



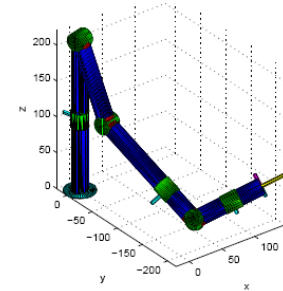
# COS 495 - Lecture 1

## Autonomous Robot Navigation

Instructor: Chris Clark  
Semester: Fall 2011

# Introduction

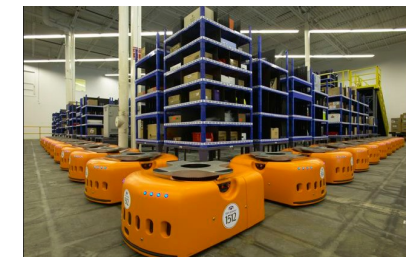
- Education
  - B.Sc.Eng – Engineering Physics, Queen’s University
  - M.A.Sc. – Mechanical Engineering, University of Toronto
  - Ph.D. – Aeronautics & Astronautics / Computer Sci, Stanford University
- Industrial Work
  - Control Systems Designer – Sterner Engineering
  - Software Architect – Kiva Systems
- Academic Appointments
  - Assistant Prof - University of Waterloo
  - Associate Prof – Cal Poly



MSc – Neural Network Manipulator Control, 1998



PhD - Multi-Robot Systems, 2004



Kiva Systems, 2005



# Course Description

- An introduction to mobile robots and current approaches to robot autonomy.
- Topics include:
  - Mobile robot systems and modeling
  - Control structures
  - Sensors & Estimation
  - Localization and Mapping
  - Motion planning

# Course Description

- This course will consider the design and programming of robots using existing technology (i.e. off-the-shelf materials).
- This course will provide a broad overview of all components related to mobile robots with an emphasis is on robot autonomy.



# Course Description

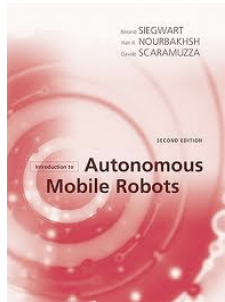
- Key Question

Where am I?

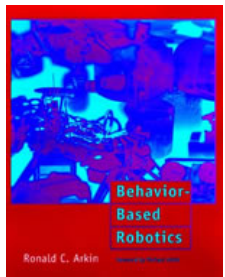
- Key Answer

Use Probability!

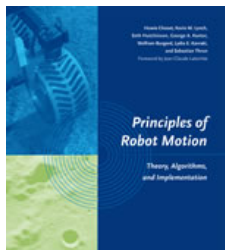
# Course Description



- Required Text:
  - “An Introduction to Autonomous Robots”, [Roland Siegwart](#) and [Illah R. Nourbakhsh](#), MIT Press, 2004



- Recommended Texts:
  - “Behavior-Based Robotics”, Ronald C. Arkin, MIT Press, 1998
  - “Principles of Robot Motion”, Choset et. Al., MIT Press, 2005



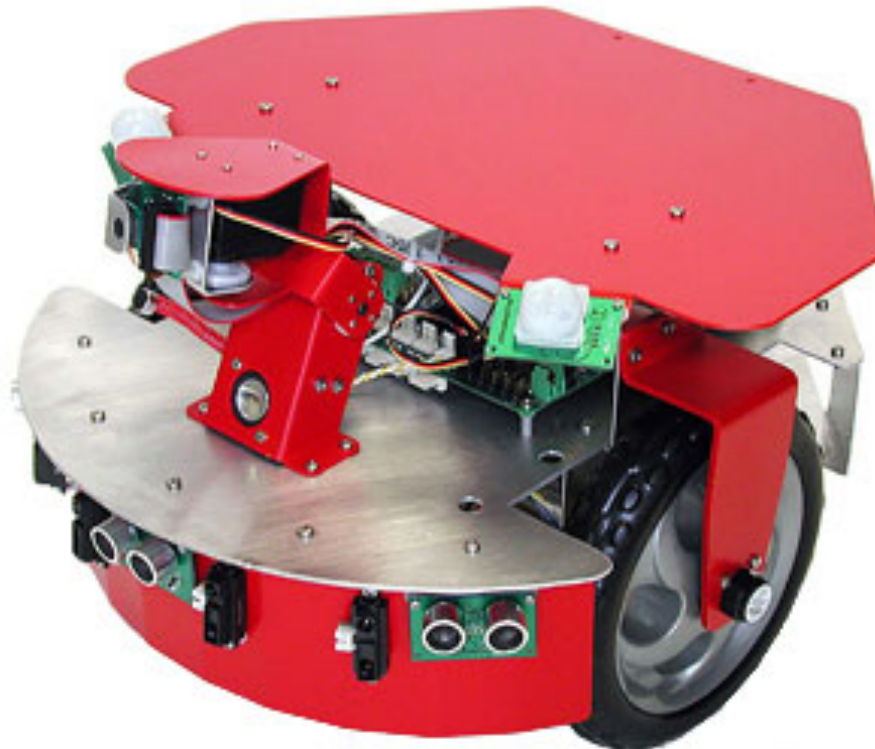
# Course Description

- Recommended Background:
  - Programming skills, knowledge of microprocessors, linear algebra, control systems, C++.



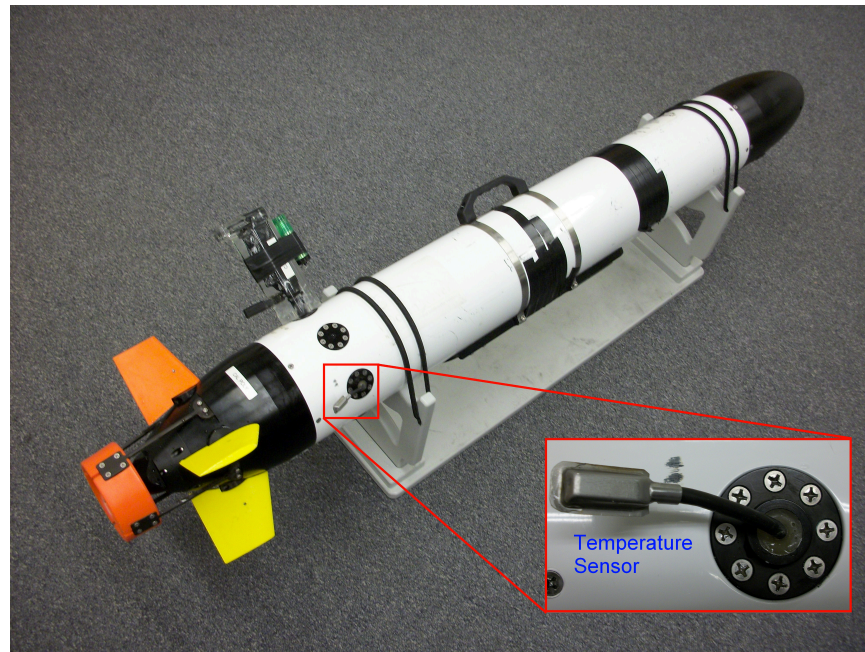
# Course Description

- The X80 Robot



# Course Description

- The Iver2 Autonomous Underwater Vehicle (AUV)





# Class Format

- Lecture
  - Engineering Quad E Wing - E225
  - 1-2 hours theory
  
- Lab
  - Engineering Quad F Wing - F114
  - 1-2 hours experiments



# Grading

- 10% Midterm Exam
- 30% Final Exam
- 15% Competition
- 45% Experiments
  - Demonstrations
  - Lab Reports

# Robot Competition

- Lab time to prepare
- Several matches in a tournament style





# Administrative Info.

- Web site

<http://www.cs.princeton.edu/courses/archive/fall11/cos495/>



# Administrative Info.

- Instructor: Chris Clark
  - email: [cmclark@cs.princeton.edu](mailto:cmclark@cs.princeton.edu)
  - Office Phone: 609-258-0558
  - Office Hours: Mon/Wed 9:05-9:55 OBA
  - Office Location: CS-410



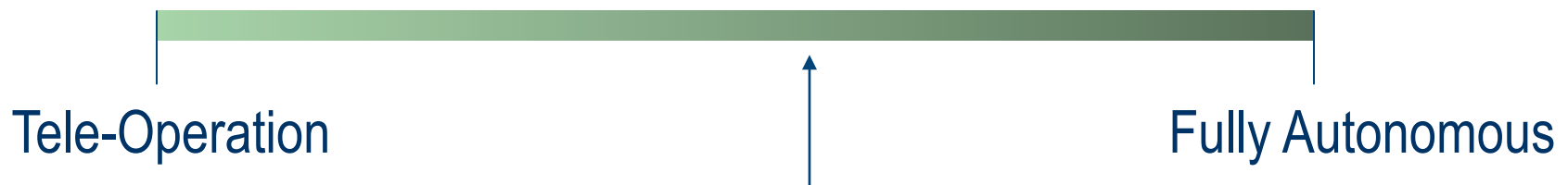
# Navigation and Control

1. Course Objective
2. Example Systems
3. Approaches To Control
4. Navigation Example



# Course Objective

- Provide robots with the ability to accomplish tasks autonomously.
- Autonomously?
  - Different levels dependant on application



# Robot Navigation

- For autonomous behavior, mobile robots need the ability to navigate:
  - Learn the environment-> “Model”
  - Estimate where it is in the environment-> “Localize”
  - Move to desired locations in the environment

# Navigation Problem

- Problem Characteristics
  - Environments are Known versus Unknown
  - Environments are Static versus Dynamic
  - Environments are Structured versus Unstructured (Indoors versus Outdoors?)
- Most robot navigation systems are tailored to the problem characteristics.

# Navigation and Control

1. Course Objective
2. Example Systems
3. Approaches To Control
4. Navigation Example

# Historical Examples

- The Tortoise (Walter, 1950)



*Courtesy of Hans Moravec*

# Historical Examples

- Shakey (SRI 1969)



# Historical Examples

- Stanford Cart (Moravec, 1977)



# Application Examples

- Planetary Exploration

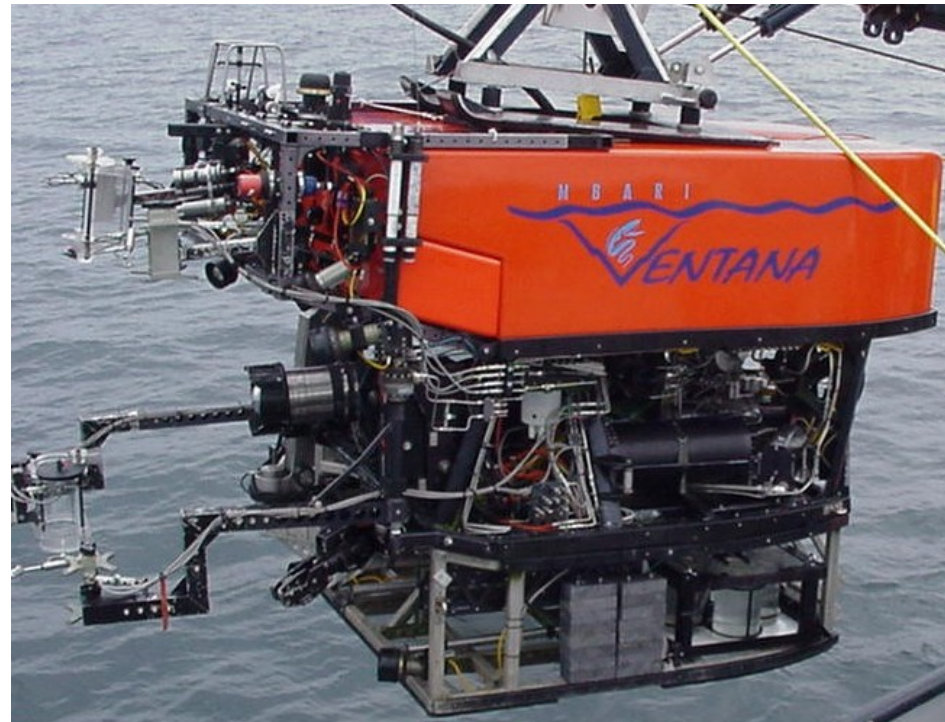


*Image of jpl's mars rover*



# Application Examples

- Submersible ROV: Remotely Operated Vehicle



# Application Examples

- Legged Robots



*jpl's Lemur robot*

# Application Examples

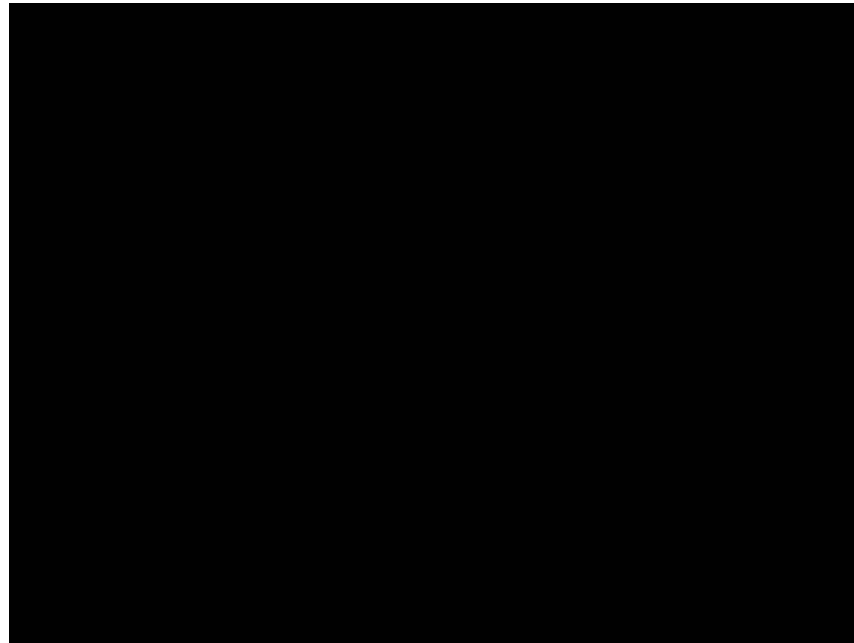
- Security Robots



*Frontline Robotics*

# Application Examples

- Security Robots



# Application Examples

- Multi-Robot Systems



*Kiva Systems*

# Application Examples

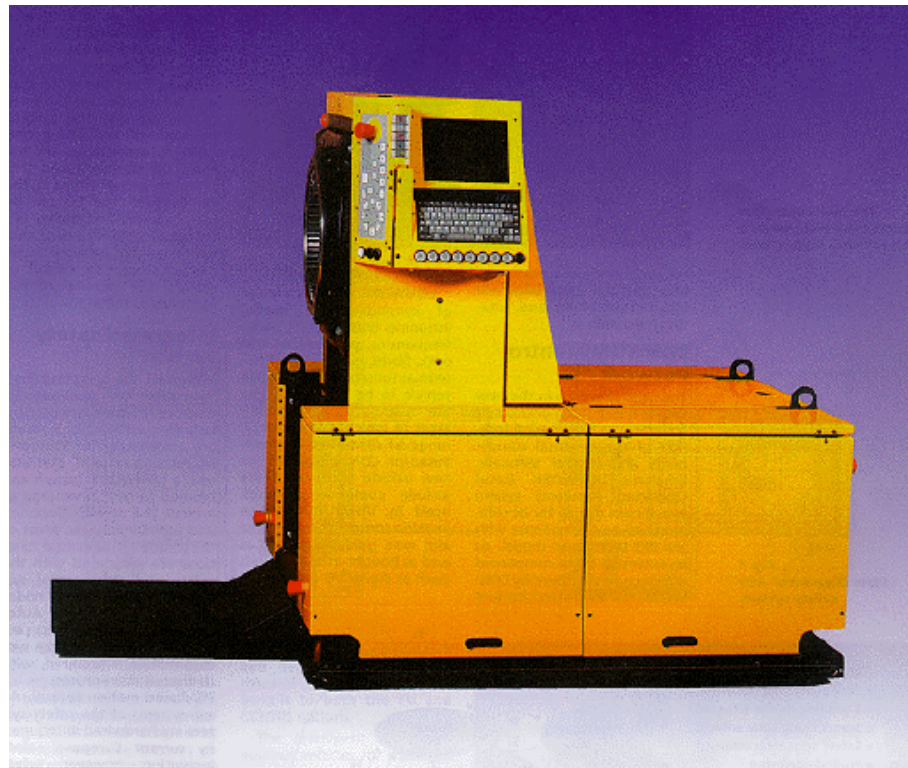
- UAVs: Unmanned Aerial Vehicles



*AUV "Big Blue" from Advanced Ceramics Research, Inc.*

# Application Examples

- AGVs: Autonomic Guided Vehicles



*Volvo's AGV*

# Application Examples

- Competitions



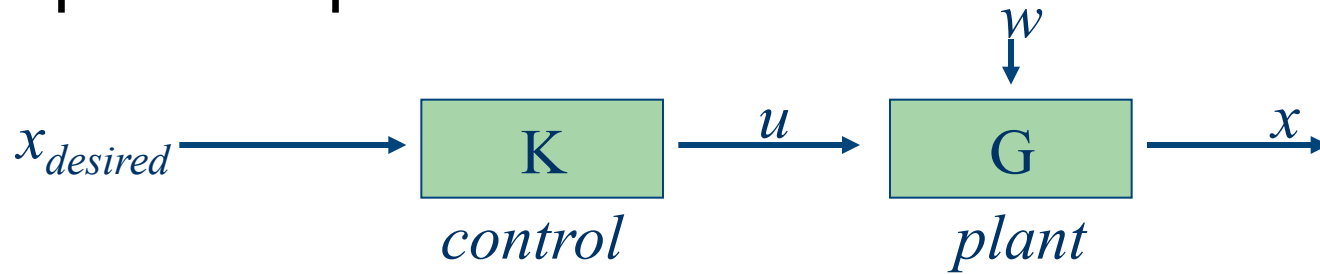


# Navigation and Control

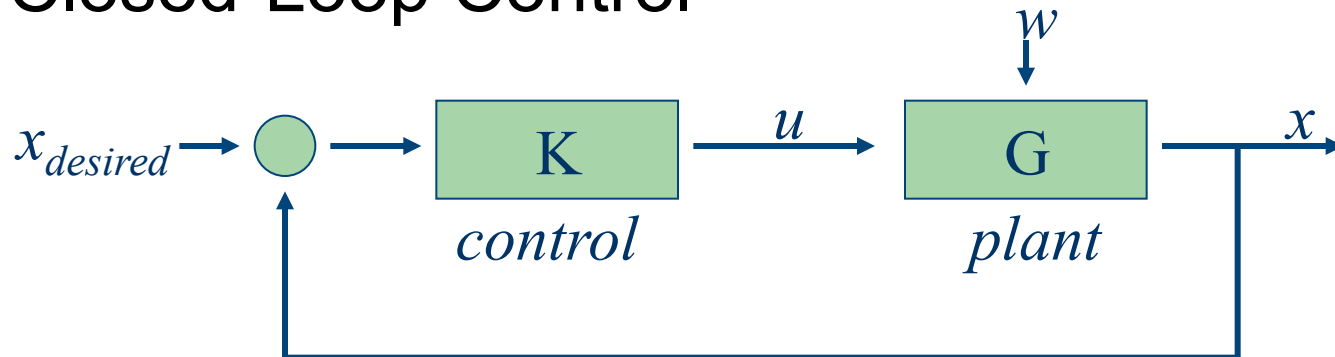
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# Approaches to Control

- Open-Loop Control



- Closed-Loop Control



# Approaches to Control

1. Planning Based Control
  - Traditional methods born out of AI (1960' s +)
2. Reactive (i.e. Behavior) Based Control
  - More recent (mid to late 1980' s)
3. Mixture of Planning and Reactive
  - Today

# Approaches to Control

## Planning Based Control

- Through *perception* and *sensors fusion*, a model of the “real” world is captured in memory.
- A goal is given and a plan is generated, assuming the “real” world is not changing.
- Then, the “*plan*” is executed, one (abstract) “operation” at a time.

# Approaches to Control Planning Based Control

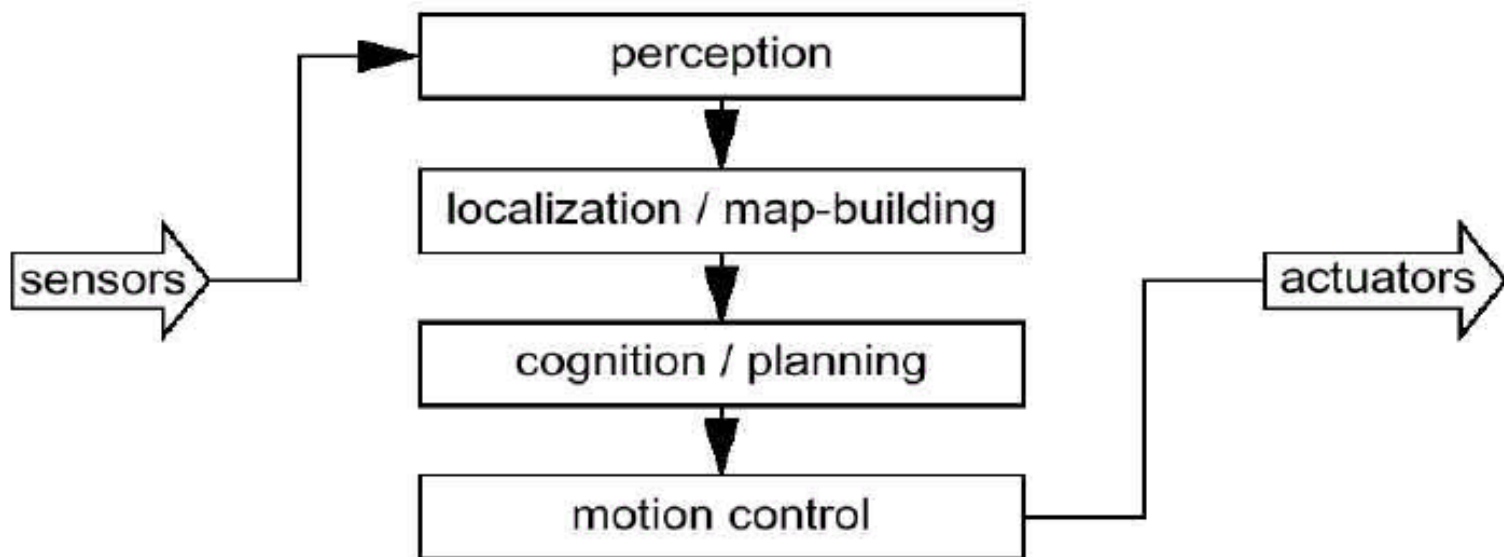
- Example: A robot is equipped with a camera and two arms to perform an assembly task.
  - **Goal:** put part A into part B
  - **World:** where are A and B?
  - **Plan:**
    - move left arm to A;
    - move right arm to B;
    - grab A; grab B;
    - move left and right arm closer;
    - assemble

# Approaches to Control Planning Based Control

- Example continued:
  - What the camera sees is a world of “pixels”.
  - What is “interesting” in the “real” world to be captured?
  - At what level of details should we represent the “real” world?
  - What if during plan execution, the “real” world changes? e.g., drop part A.

# Approaches to Control Planning Based Control

- Planning-based navigation architecture



# Approaches to Control

## Planning Based Control

- Perception, modeling and planning are *computationally intensive*.
- Our model of the “real” world must be at all times *accurate* (consistent and reliable).
- Sudden changes in the world may not be reflected *instantly* in our model.
- This approach works well in a *predictable* world.



# Approaches to Control

## Behavior-Based Control

- Actions are connected to precepts via “*behaviors*”.
- No internal model: The real world is our model.
- A robot *reacts* to changes and exhibits complex behaviors due to both internal and external interactions.



# Control Structures

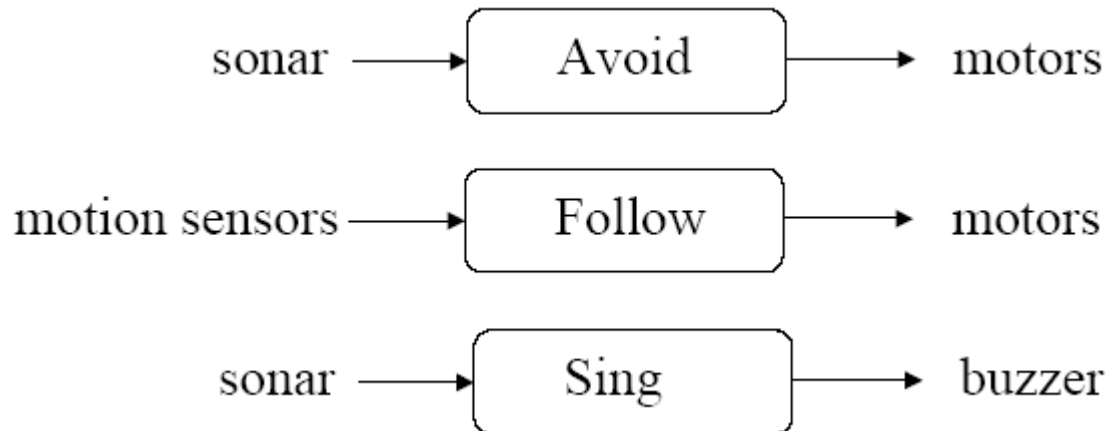
## Behavior-Based Control

- A robot is equipped with many “*simple*” behaviors.
- Each behavior defines its *own* sensor data and actions.
- Interactions among the behaviors are resolved by *coordination*.
- These behaviors are *concurrent* and *independent*; they *react* to changes instantly.

# Control Structures

## Behavior-Based Control

- Example: A simple roaming mobile robot is equipped with the following behaviors:



# Control Structures

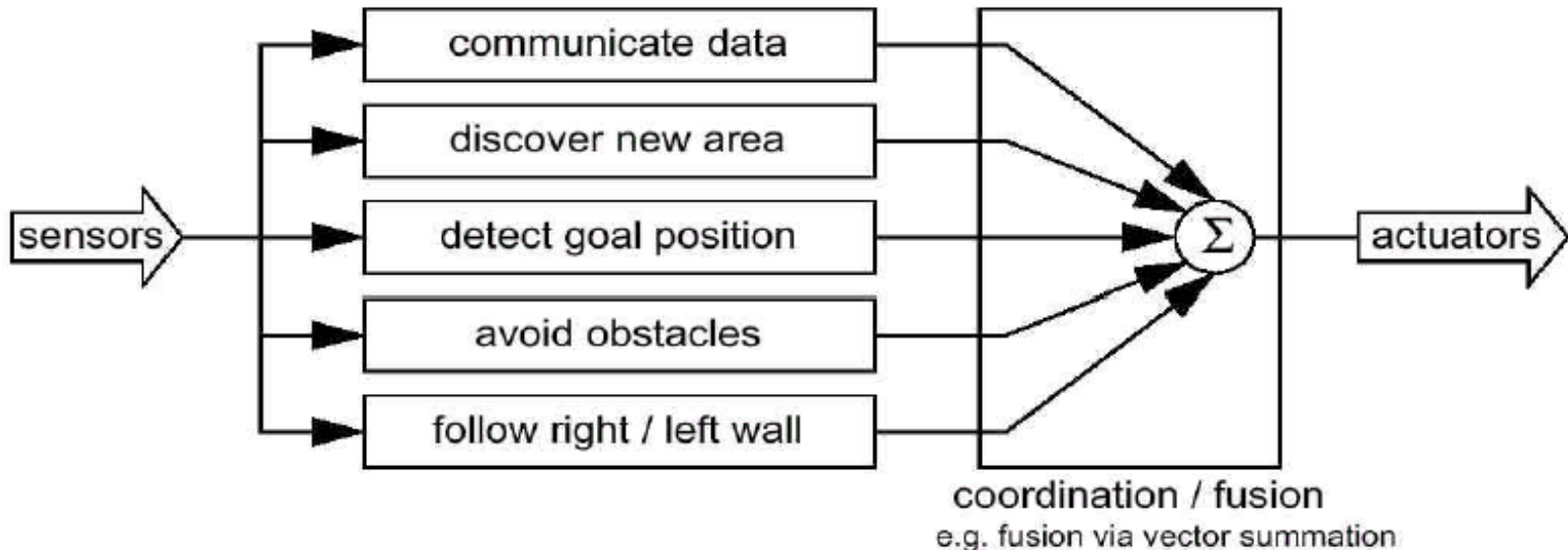
## Behavior-Based Control

- Different behaviors may *share* same sensors and/or actuators.
- *Competitive* or *cooperative* actions are handled by careful coordination.
- Behaviors may be added or deleted *incrementally*.

# Control Structures

## Behavior-Based Control

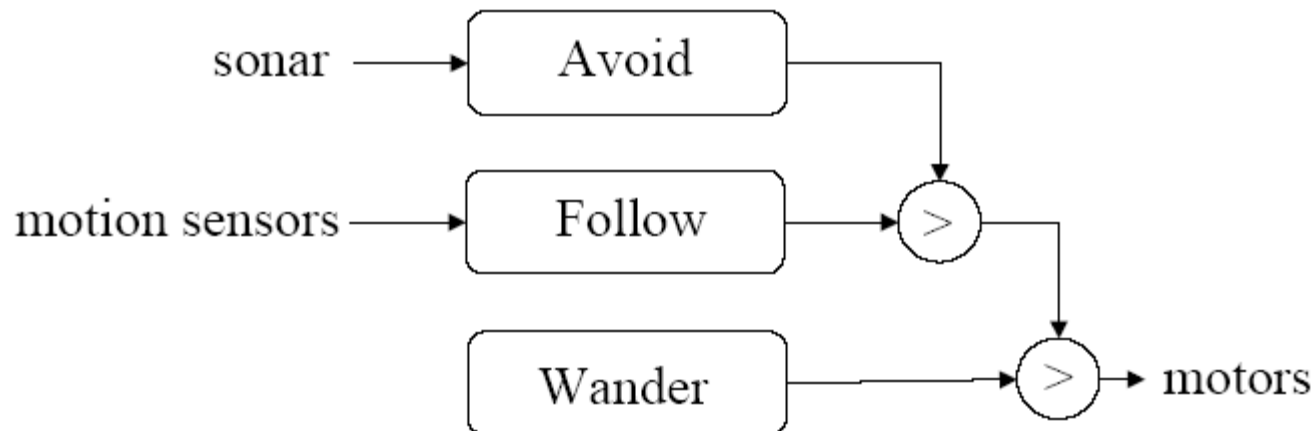
- Subsumption Architecture



# Control Structures

## Behavior-Based Control

- Subsumption Architecture
  - Behavioral coordination can be based on a *fixed* priority of suppression.



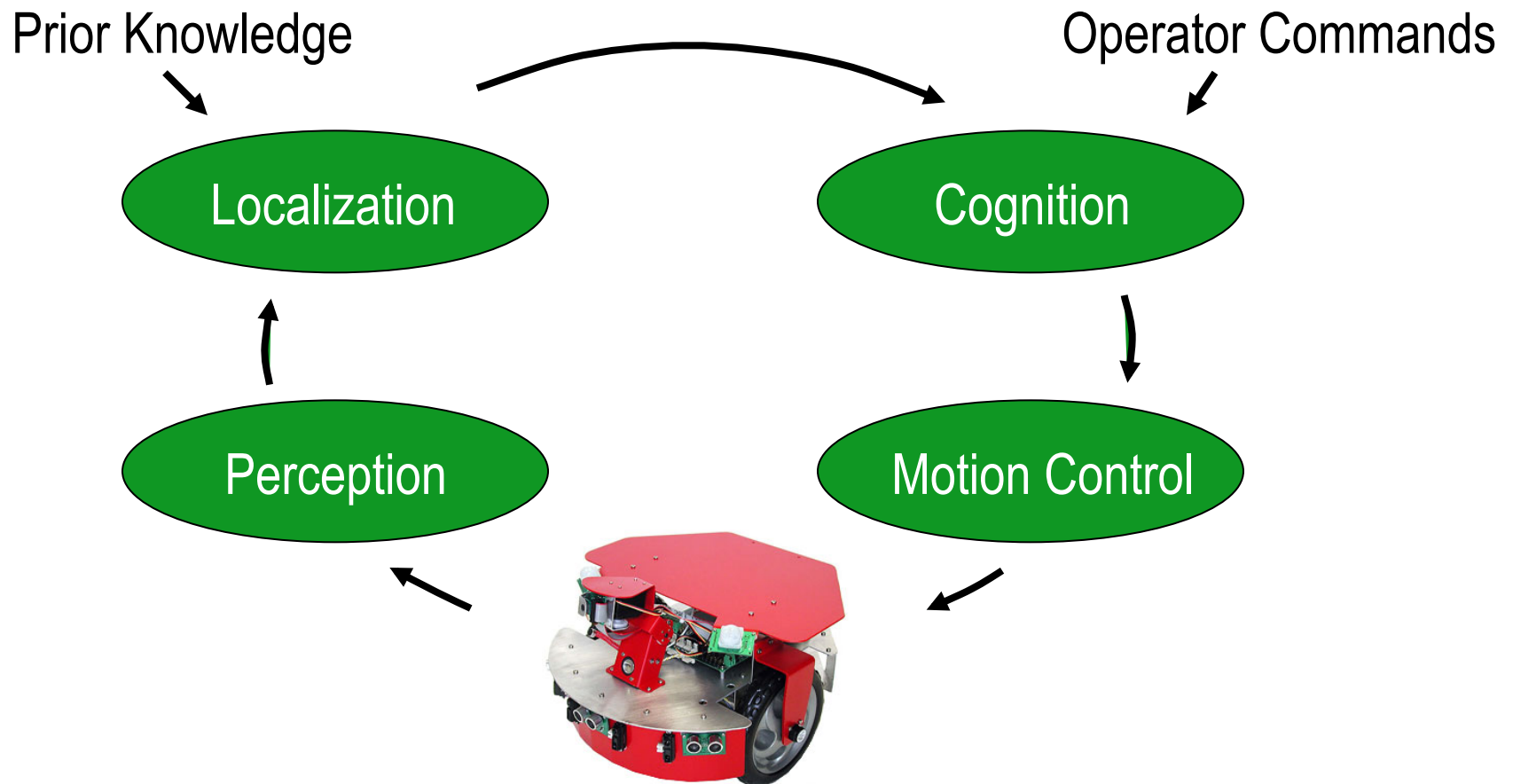
# Control Structures

## Behavior-Based Control

- Each behavior may generate more than one type of action.
- Multiple subsumption orderings may coexist at the same time.
- A behavior may be lower in one ordering, but be higher in an other.
- Each behavior's decision "cycle" time is independent.

# Control Structures

## Planning Based Control

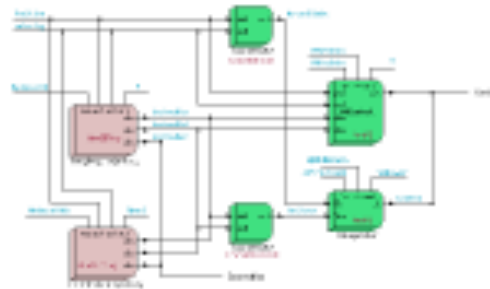






# Motion Control

- Software: Low-Level Control (e.g. PID)

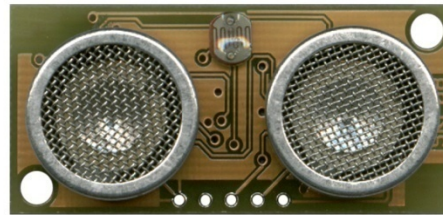


- Hardware: Motors, legs, wheels

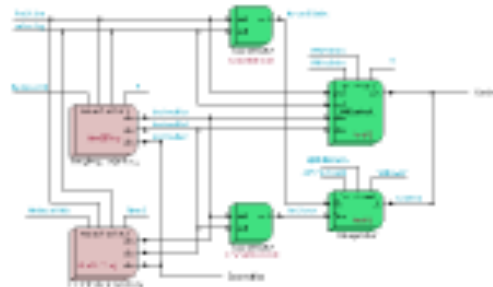


# Perception

- Hardware: Sensors

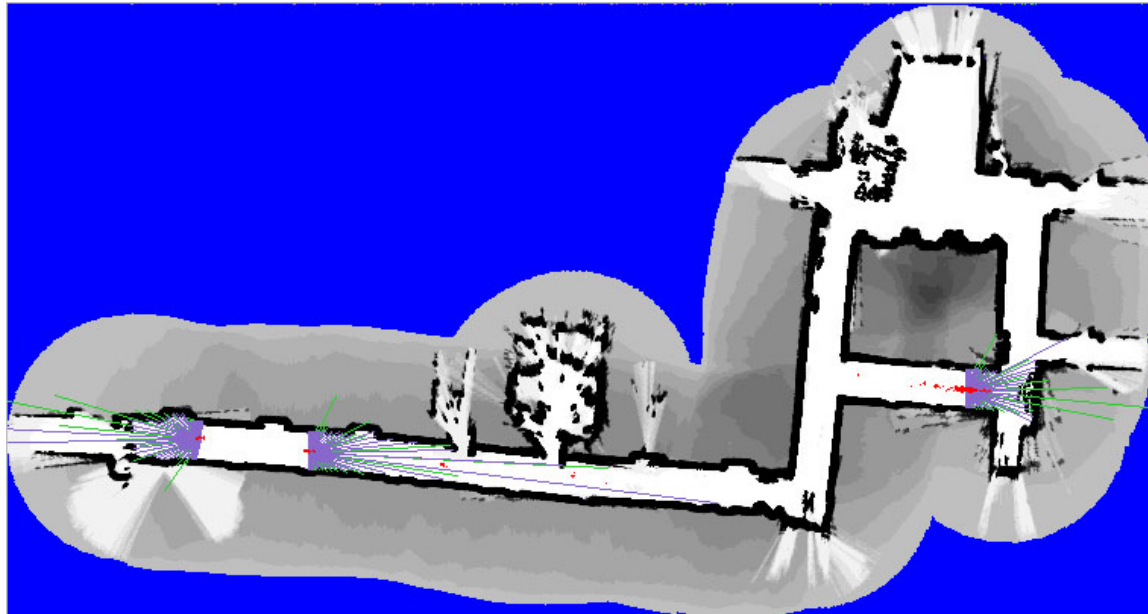


- Software: Filtering raw data



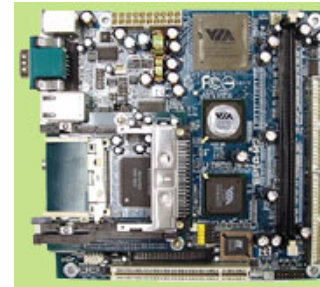
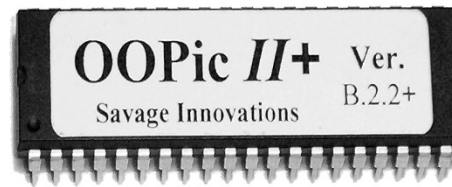
# Localization

- Modeling and Mapping



# Cognition

- Hardware: Processors



- Software: Planning Algorithms

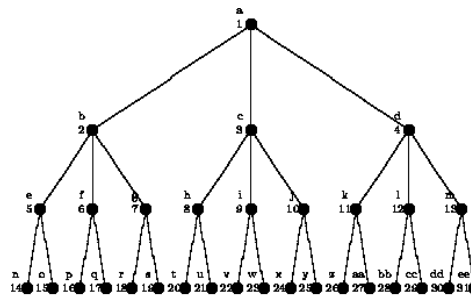
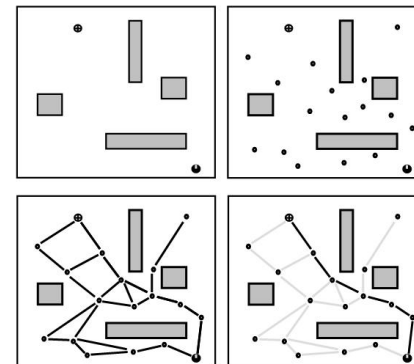


Figure 4: Breadth-First Search





# Navigation and Control

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# Example System 1: Minerva



The Minerva  
Experience