factor by guessing and testing divisibility??
  - If solutions are very sparse in the space???

## Next time: Organized Search of a problem space

- Instead of random walking or trying to hillclimb, keep track of where you've been.
- Instead of envisioning the graph, just keep dynamic parts in a (queue, stack, program stack).
- Search is still "weak" because
  - It knows not what the graph is about
    - It is broadly applicable
    - But can add domain knowledge to guide it.