

# CS 440: Introduction to Artificial Intelligence

## Lecture 7

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# Recap

Reasoning and architecture—How does the complexity of decision making affect behavior?

- ▶ What does an agent have to remember about the past?
- ▶ What does an agent have to consider about the future?
- ▶ How do you factor answers into code?

# Reflex Agents

Simplest possible design: no memory or planning

- ▶ A list of condition–action statements
  - ▶ Each tests whether the condition is true
  - ▶ Then calls for the action appropriate to that condition
  - ▶ Such statements are often called `RULES`

## Finite State Agents

Next simplest design: Robot has a variable  $s$  for state

- ▶  $s$  takes on one of a small number of discrete values
- ▶ logic rules test state
- ▶ rules both: output intentions and update state

Rule template:

```
if (EXPRESSION(Percepts , S)) {  
    S := New State  
    Todo := New Intention  
}
```

## Limits of Reaction

- ▶ Reaction fails exactly when:  
Agent has same percepts  
but needs to make different decisions.
- ▶ Interesting connection between reasoning and capability:  
Need state to deal with ambiguity and uncertainty.

# Combining Behaviors

## Subsumption

- ▶ All behaviors get percepts, can propose actions
- ▶ Higher-level behaviors modulate actions proposed by lower-level ones

## Weights

- ▶ All behaviors get percepts, can propose actions
- ▶ Actions are continuous and can be combined together

# Flocking

Group behavior based on weighting actions

- ▶ separation
- ▶ alignment
- ▶ centering
- ▶ obstacle avoidance, etc.

## Demo

- ▶ What does each heuristic do on its own?
- ▶ Why must you combine them?
- ▶ What kind of reasoning and representation?



# Project Outline

Key part:

- ▶ Flocks

Work involves

- ▶ Basic agent
- ▶ Analysis in specific environments
- ▶ Optional, open-ended extensions

Skeleton code, examples, output, detailed description on sakai

## Flocks—Interactions among agents

### Basic agents

- ▶ Implement flocking forces: avoid enemies and obstacles, approach food, handle separation, alignment, centering
- ▶ See assignment text for details on calculating forces, weights, examples

### Analysis

- ▶ Create scenarios that show specific features such as obstacles that keep flock from food flocks that split and remerge

### Extensions—“Storytelling” with flocks

- ▶ boids with different speeds and abilities
- ▶ boids that scatter in response to predators
- ▶ separate flocks at war
- ▶ groups of predators that hunt as teams

## Summary—Goals of assignment

Solidify material of last two weeks

- ▶ Understand agent architectures and the capabilities they give rise to
- ▶ Practice skills of analyzing agents acting in complex environments
- ▶ Get experience with behavioral simulation to visualize AI techniques and create virtual worlds

## Summary: Agents

### Architectures of intelligent behavior

- ▶ Programming systems to make their own decisions
- ▶ Perception, Deliberation and Action
- ▶ Probability and Utility
- ▶ Representation and Reasoning

### Worked case studies—for future recitations

- ▶ Choosing actions by anticipating their effects
- ▶ Making uncertain decisions and learning from what happens

# Agents and Knowledge

Strengths and weaknesses of scripted behavior

- ▶ Strength: Flexible routines that respond to current conditions
- ▶ Weakness: Remembering past experience
- ▶ Weakness: Anticipating future problems

Solution is to design agents with knowledge of the world

## Fundamental Challenge

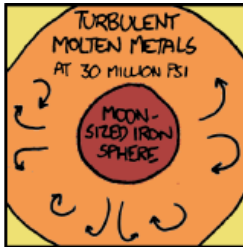
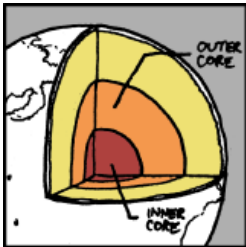
Applying knowledge in new situations

- ▶ Actual situations are *complex*.  
You usually haven't seen exactly the same thing before.  
Often: a novel mix of familiar features.
- ▶ Useful knowledge needs to be *generalizable*  
It describes large classes of situations  
in terms of underlying features.
- ▶ Consequence:  
New situations require a creative synthesis of existing  
knowledge

## Example—Language understanding

“I freak out about fifteen minutes into reading anything about the Earth’s core when I suddenly realize it’s *right under me*.”

## Example—Language understanding



I FREAK OUT ABOUT FIFTEEN MINUTES INTO  
READING ANYTHING ABOUT THE EARTH'S CORE  
WHEN I SUDDENLY REALIZE IT'S *RIGHT UNDER ME.*



## Example—Language understanding

Applying knowledge in new situations

- ▶ Situation: Creative language use.  
A sequence of words that nobody has ever used before.
- ▶ Knowledge: rules for understanding sentences.  
Forms and meanings of words, grammar of complex sentences
- ▶ Creative synthesis:  
Recognizing a new thought as the meaning of the sentence.

# Search

Way to creatively synthesize pieces of knowledge

- ▶ Symbol structures represent current information
- ▶ Applying a piece of knowledge extends this information
- ▶ Can test whether current information solves your problem
- ▶ Systematically explore all the alternatives

# Ingredients of search problems

- ▶ Initial state
- ▶ Possible actions in each state
- ▶ Transition model:  
Takes state and action and gives new state
- ▶ Goal test  
Describes whether state is what you want
- ▶ Path cost  
Says how easy or hard action sequence is

## General Case

State space is a tree

- ▶ Each node has a set of children obtained by considering different actions
- ▶ Each action sequence represented as a new state

## Sample Search Problem

Generating English utterances

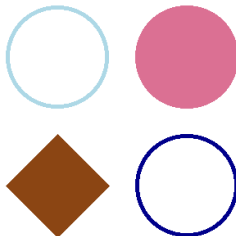
- ▶ initial state: empty string
- ▶ action: add a word
- ▶ goal: get your idea across clearly and correctly

# Demo

## Collaborative Reference

Picking out objects in the world for your interlocutor

Candidate Objects



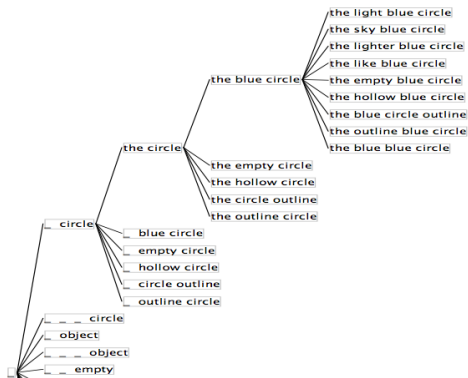
Agent: the light blue circle

Both interlocutors follow up to make sure they understand

- Inspired by the work of Stanford psychologist Herb Clark

## Searching for an utterance

Search space arises by adding one word at a time to description

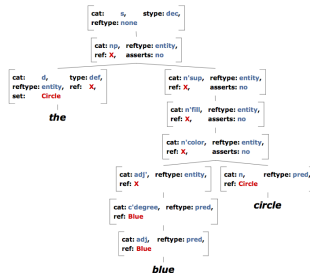




## Representation

Description represented as syntactic tree

- ▶ shows dependency relationships (complements, modifiers)
- ▶ shows gaps and places to modify
- ▶ features and values handle agreement



## Representation

State keeps track of progress towards overall goal

- ▶ What syntactic information needs to be filled in?
- ▶ What does the description mean in context?

Here: nothing needs to be filled in but two referents are possible.

2 interpretations:

```
{Y←t1, PossVarVal←inTargetDomain, A←inFocus, Set←setPrag, Equals←equal,
X←e0_0, Circle←circleFigureObject, M←addcr, Blue←lightblueFigureObject},
{Y←t1, PossVarVal←inTargetDomain, A←inFocus, Set←setPrag, Equals←equal,
X←e3_0, Circle←circleFigureObject, M←addcr, Blue←darkblueFigureObject}
```

Candidate Objects

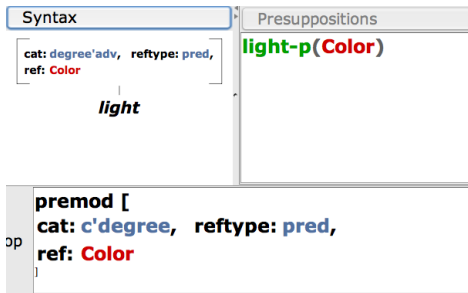


(key to symbols)

## Representation

Words are associated with tree fragments that merge in

- ▶ Tree-adjoining Grammar: TAG by Aravind Joshi
- ▶ Items paired with meanings



This item precedes a color word and says the color is “light”.

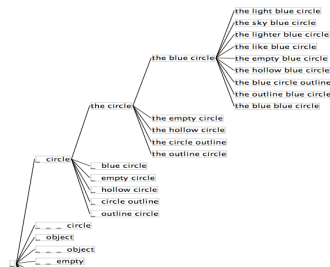
## Summary— Why it works

Can make local decisions

- ▶ No “dead ends” – you can always say more
- ▶ Partial meaning is a good guide to progress

Explore only tiny part of search space

- ▶ Look at all actions in each state
- ▶ Pick the best and never look back
- ▶  $O(kd)$



## Summary— Why it helps

- ▶ Program factored into knowledge and goals
- ▶ Knowledge
  - ▶ Grammatical structures
  - ▶ Words and their meanings
  - ▶ Shared context
- ▶ Goals
  - ▶ Complete sentence
  - ▶ Right meaning
  - ▶ Unambiguous
  - ▶ Natural

## Summary— Why it helps

- ▶ Program factored into knowledge and goals
- ▶ Get flexible, general decision making without rules
- ▶ Can learn knowledge from other data sources
- ▶ Can adapt goals to new objectives
- ▶ Same code works