



## LECTURE 1 OF 42

### Intelligent Agents Overview Discussion: Machine Prob. 1, Term Projects 1 of 5

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KSOL course page: <http://snipurl.com/v9v3>

Course web site: <http://www.kddresearch.org/Courses/CIS730>

Instructor home page: <http://www.cis.ksu.edu/~bhsu>

#### Reading for Next Class:

Sections 1.3 – 1.5, p. 16 – 29, Russell & Norvig 2<sup>nd</sup> edition

Sections 2.1 – 2.2, p. 32 – 38, Russell & Norvig 2<sup>nd</sup> edition

Syllabus and Introductory Handouts



## LECTURE OUTLINE

- **Reading for Next Class: Sections 1.3 – 1.5 & 2.1 – 2.2, R&N 2<sup>e</sup>**
- **Today and Friday: Intelligent Agent (IA) Design, Chapter 2 R&N**
  - \* **Shared requirements, characteristics of IAs**
  - \* **Methodologies**
    - ⇒ Software agents
    - ⇒ Reactivity vs. state
    - ⇒ Knowledge, inference, and uncertainty
- **Intelligent Agent Frameworks**
  - \* **Reactive**
  - \* **With state**
  - \* **Goal-based**
  - \* **Utility-based**
- **Next Week: Problem Solving and Search, Chapter 3**
  - \* **State space search handout (Nilsson, *Principles of AI*)**
  - \* **Search handout (Ginsberg)**





## PROBLEMS AND METHODOLOGIES (REVIEW)

- **Problem Solving**
  - \* Classical search and planning
  - \* Game-theoretic models
- **Making Decisions under Uncertainty**
  - \* Uncertain reasoning, decision support, decision-theoretic planning
  - \* Probabilistic and logical knowledge representations
- **Pattern Classification and Analysis**
  - \* Pattern recognition and machine vision
  - \* Connectionist models: artificial neural networks (ANNs), other graphical models
- **Data Mining and Knowledge Discovery in Databases (KDD)**
  - \* Framework for optimization and machine learning
  - \* Soft computing: evolutionary algorithms, ANNs, probabilistic reasoning
- **Combining Symbolic and Numerical AI**
  - \* Role of knowledge and automated deduction
  - \* Ramifications for cognitive science and computational sciences



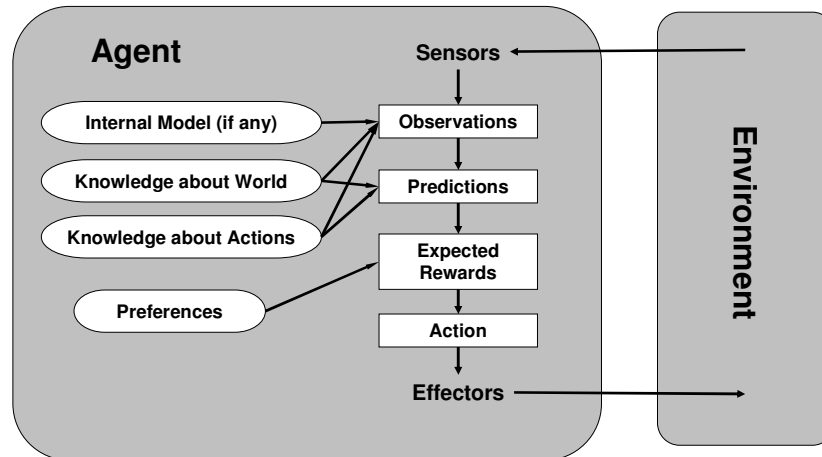
## INTELLIGENT AGENTS (REVIEW)

- **Agent: Definition**
  - \* Any entity that perceives its environment through sensors and acts upon that environment through effectors
  - \* Examples (class discussion): human, robotic, software agents
- **Perception**
  - \* Signal from environment
  - \* May exceed sensory capacity
- **Sensors**
  - \* Acquires percepts
  - \* Possible limitations
- **Action**
  - \* Attempts to affect environment
  - \* Usually exceeds effector capacity
- **Effectors**
  - \* Transmits actions
  - \* Possible limitations





## GENERIC INTELLIGENT AGENT MODEL (REVIEW)



## TERM PROJECT TOPICS

- **1. Game-playing Expert System**
  - \* “Borg” for Angband computer role-playing game (CRPG)
  - \* <http://www.thangorodrim.net/borg.html>
- **2. Classic Trading Agent Competition (TAC)**
  - \* Supply Chain Management (TAC-SCM) scenario
  - \* <http://www.sics.se/tac/>
- **3. Link Prediction (Social Networks, Bioinformatics)**
  - \* Social network friendship predictor
    - ⇒ Hsu *et al.*, ICWSM 2007: <http://bit.ly/2LUSL>
  - \* Protein-protein Interaction
    - ⇒ Paradesi, 2008: <http://hdl.handle.net/2097/931>
    - ⇒ Data set to be published



## HOMEWORK 1: MACHINE PROBLEM

- **Assigned:** 23:00 Central Time, Lecture 1 (third day of classes)
- **Due:** before midnight Central Time, Lecture 7 (end of third week)
- **Topics**
  - \* Intelligent agents concepts
  - \* State space representations
  - \* Informed search
- **To Be Posted**
  - \* KSOL web site
  - \* KDDresearch.org (URL mailed to class mailing list)
- **Questions and Discussion**
  - \* General discussion on class mailing list: [CIS730-L@listserv.ksu.edu](mailto:CIS730-L@listserv.ksu.edu)
  - \* Questions for instructor: [CIS730TA-L@listserv.ksu.edu](mailto:CIS730TA-L@listserv.ksu.edu)
- **Outside References:** On Reserve (Cite Sources!)



## HOW AGENTS SHOULD ACT

- **Rational Agent: Definition**
  - \* **Informal:** “does the right thing, given what it believes from what it perceives”
  - \* **What is “the right thing”?**
    - ⇒ First approximation: *action that maximizes success of agent*
    - ⇒ Limitations to this definition?
  - \* **First:** how, when to evaluate success?
  - \* **Later:** representing / reasoning with uncertainty, beliefs, knowledge
- **Why Study Rationality?**
  - \* **Recall:** aspects of intelligent behavior (last lecture)
    - ⇒ Engineering objectives: optimization, problem solving, decision support
    - ⇒ Scientific objectives: modeling correct inference, learning, planning
  - \* **Rational cognition:** formulating *plausible* beliefs, conclusions
  - \* **Rational action:** “doing the right thing” given beliefs





## RATIONAL AGENTS

- **“Doing the Right Thing”**
  - \* Committing actions: limited effectors, in context of agent knowledge
  - \* Specification (cf. software specification): pre/post-conditions
- **Agent Capabilities: Requirements**
  - \* Choice: select actions (and carry them out)
  - \* Knowledge: represent knowledge about environment
  - \* Perception: capability to sense environment
  - \* Criterion: *performance measure to define degree of success*
- **Possible Additional Capabilities**
  - \* Memory (internal model of state of the world)
  - \* Knowledge about effectors, reasoning process (reflexive reasoning)



## MEASURING PERFORMANCE

- **Performance Measure: How to Determine Degree of Success**
  - \* Definition: *criteria that determine how successful agent is*
  - \* Depends on
    - ⇒ Agents
    - ⇒ Environments
  - \* Possible measures?
    - ⇒ Subjective (agent may not have capability to give accurate answer!)
    - ⇒ Objective: *outside observation*
  - \* Example: web crawling agent
    - ⇒ Precision: did you get only pages you wanted?
    - ⇒ Recall: did you get all pages you wanted?
    - ⇒ *Ratio* of relevant hits to pages explored, resources expended
    - ⇒ Caveat: “you get what you ask for” (issues: redundancy, etc.)
- **When to Evaluate Success**
  - \* Depends on objectives (short-term efficiency, consistency, etc.)
  - \* Episodic? Milestones? Reinforcements? (e.g., games)





## WHAT IS RATIONAL?

- **Criteria**
  - \* Determines what is rational *at any given time*
  - \* Varies with agent, environment, *situation*
- **Performance Measure**
  - \* Specified by outside observer or evaluator
  - \* Applied (consistently) to (one or more) IAs in given environment
- **Percept Sequence**
  - \* Definition: *entire history* of percepts gathered by agent
  - \* NB: agent may or may not have state, i.e., memory
- **Agent Knowledge**
  - \* Of environment – “required”
  - \* Of self (reflexive reasoning)
- **Feasible Action**
  - \* What can be performed
  - \* What agent believes it can attempt?



## IDEAL RATIONALITY

- **Ideal Rational Agent**
  - \* Given: any possible percept sequence
  - \* Do: ideal rational behavior
    - ⇒ Whatever action is expected to maximize performance measure
    - ⇒ NB: expectation – informal sense for now; mathematical def'n later
  - \* **Basis for action**
    - ⇒ Evidence provided by percept sequence
    - ⇒ Built-in knowledge possessed by the agent
- **Ideal Mapping from Percepts to Actions (Figure 2.1 p. 33 R&N 2<sup>o</sup>)**
  - \* Mapping  $p$ : percept sequence → action
  - \* Representing  $p$  as list of pairs: infinite (unless explicitly bounded)
  - \* Using  $p$ : ideal mapping from percepts to actions (i.e., ideal agent)
  - \* Finding explicit  $p$ : in principle, could use trial and error
  - \* Other (implicit) representations may be easier to acquire!





## KNOWLEDGE AND BOUNDED RATIONALITY

- **Rationality versus Omniscience**

- \* **Nota Bene (NB):** not the same
- \* **Omniscience:** knowing *actual* outcome of all actions
- \* **Rationality:** knowing *plausible* outcome of all actions
- \* **Example:** is it too risky to go to the supermarket?

- **Key Question**

- \* What is a *plausible* outcome of an action?
- \* **Related questions**
  - ⇒ How can agents make rational decisions given beliefs about outcomes?
  - ⇒ What does it mean (algorithmically) to “choose the best”?

- **Bounded Rationality**

- \* What agent *can* perceive and do
- \* What is “likely” to be right – not what “turns out” to be right



## STRUCTURE OF INTELLIGENT AGENTS

- **Agent Behavior**

- \* **Given:** sequence of percepts
- \* **Return:** IA's actions
- \* **Simulator:** description of results of actions
- \* **Real-world system:** committed action

- **Agent Programs**

- \* Functions that implement  $p$
- \* Assumed to run in computing environment (architecture)
- \*  $Agent = architecture + program$
- \* This course (CIS730): primarily concerned with  $p$

- **Applications**

- \* Chapter 22 (NLP/Speech), 24 (Vision), 25 (Robotics), R&N 2e
- \* Swarm intelligence, multi-agent systems, IAs in cybersecurity





## AGENT PROGRAMS

### ● Software Agents

- \* Also known as (aka) software robots, softbots
- \* Typically exist in very detailed, unlimited domains
- \* Examples
  - ⇒ Real-time systems: critiquing, avionics, shipboard damage control
  - ⇒ Indexing (spider), information retrieval (IR; e.g., web crawlers) agents
  - ⇒ Plan recognition systems (computer security, fraud detection monitors)
- \* See: Bradshaw (*Software Agents*)

### ● Focus of This Course: Building IAs

- \* Generic skeleton agent: Figure 2.4, R&N
- \* function *SkeletonAgent (percept)* returns action
  - ⇒ static: memory, agent's memory of the world
  - ⇒  $memory \leftarrow Update-Memory (memory, percept)$
  - ⇒  $action \leftarrow Choose-Best-Action (memory)$
  - ⇒  $memory \leftarrow Update-Memory (memory, action)$
  - ⇒ return action



## EXAMPLE: GAME-PLAYING AGENT [1] PROJECT TOPIC 1 OF 5

High-Elf  
Mage  
Mage Lord  
LEVEL: 50  
EXP: 14319409  
AU: 3362959

STR: 18/80  
INT: 12/210  
WIS: 12/140  
DEX: 12/260  
CON: 12/110  
CHR: 12/160

Cur AC: 173  
Max HP: 567  
Cur HP: 563  
Max SP: 362  
Cur SP: 362

Fast: +151

4650 ft

You miss the Earth hound.  
You hit the Earth hound.  
It was a superb hit!  
You have slain the Earth hound.  
You hit the Earth hound.  
You hit the Earth hound.  
You have slain the Earth hound.  
You are no longer a novice.  
You hit the Earth hound.  
You hit the Earth hound.  
The Earth hound flees in terror!  
You hit the Earth hound.  
You have slain the Earth hound.  
You have found a gold piece worth of diamonds.  
You hit the Earth hound.  
You hit the Earth hound.  
You hit the Earth hound.  
You have slain the Earth hound.  
You hit the Earth hound.  
You hit the Earth hound.  
You have slain the Earth hound.  
You hit the Earth hound.  
You have slain the Earth hound.

1 Book of Anti-Magic (Ready for Destruction)  
2 Book of Anti-Magic (Ready for Destruction)  
3 Book of Anti-Magic (Ready for Destruction)  
4 Book of Anti-Magic (Ready for Destruction)  
5 Book of Anti-Magic (Ready for Destruction)  
6 Book of Anti-Magic (Ready for Destruction)  
7 Book of Anti-Magic (Ready for Destruction)  
8 Book of Anti-Magic (Ready for Destruction)  
9 Book of Anti-Magic (Ready for Destruction)  
10 Book of Anti-Magic (Ready for Destruction)

1 Scroll titled "Secrets of the Earth"  
2 Scroll titled "Secrets of the Earth"  
3 Scroll titled "Secrets of the Earth"  
4 Scroll titled "Secrets of the Earth"  
5 Scroll titled "Secrets of the Earth"  
6 Scroll titled "Secrets of the Earth"  
7 Scroll titled "Secrets of the Earth"  
8 Scroll titled "Secrets of the Earth"  
9 Scroll titled "Secrets of the Earth"  
10 Scroll titled "Secrets of the Earth"

1 Sword of Anti-Magic (Ready for Destruction)  
2 Sword of Anti-Magic (Ready for Destruction)  
3 Sword of Anti-Magic (Ready for Destruction)  
4 Sword of Anti-Magic (Ready for Destruction)  
5 Sword of Anti-Magic (Ready for Destruction)  
6 Sword of Anti-Magic (Ready for Destruction)  
7 Sword of Anti-Magic (Ready for Destruction)  
8 Sword of Anti-Magic (Ready for Destruction)  
9 Sword of Anti-Magic (Ready for Destruction)  
10 Sword of Anti-Magic (Ready for Destruction)

1 Staff of Anti-Magic (Ready for Destruction)  
2 Staff of Anti-Magic (Ready for Destruction)  
3 Staff of Anti-Magic (Ready for Destruction)  
4 Staff of Anti-Magic (Ready for Destruction)  
5 Staff of Anti-Magic (Ready for Destruction)  
6 Staff of Anti-Magic (Ready for Destruction)  
7 Staff of Anti-Magic (Ready for Destruction)  
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9 Staff of Anti-Magic (Ready for Destruction)  
10 Staff of Anti-Magic (Ready for Destruction)







## EXAMPLE: GAME-PLAYING AGENT [2] PROBLEM SPECIFICATION

- **Angband**
  - \* **Roguelike game** – descended from **Rogue**, **Moria**  
See: <http://en.wikipedia.org/wiki/Roguelike>
  - \* **v3.0.6 (2006)**  
Source code: <http://www.thangorodrim.net>
- **Automated Roguelike Game-Playing Agents**
  - \* **Rog-O-Matic (1984)**  
<http://en.wikipedia.org/wiki/Rog-O-Matic>
  - \* **Angband Borks (1998-2001)**  
<http://www.thangorodrim.net/borg.html>
- **Problem Specification**
  - \* **Study Borks by Harrison, White (2006 - present: <http://bit.ly/1y9vn>)**
  - \* **Develop scheduling, planning, or classification learning system**
  - \* **Use White's APWBorg interface to develop new Borg**
  - \* **Compare to classic Borks**



## COURSE TOPICS

- **Overview: Intelligent Systems and Applications**
- **Artificial Intelligence (AI) Software Development Topics**
  - \* **Knowledge representation**
  - \* **Search**
  - \* **Expert systems and knowledge bases**
  - \* **Planning: classical, universal**
  - \* **Probabilistic reasoning**
  - \* **Machine learning, artificial neural networks, evolutionary computing**
  - \* **Applied AI: agents focus**
  - \* **Some special topics (NLP focus)**
- **Implementation Practicum (≈ 40 hours)**





## PEAS FRAMEWORK

- **Performance Measure**
  - \* Specified by outside observer or evaluator
  - \* Applied (consistently) to (one or more) IAs in given environment
- **Environment**
  - \* Reachable states
  - \* “Things that can happen”
  - \* “Where the agent can go” TAC-SCM
  - \* To be distinguished (TBD) from: observable states
- **Actuators**
  - \* What can be performed
  - \* Limited by physical factors *and* self-knowledge
- **Sensors**
  - \* What can be observed
  - \* Subject to error: measurement, sampling, postprocessing



## PROBLEM-SOLVING AGENTS [1]: GOALS

- **Justification**
  - \* Rational IA: act to *reach* environment that maximizes performance measure
  - \* Need to formalize, operationalize this definition
- **Practical Issues**
  - \* Hard to find appropriate *sequence of states*
  - \* Difficult to translate into IA design
- **Goals**
  - \* Translating agent specification to formal design
  - \* Chapter 2, R&N: decision loop simplifies task
  - \* First step in problem solving: formulation of goal(s)
  - \* Chapters 3-4, R&N: state space search
    - ⇒ Goal  $\equiv$  {world states | goal test is satisfied}
    - ⇒ Graph planning
  - \* Chapter 5: constraints – domain, rules, moves
  - \* Chapter 6: games – evaluation function





## PROBLEM-SOLVING AGENTS [2]: DEFINITIONS

- **Problem Formulation**

- \* Given

- ⇒ Initial state
    - ⇒ Desired goal
    - ⇒ Specification of actions

- \* Find

- ⇒ *Achievable* sequence of states (actions)
    - ⇒ Represents mapping from initial to goal state

- **Search**

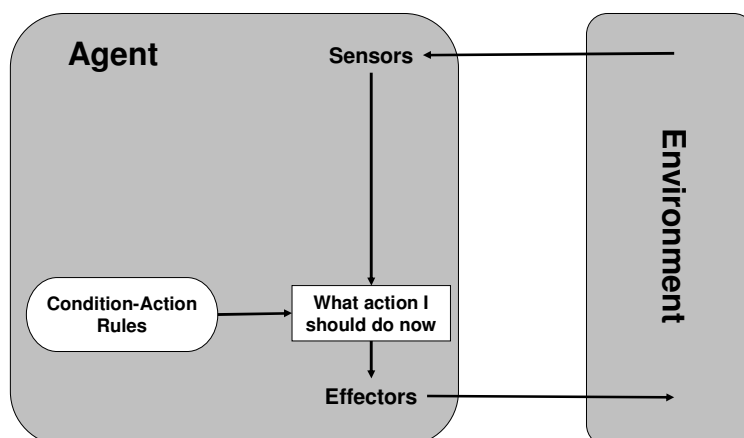
- \* Actions

- ⇒ Cause transitions between world states
    - ⇒ e.g., applying effectors

- \* Typically specified in terms of finding sequence of states (operators)

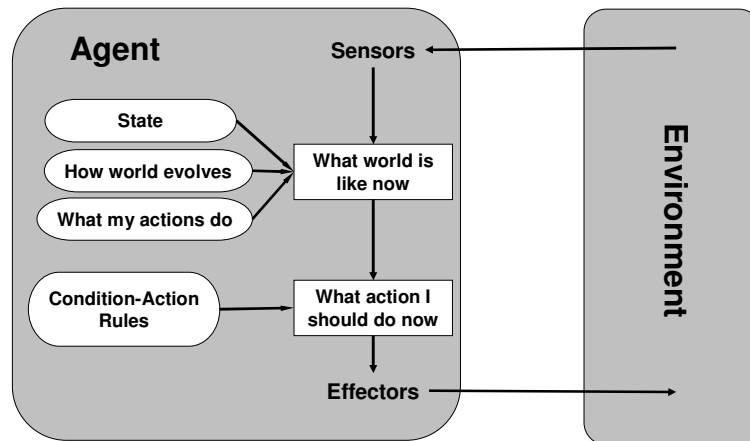


## AGENT FRAMEWORK 1 OF 4: SIMPLE REFLEX AGENTS

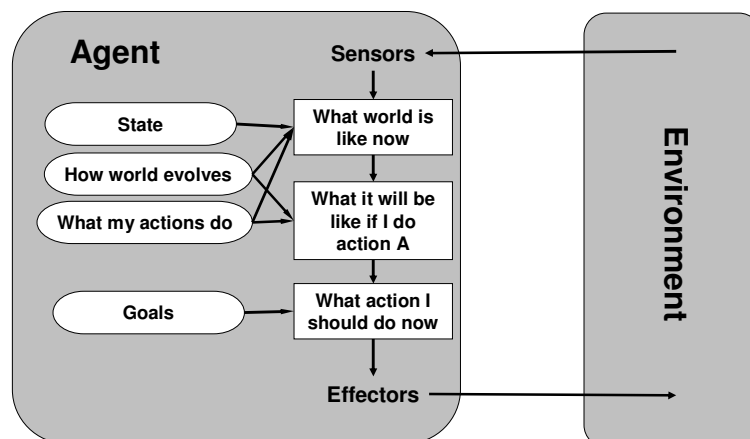




## AGENT FRAMEWORK 2 OF 4: (REFLEX) AGENTS WITH STATE

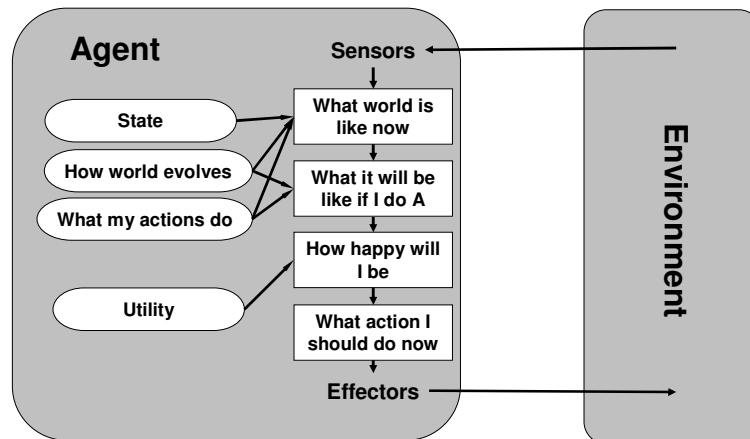


## AGENT FRAMEWORK 3 OF 4: GOAL-BASED AGENTS





## AGENT FRAMEWORK 4 OF 4: UTILITY-BASED AGENTS



## LOOKING AHEAD: SEARCH

- **Next Monday - Wednesday: Sections 3.1-3.4, Russell and Norvig**
- **Thinking Exercises (Discussion in Next Class): 3.3 (a, b, e), 3.9**
- **Solving Problems by Searching**
  - \* **Problem solving agents: design, specification, implementation**
  - \* **Specification: problem, solution, constraints**
  - \* **Measuring performance**
- **Formulating Problems as (State Space) Search**
- **Example Search Problems**
  - \* **Toy problems: 8-puzzle, N-queens, cryptarithmic, toy robot worlds**
  - \* **Real-world problems: layout, scheduling**
- **Data Structures Used in Search**
- **Next Monday: Uninformed Search Strategies**
  - \* **State space search handout (Winston)**
  - \* **Search handouts (Ginsberg, Rich and Knight)**



## TERMINOLOGY

- **Rationality**
  - \* Informal definition
  - \* Examples: how to make decisions
  - \* Ideal vs. bounded
- **Automated Reasoning and Behavior**
  - \* Regression-based problem solving (see p. 7)
  - \* Goals
  - \* Deliberation
- **Intelligent Agent Frameworks**
  - \* Reactivity vs. state
  - \* From goals to preferences (utilities)



## SUMMARY POINTS

- Intelligent Agent Framework
- Rationality and Decision Making
- Design Choices for Agents (Introduced)
- Choice of Project Topics
  - \* 1. Game-playing expert system: Angband
  - \* 2. Trading agent competition, supply chain management (TAC-SCM)
  - \* 3. Knowledge base for bioinformatics: proteomics ontology
- Things to Check Out Online
  - \* Resources page  
<http://www.kddresearch.org/Courses/CIS730/Resources>
  - \* Course mailing list archives (class discussions)  
<http://listserv.ksu.edu/archives/cis730-l.html>

