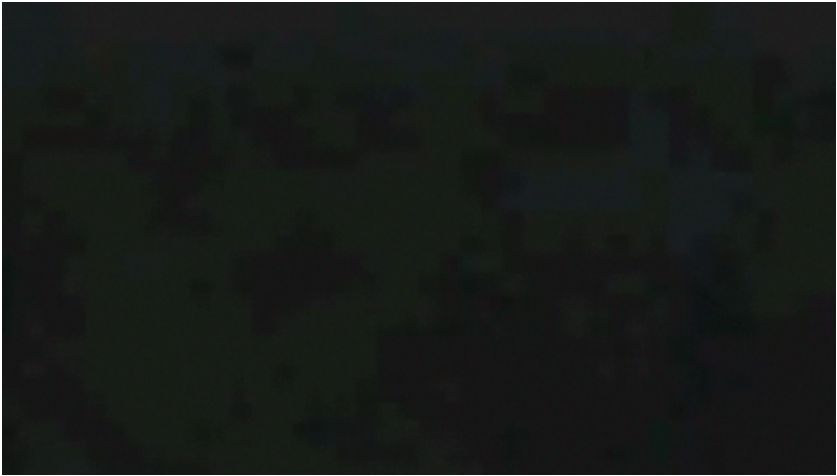




# Planning

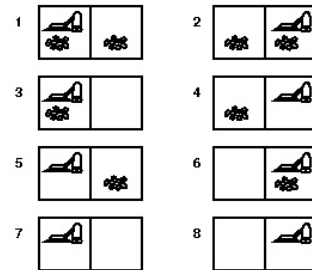
EECS 492  
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## Meet Shakey



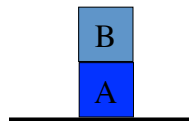
## Planning

- What is planning?
  - ▣ Find a sequence of actions that achieves a desired result
  - ▣ Haven't we done planning already?
  
- Planning with TreeSearch
  - ▣ Initial state: our, well, initial state
  - ▣ Successor function: which actions can we perform?
  - ▣ isGoal: Have we achieved the desired state?



## Sketch of an idea

- Let's say that we have some statements about the blocks world, like
  - ▣ On(B,A)
  - ▣ Clear(B)
  - ▣ On(A,T)
  - ▣ ~Clear(A)



- Can we "prove" that we can move block B?
 
$$\text{On}(B,A) \wedge \text{Clear}(B) \Rightarrow \text{On}(B,T) \wedge \text{Clear}(A) \quad (??)$$
  
- But adding this to the KB introduces contradictions!
  - ▣ E.g.,  $\text{Clear}(A) \wedge \sim\text{Clear}(A)$

## Frame Axioms

"Time Is What Prevents Everything From Happening At Once.." - John Wheeler (1911-2008)

- An action divides time into a "before" and "after".
  - ▣ Different things are true---
  - ▣ Some are changed explicitly by the action
  - ▣ Some "continue to be"
- **Frame axioms:** The way we describe the "after" in terms of the "before" and the action effects



John Wheeler  
Manhattan Project Physicist

## PDDL

- Planning Domain Definition Language (PDDL)
  - ▣ Expresses typical frame axioms automatically
  - ▣ Database semantics
    - Closed world (fluents are false by default)
    - Two constants (Bob, Mr.Henderson) *always* refer to different objects
  - ▣ Based on STRIPS language (1971) used by Shakey
- Environment
  - ▣ fully observable, deterministic, finite, static, discrete
- Objectives
  - ▣ conjunctions of goal propositions



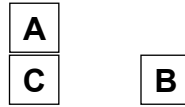
## PDDL Action Schema

- **Example:**
  - ▣ **ACTION:** Fly( $p$ , from, to)
  - ▣ **PRECOND:** At( $p$ , from)  $\wedge$  Plane( $p$ )  $\wedge$  Airport(from)  $\wedge$  Airport(to)
  - ▣ **EFFECT:**  $\neg$ At( $p$ , from)  $\wedge$  At( $p$ , to)
- In comparison to FOL
  - ▣ FOL: Variables (use unification), Predicates, Functions, arbitrary connectives
  - ▣ PDDL: Variables (use unification), Predicates, No functions, conjunctions only
- Goals
  - ▣ Cannot have a vacuum which wants at least one clean room: Clean(Room1)  $\vee$  Clean(Room2)
- Effects
  - ▣ Sets values of propositions (overriding earlier values)
  - ▣ Everything else "continues to be"

## A Blocks-World Problem

- **Initial:**
    - ▣ On(A,C)  $\wedge$  On(B,Table)  $\wedge$  On(C,Table)  $\wedge$  Clear(A)  $\wedge$  Clear(B)
  - **Goal:**
    - ▣ On(B,C)
- 
- Define the clear predicate?
    - ▣ Clear( $x$ )  $\equiv \forall y. \neg$ On( $y$ , $x$ )
    - ▣ But we can't: not part of the syntax of PDDL
    - ▣ Instead, values of Clear predicate are updated by actions

## A Blocks-World Problem



$\text{On}(A,C) \wedge \text{On}(B,\text{Table}) \wedge \text{On}(C,\text{Table}) \wedge \text{Clear}(A) \wedge \text{Clear}(B)$

$\text{Move}(b,x,y)$  ("move  $b$  from  $x$  to  $y$ ")

**precondition:**  $\text{On}(b,x) \wedge \text{Clear}(b) \wedge \text{Clear}(y)$

**effect:**  $\text{On}(b,y) \wedge \text{Clear}(x) \wedge \neg\text{On}(b,x) \wedge \neg\text{Clear}(y)$

- Consider goal state:  $\text{On}(B,C)$ 
  - ▣ Can be unified with action  $\text{Move}(b,x,y)$ 
    - ▣  $\theta = \{b/A, x/C, y/B\}$
- Precondition satisfied?
- Resulting state
  - ▣  $\neg\text{On}(A,C) \wedge \text{On}(B,\text{Table}) \wedge \text{On}(C,\text{Table}) \wedge \text{Clear}(A) \wedge \neg\text{Clear}(B) \wedge \text{On}(A,B) \wedge \text{Clear}(C)$

## A small problem



$\text{On}(A,C) \wedge \text{On}(B,\text{Table}) \wedge \text{On}(C,\text{Table}) \wedge \text{Clear}(A) \wedge \text{Clear}(B)$

$\text{Move}(b,x,y)$  ("move  $b$  from  $x$  to  $y$ ")

**precondition:**  $\text{On}(b,x) \wedge \text{Clear}(b) \wedge \text{Clear}(y)$

**effect:**  $\text{On}(b,y) \wedge \text{Clear}(x) \wedge \neg\text{On}(b,x) \wedge \neg\text{Clear}(y)$

- What happens if we perform  $\text{Move}(b, x, \text{Table})$ ?
  - ▣ The table has a "special" property!
- How do we fix this?

## Shakey the Robot

- Natural language interface
- STRIPS-style planner
  - ▣ Real-world implementation of blocks-world like problem



## Shakey and STRIPS



## Searching for Plans

- Given a **plan** (sequence of actions) and an initial state, can test whether plan achieves **goal**
- Q: How to *generate* solution plans?
- A: **search** (as always...)

## Forward State-Space Search

- Also called **progression** planning
- Planning as state space search:
  - ▣ Represent states by sets of positive ground literals
    - Literals not appearing are false or don't matter
    - Initial state: given by planning problem
  - ▣ Action **applicable** in a state iff preconditions satisfied
  - ▣ **Successor states** generated by adding positive effect literals and deleting negative effect literals
  - ▣ Goal test succeeds iff state satisfies goal sentence
  - ▣ Step cost = 1 (typically)

## Forward Search: Complexity

- In the absence of function symbols, the state space of a planning problem is finite
  - ▣ Therefore any complete graph-search algorithm will be a complete planning algorithm
- But will it be efficient?
  - ▣ Many irrelevant actions
    - all applicable actions are considered in each state
  - ▣ What is branching factor for blocks world with  $N$  blocks?
  - ▣ Need good heuristic functions

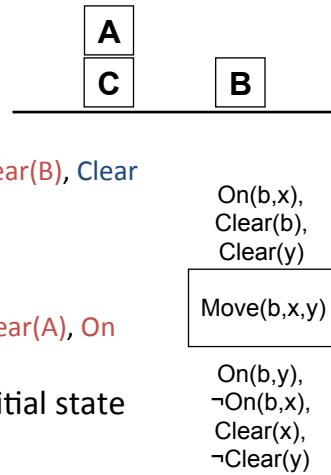
## Backward State-Space Search

- Also called *regression* planning
- Generates *predecessors* starting from goal state
  - ▣ Find action  $A$  whose *effect unifies with goal* (or part)
  - ▣ New “goal” is set of conditions for this action to be applicable
  - ▣ Computing these conditions is called **regressing** the goal through the action.
  - ▣ Delete positive effects of  $A$  that appear in goal
  - ▣ Add precondition literals of  $A$
- **Advantage:** need only consider relevant actions
- **Disadvantage:** dealing with interactions among goal propositions

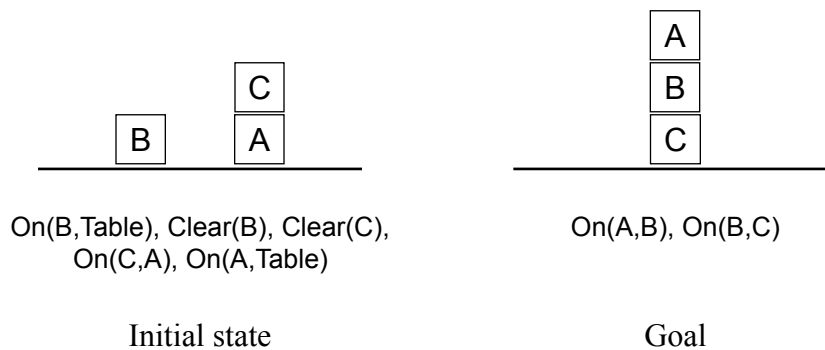


## Regression Example

- Goal:  $On(B,C)$
- Choose action:
  - ▣  $Move(B,Table,C)$
  - ▣ Achieves  $On(B,C)$ , has preconditions  $Clear(B)$ ,  $Clear(C)$ ,  $On(B,Table)$
- Choose action:
  - ▣  $MoveToTable(A,C)$
  - ▣ Achieves  $Clear(C)$ , has preconditions  $Clear(A)$ ,  $On(A,C)$
- Remaining conditions satisfied in initial state



## Sussman Anomaly (Linear Planning)



## Next Time

- Planning Graphs and real-world planning