

CSC 480: Artificial Intelligence

Dr. Franz J. Kurfess
Computer Science Department
Cal Poly

Logistics - Nov. 1, 2012

❖ **AI Nugget presentations scheduled**

❖ Section 1:

- ❖ Erik Sandberg: Traffic Ground Truth Estimation Using Multisensor Consensus Filter

❖ Section 3:

- ❖ Bryan Stoll: Virtual Composer (delayed from Oct. 25)
- ❖ Spencer Lines: What IBM's Watson has been up to since it won in 2011 (delayed from Oct. 30)
- ❖ Mathew Cabutage: Evolution of Robots by Darwinian Selection (delayed from Oct. 30)
- ❖ Rudy Alfaro: League of Legends Bot AI
- ❖ DJ Mitchell: Simulated Therapists and SIM Sensei
- ❖ Alex Waas: Mining Patterns in Search Data

❖ **A2 Wumpus World**

❖ Part 1: Knowledge Representation and Reasoning

- ❖ Web form, no programming required
- ❖ Due: Nov. 8

❖ Part 2: Implementation

- ❖ Due: Nov. 15

❖ **A3 Competitions cancelled**

- ❖ weight of remaining assignments adjusted accordingly

Course Overview

- ◆ Introduction
- ◆ Intelligent Agents
- ◆ Search
 - ◆ problem solving through search
 - ◆ informed search
- ◆ Games
 - ◆ games as search problems
- ◆ **Knowledge and Reasoning**
 - ◆ **reasoning agents**
 - ◆ propositional logic
 - ◆ predicate logic
 - ◆ knowledge-based systems
- ◆ Learning
 - ◆ learning from observation
 - ◆ neural networks
- ◆ Conclusions

Chapter Overview

Reasoning Agents

- ◆ Motivation
- ◆ Objectives
- ◆ Agents and Knowledge
- ◆ Wumpus World
 - ◆ environment
 - ◆ agents
- ◆ Representation, Reasoning and Logic
 - ◆ representation
 - ◆ inference
 - ◆ logics
- ◆ Propositional Logic
 - ◆ syntax
 - ◆ semantics
 - ◆ validity and inference
 - ◆ models
 - ◆ inference rules
 - ◆ complexity
- ◆ Wumpus Agents
- ◆ Important Concepts and Terms
- ◆ Chapter Summary

Dog vs. Wumpus

- ◆ Is a dog smart enough to solve the Wumpus World challenge?
 - ◆ avoid pits
 - ◆ avoid Wumpus
 - ◆ eliminate the Wumpus
 - ◆ find gold
 - ◆ pick up gold
 - ◆ return

Motivation

- ◆ many tasks are too complex to be solved by search alone
 - ◆ “logical thinking” is often necessary
- ◆ existing knowledge about the environment and the agent itself can be combined and transformed into new knowledge
 - ◆ more applicable to the task
 - ◆ solution to a specific problem
 - ◆ possible ways to solve a problem
 - ◆ properties of the environment, task, agent
- ◆ formal methods to perform reasoning are required

Objectives

- ◆ understand the need to apply knowledge-based reasoning for some tasks
- ◆ know the elementary concepts of representation, inference and logics
- ◆ know the important aspects of propositional logic
 - ◆ syntax, semantics, models, inference rules, complexity
- ◆ understand the limitations of propositional logic
- ◆ apply simple reasoning techniques to specific tasks

Agents and Knowledge

- ◆ knowledge helps agents to form representations of the world
 - ◆ sometimes called “world model”
- ◆ new knowledge is obtained by applying reasoning methods to existing knowledge
 - ◆ results in new or refined representational aspects of the world
- ◆ decisions about actions are based on the new knowledge

Knowledge and Tasks

- ◆ knowledge helps to describe tasks and goals for agents more explicitly
 - ◆ specification in accordance with their world model
 - ◆ in search-based problems, the goal is to a large degree determined by the context of search
 - ◆ find a state with specific properties
- ◆ agents obtain new knowledge about their task and the environment
 - ◆ from the environment or designer
 - ◆ by reasoning
 - ◆ by observing changes
- ◆ agents can adapt their behavior

Knowledge-Based Agent

- ◆ maintains a repository for representations of facts about the world
 - ◆ often referred to as **knowledge base**
 - ◆ usually described through a knowledge representation language
 - ◆ one item in the knowledge base is usually called a **sentence**
 - ❖ also: formula, proposition, statement
 - ❖ frequently, but not necessarily a sentence in a natural language
 - ◆ operations to add and retrieve sentences
 - ❖ **TELL, ASK**
 - ◆ inference mechanism
 - ❖ new sentences may be added through reasoning about existing sentences

KB-Agent Program

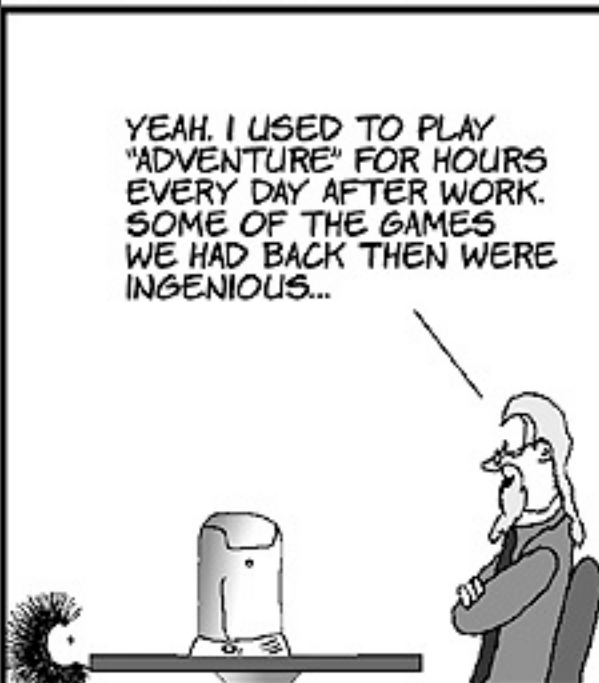
```
function KB-AGENT(percept) returns action  
  static KB      // knowledge base  
          t        // counter indicating time; initially 0  
  
  TELL(KB, MAKE-PERCEPT-SEQUENCE(percept, t))  
  action := ASK (KB, MAKE-ACTION-QUERY(t))  
  TELL(KB, MAKE-ACTION-SEQUENCE(action, t))  
  t := t + 1  
  return action
```

Description Levels for Agents

- ◆ knowledge level or epistemological level
 - ◆ describes what the agent knows at an abstract level
 - ◆ **TELL, ASK** are used for interaction
 - ◆ should be easy to understand for human interaction
- ◆ logical level
 - ◆ knowledge is encoded into sentences
 - ◆ visible representation of the knowledge base
 - ◆ often based on logic as a formal representation language
- ◆ implementation level
 - ◆ physical representation on the agent architecture
 - ❖ symbols, strings, table entries, etc.

User Friendly and Wumpus

USER FRIENDLY by Illiad



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Wumpus World

- ◆ early computer game
 - ◆ invented by Gregory Yob, 1975
 - ◆ originally in a dodecahedron topology
 - ◆ simplified to a two-dimensional grid for didactic purposes
- ◆ agents explores a cave
 - ◆ rooms with properties
 - ◆ passageways connect rooms
- ◆ test bed for intelligent agents

Wumpus Environment

- ◆ grid of squares
 - ◆ limited by walls
 - ◆ a square may contain agents and objects
 - ◆ a square has properties that the agent may perceive
 - ◆ configuration is chosen randomly
- ◆ pit
 - ◆ square that represents a bottomless hole
 - ◆ agent dies if it enters a pit
 - ◆ a pit causes a breeze in surrounding squares
- ◆ gold
 - ◆ causes glitter in the square it is on

Wumpus

- ◆ awful creature that eats agents
- ◆ emanates a stench on adjacent squares
- ◆ can be killed with an arrow
- ◆ gives out a scream when it is killed
 - ◆ can be heard all over the cave

Wumpus Agents

◆ task

- ◆ find the gold, return it to the start square, leave the cave

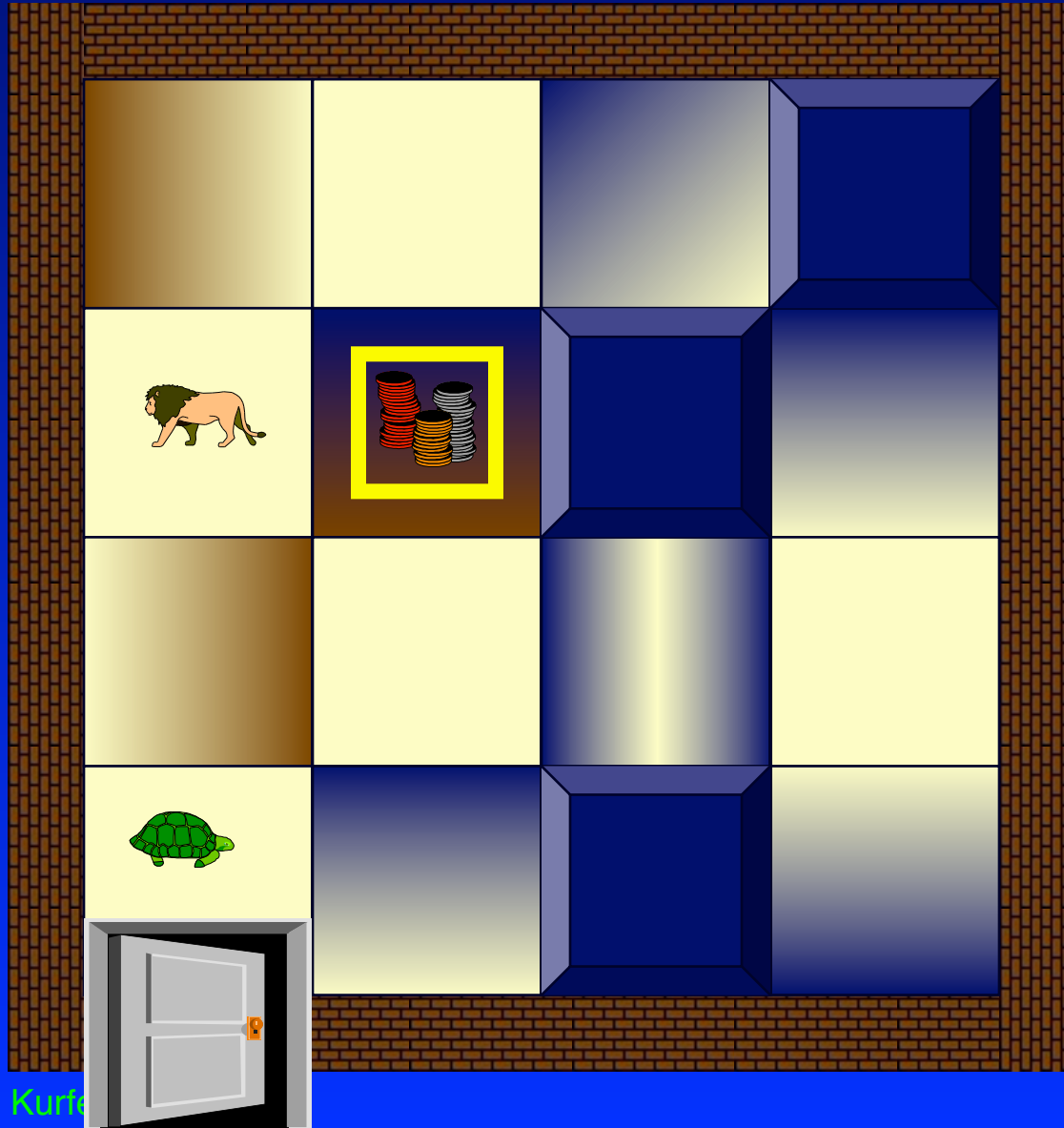
◆ capabilities

- ◆ move around
- ◆ perceive properties of squares
- ◆ shoot once at a wumpus with a single arrow
- ◆ grab the gold

◆ limitations

- ◆ the agent cannot perceive its own location

Wumpus World Diagram



Wumpus World PEAS Description

Performance Measures

- +1000 picking up the gold
- 1000 falling into a pit, get eaten by wumpus
 - 1 each action (step)
 - 10 shooting the arrow

Environment

grid of rooms
starting position, goal position (gold)
pits, breeze in adjacent rooms
wumpus position, stench in adjacent rooms

Actuators

movement (forward, turn right/left, exit)
grab object in the same square
shoot arrow (straight ahead)
[Forward, Right, Left, Grab, Shoot, Exit]

Sensors

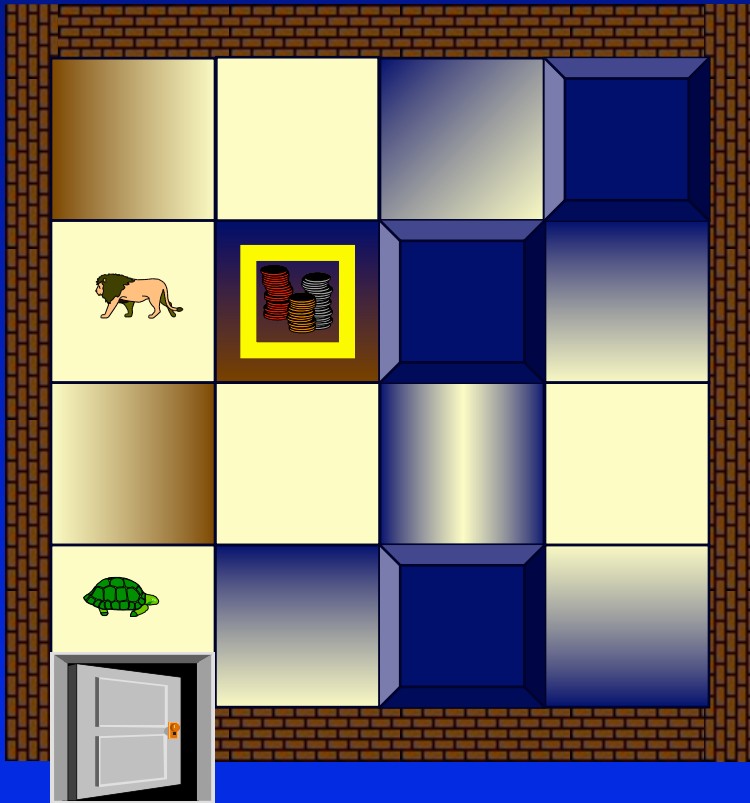
stench (wumpus), breeze(pit), glitter (gold)
bump (wall), scream (wumpus dies)
[Stench, Breeze, Glitter, Bump, Scream]

Life in the Wumpus World

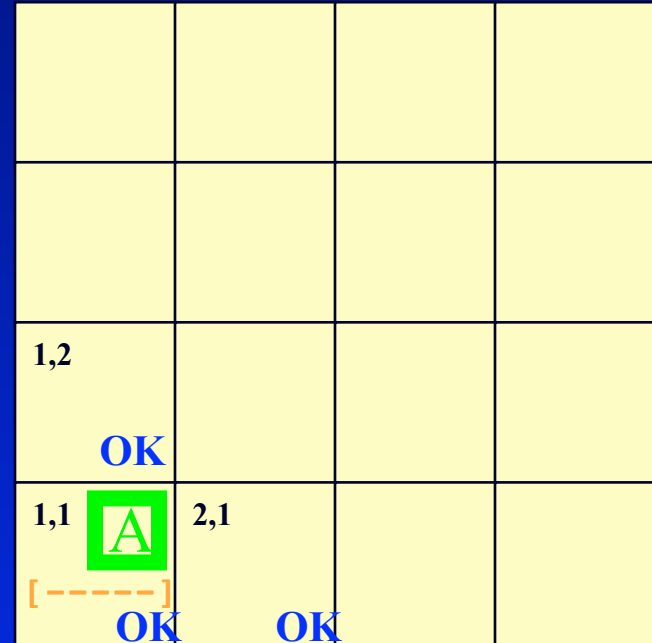
- ◆ before performing an action, it is advisable for the agent to “think” about it
 - ◆ perceive current state
 - ◆ avoid danger
 - ❖ wumpus, pits
 - ◆ seek rewards
 - ❖ gold
 - ◆ keep track of the environment
 - ❖ internal map, properties of squares
 - ❖ escape route

Wumpus World Exploration 1

World State



Agent's View



Position: [1,1]

Percept:

[None, None, None, None, None]

Action: Turn right, forward

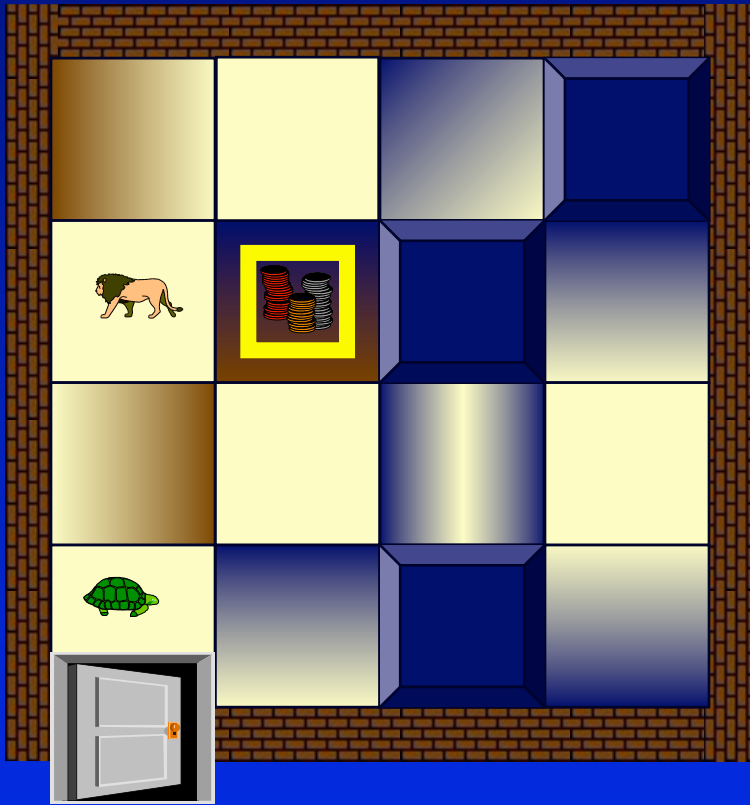
Inferences:

current position is safe

adjacent positions are safe

Wumpus World Exploration 2

World State



Agent's View

1,2 OK	2,2 P?		
1,1 V OK	2,1 [-B---] OK	3,1 P?	

Position: [2,1]

Percept:

[None, Breeze, None, None, None]

Action: Turn right, turn right,
forward, turn right, forward

Inferences:

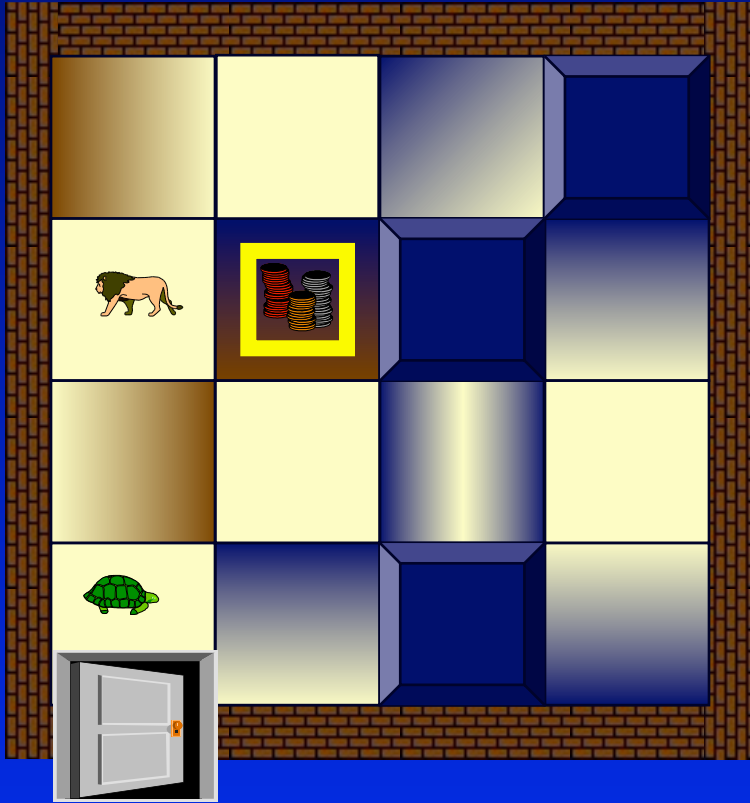
current position is safe
adjacent positions may be pits
because of a perceived breeze

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Reasoning

Wumpus World Exploration 3

World State



Agent's View

1,3 W!			
1,2 [S-----] A OK	2,2 P OK		
1,1 V OK	2,1 V OK	3,1 P!	

Inferences:

current position is safe
 [2,2] not a pit, no breeze;
 hence [3,1] must be a pit
 [1,3] wumpus because of stench

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Position: [1,2]

Percept:

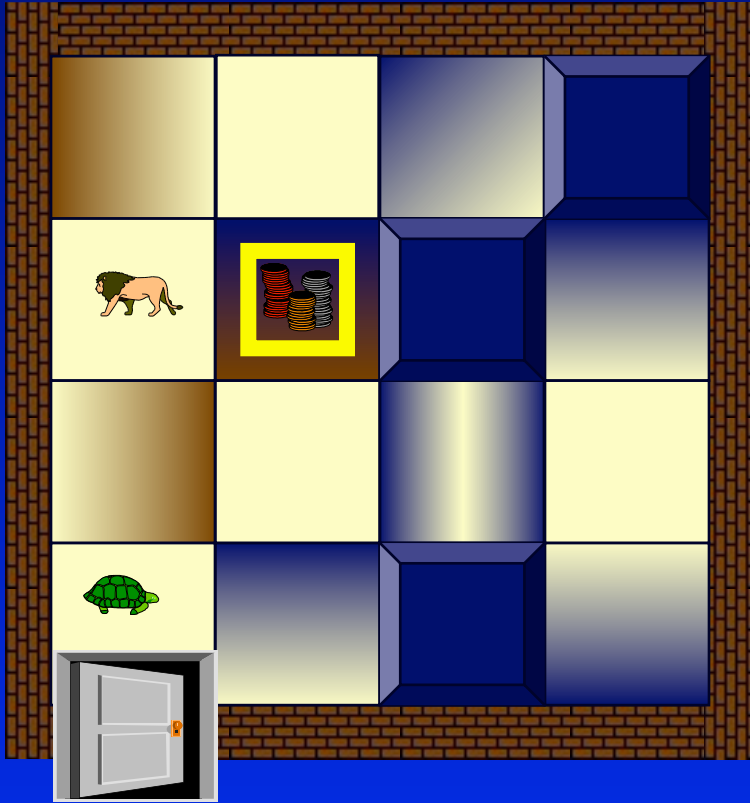
[Stench, None, None, None, None]

Action: Turn right, forward

Reasoning

Wumpus World Exploration 4

World State



Agent's View

1,3 W!	2,3		
1,2	2,2 OK	3,2	
V OK	[- - -]	OK	OK
1,1	2,1	3,1 P!	
V OK	V OK		

Inferences:

current position is safe
 [2,2] not a pit, no breeze;
 hence [3,1] must be a pit
 [1,3] wumpus because of stench

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Position: [2,2]

Percept:

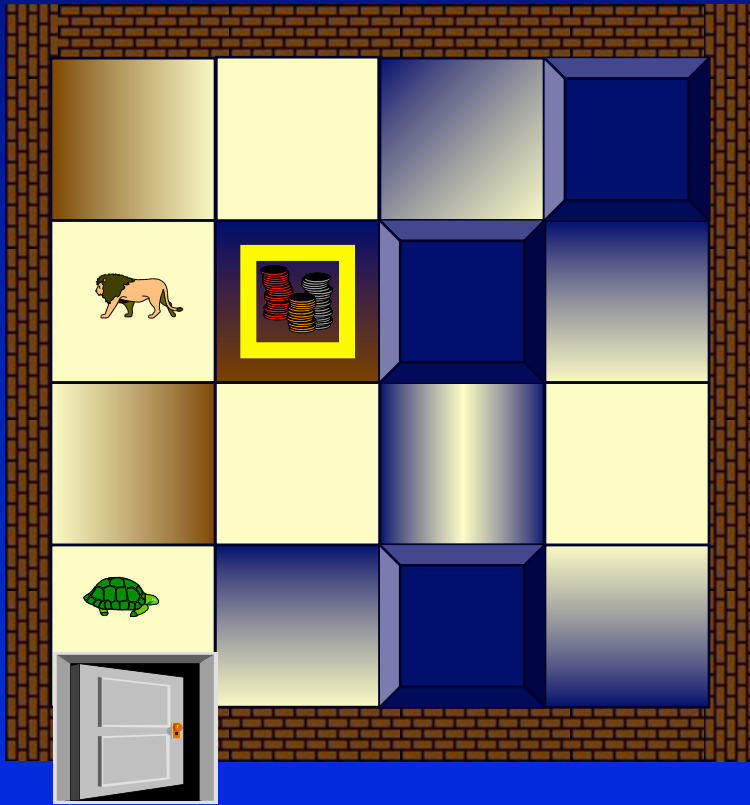
[None, None, None, None, None]

Action: Turn right, forward

Reasoning

Wumpus World Exploration 5

World State



Agent's View

1,3 W!	2,3 OK	3,3 P?	
1,2 V OK	2,2 V OK	3,2 [-B-----] OK	4,2 P?
1,1 V OK	2,1 V OK	3,1 P!	



Position: [3,2]

Percept:

[None, Breeze, None, None, None]

Action: Turn left, turn left,
forward, turn right, forward

Reasoning

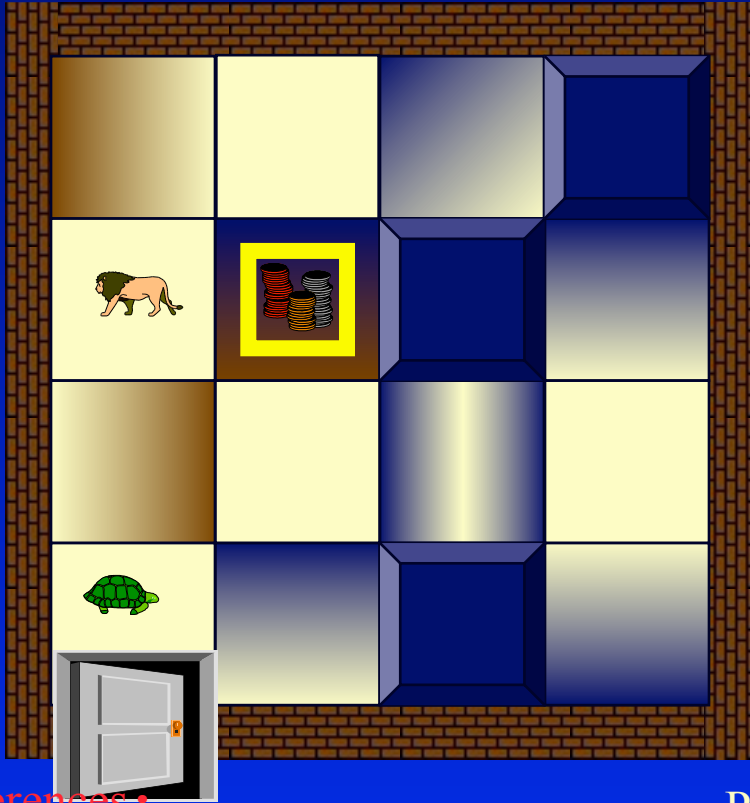
Inferences:

current position is safe
[3,3], [4,2] may be pits
because of breeze;

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Wumpus World Exploration 6

World State



Agent's View

	2,4 P?		
1,3 W!	2,3 [SBG--] A OK	3,3 P?	
1,2 V OK	2,2 V OK	3,2 V OK	4,2 P?
1,1 V OK	2,1 V OK	3,1 P!	



Inferences:

current position is safe
 [2,4], [3,3] may be pits
 because of breeze;
 [1,3] wumpus

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Position: [3,2]

Percept:

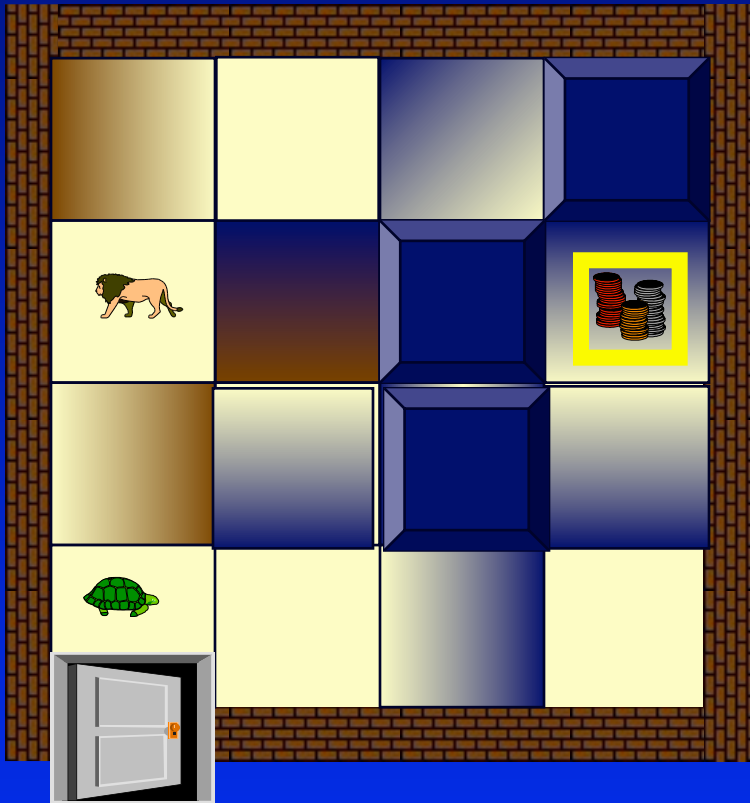
[Stench, Breeze, Glitter, None, None]

Action: Grab gold, left, left, forward,
 right, forward, left, forward,
 climb out

Reasoning

Wumpus Example

World State



Agent's View

1,2			
	OK		
1,1	A	2,1	
	OK	OK	

Position: [1,1]

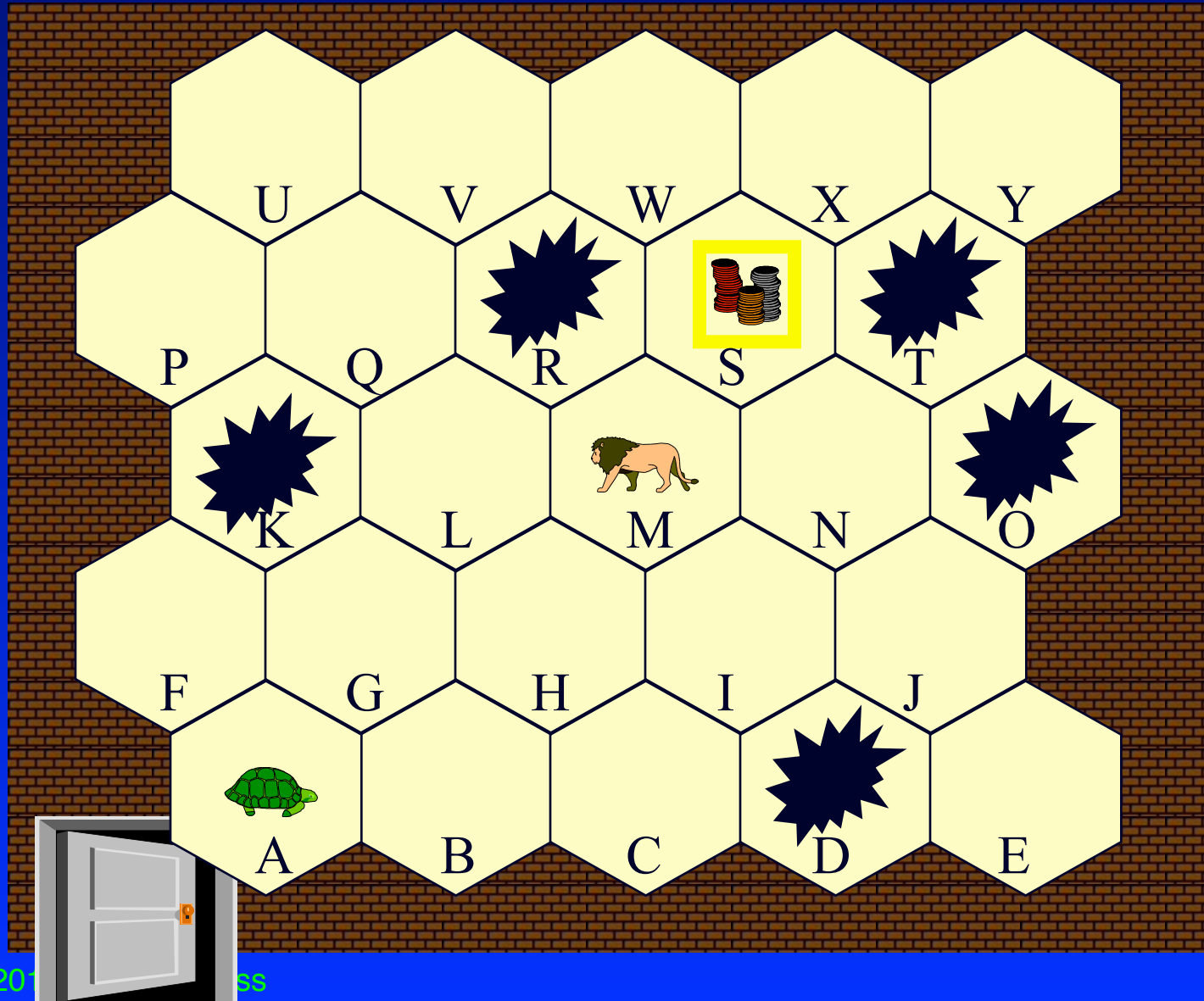
Percept:

[None, None, None, None, None]

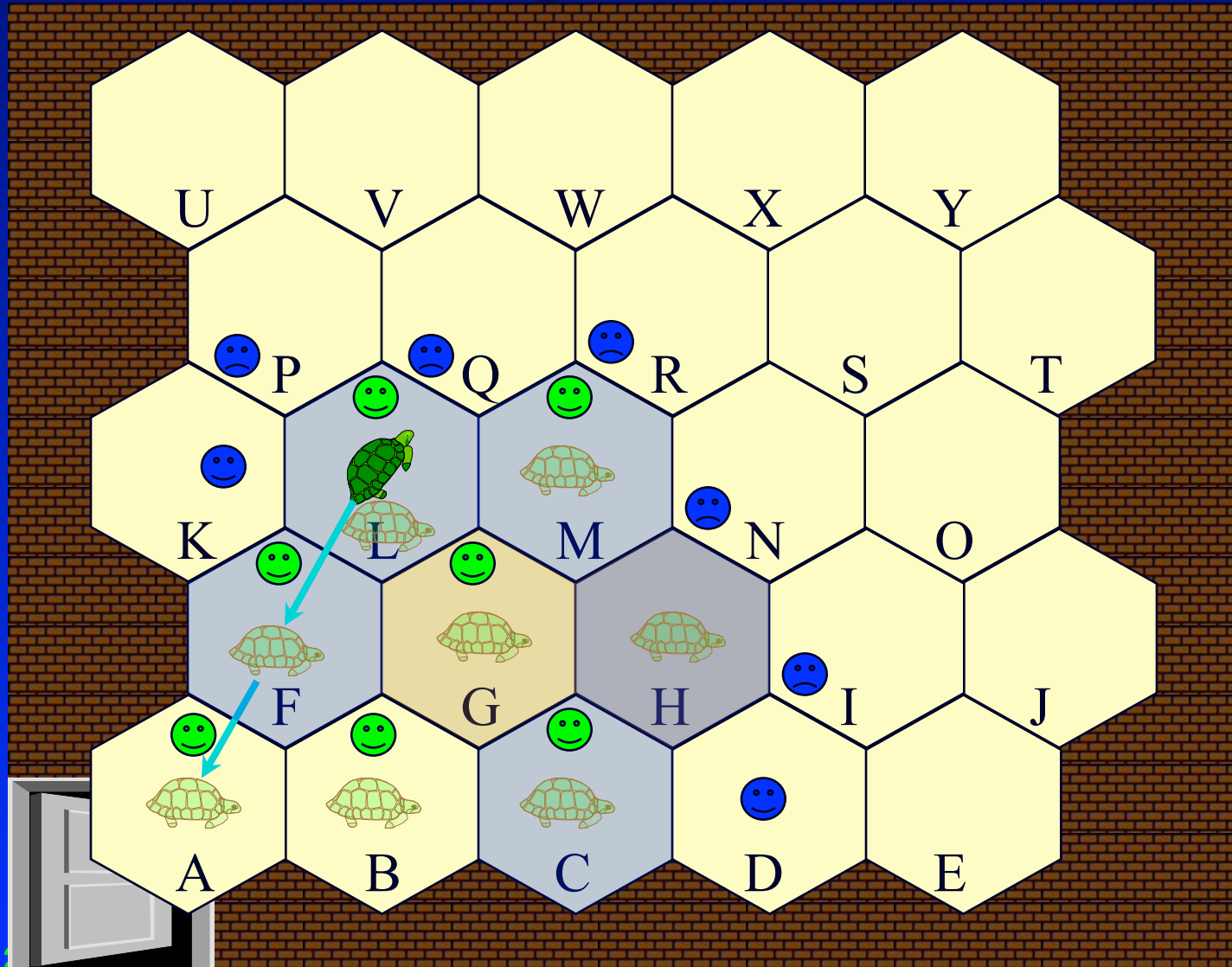
Action: Turn right, forward

Inferences: current position is safe
adjacent positions are safe

Hexagonal Wumpus World



Reasoning in the Hexagonal Wumpus World



Wumpus World Observations

- ◆ many of the reasoning steps seem trivial to humans, but are not so trivial for computers
 - ◆ knowledge gained in different places at different times must be combined
 - ◆ absence of percepts is used to draw conclusions
 - ❖ sometimes the “closed-world assumption” is used: everything that is not explicitly stated is assumed to be false
 - ❖ not always realistic
- ◆ reasoning methods should be generalized
 - ◆ ad hoc representation and methods may be sufficient for one situation, but may have to be augmented for others
 - ❖ e.g grid-based world vs. graph-based world

Why Logic in the Wumpus World

- ◆ survival in the wumpus world requires advanced skills
 - ◆ explore the environment
 - ◆ remember information about the environment
 - ◆ connect different pieces of information
 - ◆ make decisions
 - ◆ evaluate risks
- ◆ most animals are not “smart” enough to do well in the wumpus world
- ◆ computers can perform the above activities
 - ◆ but some are difficult (the last three above)
 - ◆ an algorithmic solution may be possible, but not very flexible
 - ◆ logic provides a framework for knowledge representation and reasoning

Logic and the World

◆ create a model

- ◆ an abstract representation of the real-world problem
- ◆ must capture essential aspects we're interested in

◆ reasoning

- ◆ manipulate the model according to well-established reasoning methods (inference methods)
- ◆ update the model whenever we perceive changes in the real world

◆ decisions

- ◆ make decisions based on the conclusions we derived

◆ actions

- ◆ perform the actions suggested in the decision made
- ◆ observe the outcome, and update the model

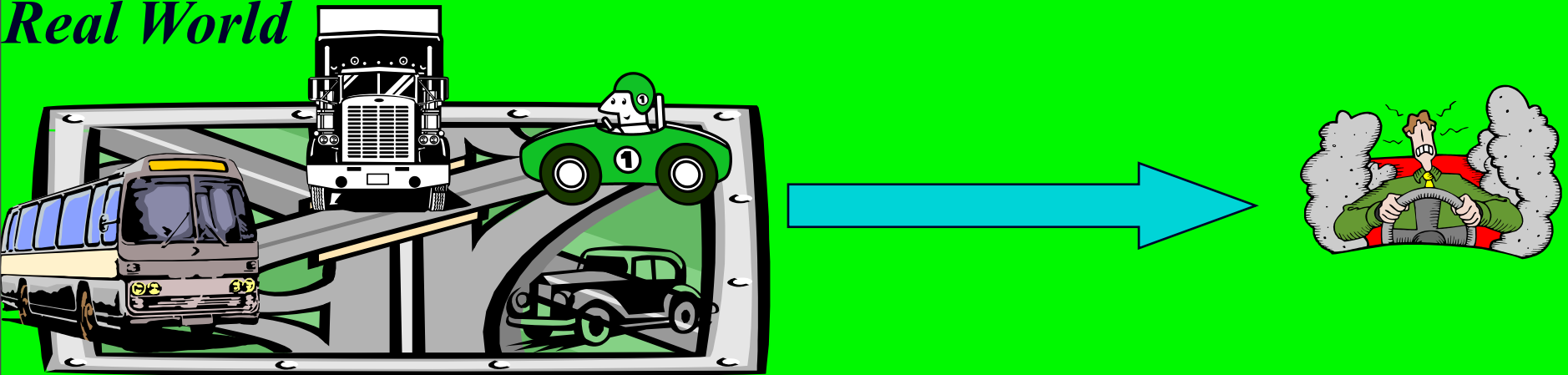
Consistency Model - World

- ◆ *grounding* is the connection between the real world and the model/reasoning process
 - ◆ ideally, all true statements in the model are true in the real world, and vice versa
 - ◆ ideally, all aspects of the real world are reflected in the models
- ◆ appropriate representation
 - ◆ captures essential aspects
- ◆ sound reasoning method
 - ◆ generates only correct results (truth-preserving)
- ◆ complete reasoning method
 - ◆ is guaranteed to find all possible solutions

Diagram: Models and the Real World

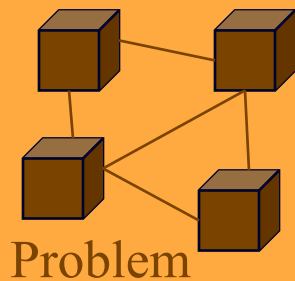
Problem: What is the best transportation method to get from SLO to Fresno?

Real World



Experimental Approach: Try all the options out, and then decide.

Model



Problem



Solutions

Analytical Approach: Assemble essential information about the different methods, determine an evaluation method, evaluate them, and decide.

Representation, Reasoning and Logic

◆ Representation

- ◆ storage of knowledge and information in a form suitable for treatment by computers

◆ Inference

- ◆ reasoning steps
- ◆ drawing of conclusions on the basis of existing knowledge and percepts

◆ Logics

- ◆ formal inference methods
- ◆ must have **syntax** and **semantics**

Knowledge Representation Languages

◆ syntax

- ◆ sentences of the language that are built according to the syntactic rules
- ◆ some sentences may be nonsensical, but syntactically correct

◆ semantics

- ◆ refers to the facts about the world for a specific sentence
 - ◆ interprets the sentence in the context of the world
 - ◆ provides **meaning** for sentences
- ◆ languages with precisely defined syntax and semantics can be called **logics**

Semantics

- ◆ describes the meaning of a sentence
 - ◆ correspondence between sentences and facts in the world
 - ◆ must be defined by the author of the sentence in the form of an interpretation
 - ◆ frequent problem: “parasitic” interpretation
 - ❖ meaning is implied, e.g. by the strings that represent words
- ◆ compositionality
 - ◆ the meaning of a sentence can be constructed from the meanings of its parts
- ◆ truth of a sentence
 - ◆ the state of the real world corresponds to the meaning of a sentence

Sentences and the Real World

◆ syntax

- ◆ describes the principles for constructing and combining sentences
 - ❖ e.g. BNF grammar for admissible sentences (“syntactically correct”)
 - ❖ inference rules to derive new sentences from existing ones through manipulations of the symbols representing the sentences

Sentences

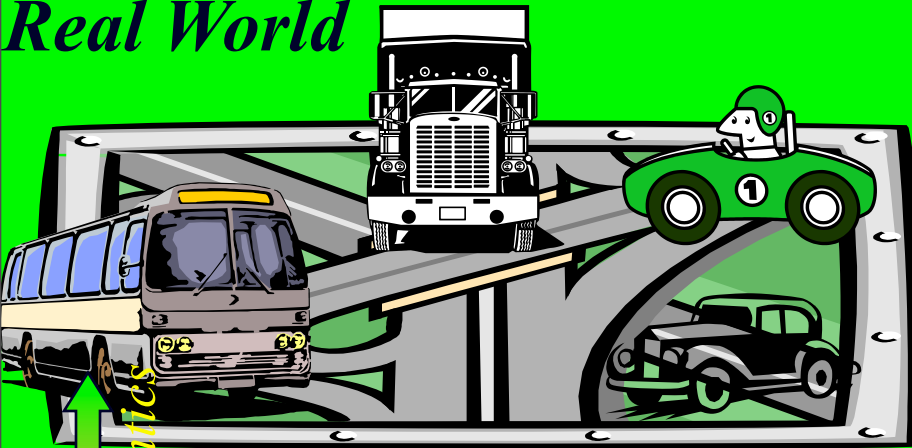
Sentence

◆ semantics

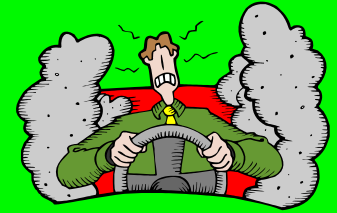
- ◆ establishes the relationship between a sentence and the aspects of the real world it describes
- ◆ can be checked directly by comparing sentences with the corresponding objects in the real world
 - ❖ not always feasible or practical
- ◆ complex sentences can be checked by examining their individual parts

Diagram: Sentences and the Real World

Real World



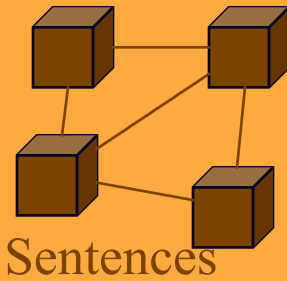
Follows



Semantics

Semantics

Model



Sentences

Entails

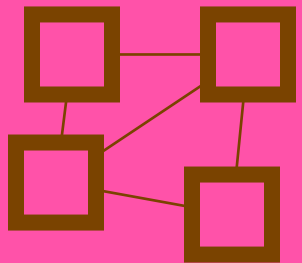


Sentence

Syntax

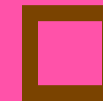
Syntax

Symbols



Symbol Strings

Derives



Symbol String

Candidate Languages

- ◆ programming languages
 - ◆ good for algorithms, data structures
 - ◆ limited expressiveness
 - ❖ problematic for many knowledge-based aspects
 - ❖ “There is a wumpus in some square”
- ◆ natural language
 - ◆ very high expressiveness
 - ◆ very difficult to capture formally
 - ❖ imprecise syntax
 - ❖ ambiguous, context-dependent
- ◆ mathematical logic
 - ◆ good expressiveness
 - ◆ reasonably suitable for computers

Evaluation

◆ Criteria

Important Concepts and Terms

- ◆ and
- ◆ atomic sentence
- ◆ automated reasoning
- ◆ completeness
- ◆ conjunction
- ◆ constant
- ◆ disjunction
- ◆ domain
- ◆ fact
- ◆ false
- ◆ implication
- ◆ inference mechanism
- ◆ inference rule
- ◆ interpretation
- ◆ knowledge representation
- ◆ logic
- ◆ model
- ◆ or
- ◆ proposition
- ◆ propositional logic
- ◆ propositional symbol
- ◆ semantics
- ◆ sentence
- ◆ soundness
- ◆ syntax
- ◆ true
- ◆ variable

Chapter Summary

- ◆ some problems require more sophisticated techniques than searching for a solution
- ◆ reasoning utilizes existing knowledge to generate new knowledge
 - ◆ requires appropriate representation and reasoning methods
- ◆ logic provides a flexible and powerful framework for representation and reasoning
 - ◆ used for the formulation of abstract models that reflect essential aspects of the problem and environment
 - ◆ propositional logic is relatively simple, but also limited

