

# **EGN 3060c: Introduction to Robotics**

## **Lecture 4: Robot Architectures: Deliberative and Reactive**

Instructor: Dr. Gita Sukthankar

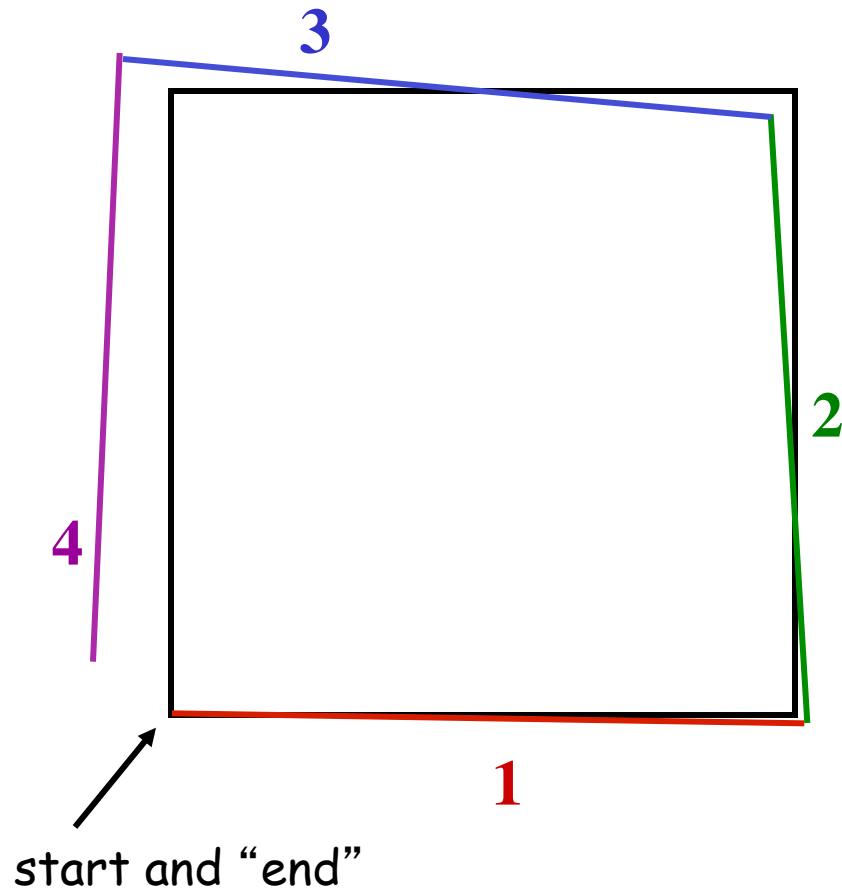
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# Announcements

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- Webcourses should be updated with the background material and reading.
- Please make sure that you have formed groups; I will try to add the groups into webcourses.
- HW1 due today; please doublecheck it to make sure that it is coherently written.
- No class on Monday (Labor Day)
- Lab 2: robot's movement and odometry
- Next assignment due: Sept 17<sup>th</sup> (Lab 2 report)
- Please review the terk javadocs under Lab directory

# Lab 2: Robot Movement



- Create a program that will run your robot in a square (~2m to a side), pausing after each side before turning and proceeding.
- For 4 runs, collect both the odometric estimates of where the robot thinks it is and where the robot *actually is* after each side.
- You should end up with two sets of angle measurements and length measurements: one set from odometry and one from “ground-truth.”
- Find the **mean** and the **standard deviation** of the *differences* between odometry and ground truth for the angles and for the lengths – this is the robot’s *motion uncertainty model*.

This provides a *probabilistic kinematic* model.

# Useful Robot Functions

Purpose	Functions
User input	<code>waitForPlay()</code> <code>isPlaying()</code> <code>getTextFieldValueAsInt()</code>
Sensors	<code>bumpRight()</code> <code>bumpLeft()</code>
Movement	<code>moveMotors()</code> <code>moveDistance()</code>
Turning	<code>moveAngle()</code>
Stopping	<code>stopMoving()</code>
Program Output	<code>writeToTextField()</code>
Other	<code>dockRobot()</code> <code>unDockRobot()</code>

# Lab Report

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- First one due Sept 17<sup>th</sup>
- Between 1-2 page writeup describing your robot code
- Include any other pictures or results specifically asked for
- Useful styles
  - Pseudocode
  - Javadoc style comments about key methods
  - List of steps describing operation of robot
  - Free form text does **not** usually work well
- Accompanying java files for the main section of program and any other new classes and methods introduced (CreateMove.java)
- Graded on: clarity, detail, and correctness (1-3 pts)

# Robotics Research

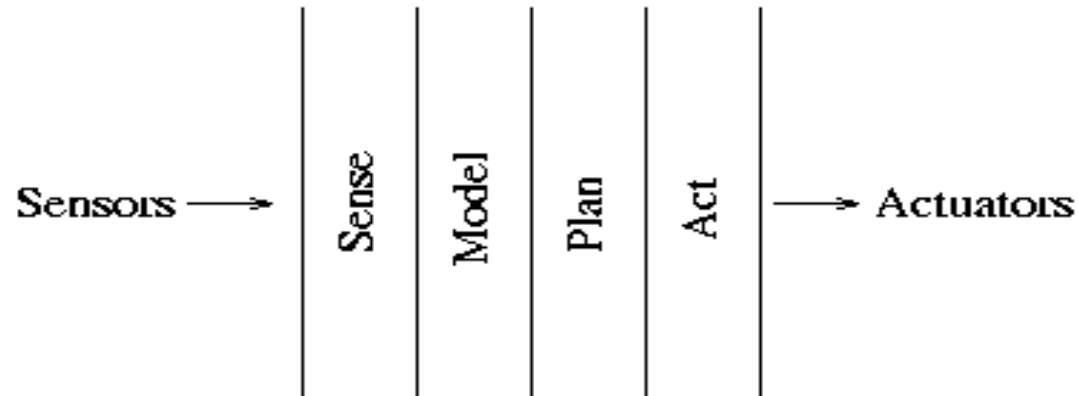
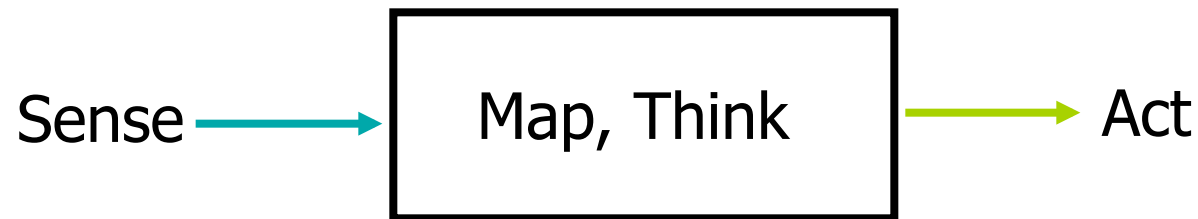
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- Complete system vs. partial system?
- No hardware—simulation only, computer vision?
- Dirty, dull, or dangerous application areas?
- Service robotics: devices to help humans in their activities of daily living
- General research areas:
  - Manipulation/locomotion (actuation)
  - Computer vision (perception)
  - Machine learning or planning (cognition)
  - Human-robot interaction
  - Mobile robotics
  - Humanoid robotics
  - UAVs

# Deliberative Architecture

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- Maps, lots of state
- Look-ahead



# Reactive Architecture

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- No maps, no state
- No look ahead

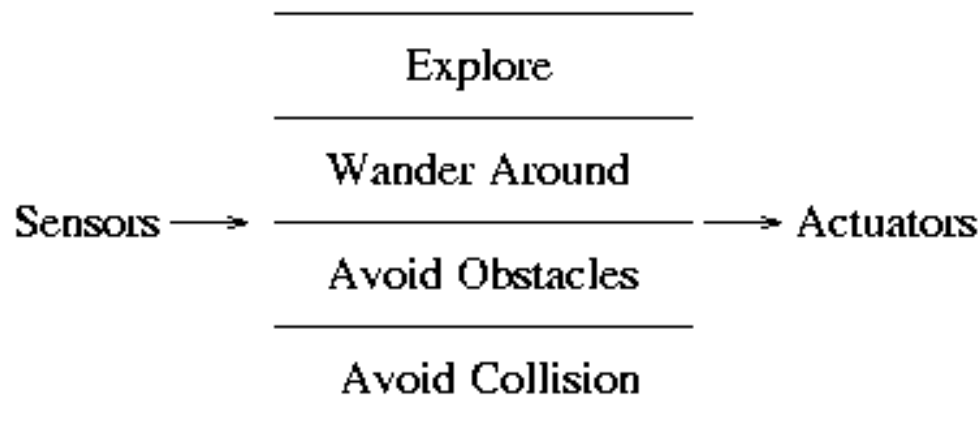




# Behavior-based Architecture

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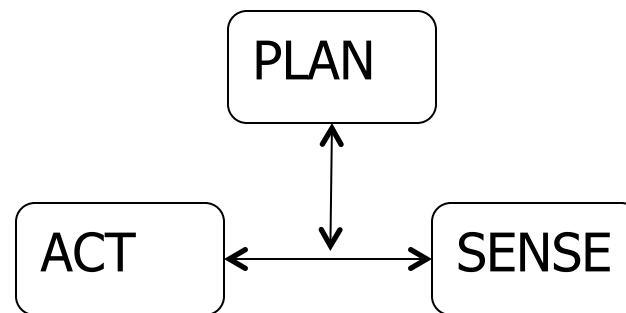
- Reactive + state information
- State information allows robot to retain memory of previous actions
- Easily implemented



# Hybrid architectures

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- Information flows in multiple directions
- Implementation is often multi-threaded
- Look ahead but continue to react to incoming sensory information
- Combines long and short time scales
- Used in most real-world robotic systems



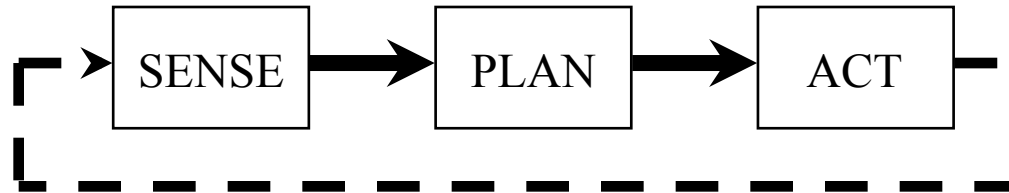
# Criteria For Selection

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	deliberative	reactive	behavior
Task and environment	structured	unstructured	both
Run-time constraints	“thinking time”	“reflex”	mix
Correctness/ Completeness	provable	hard	really hard
Hardware	Sensors, processor	Lots of sensors	mix

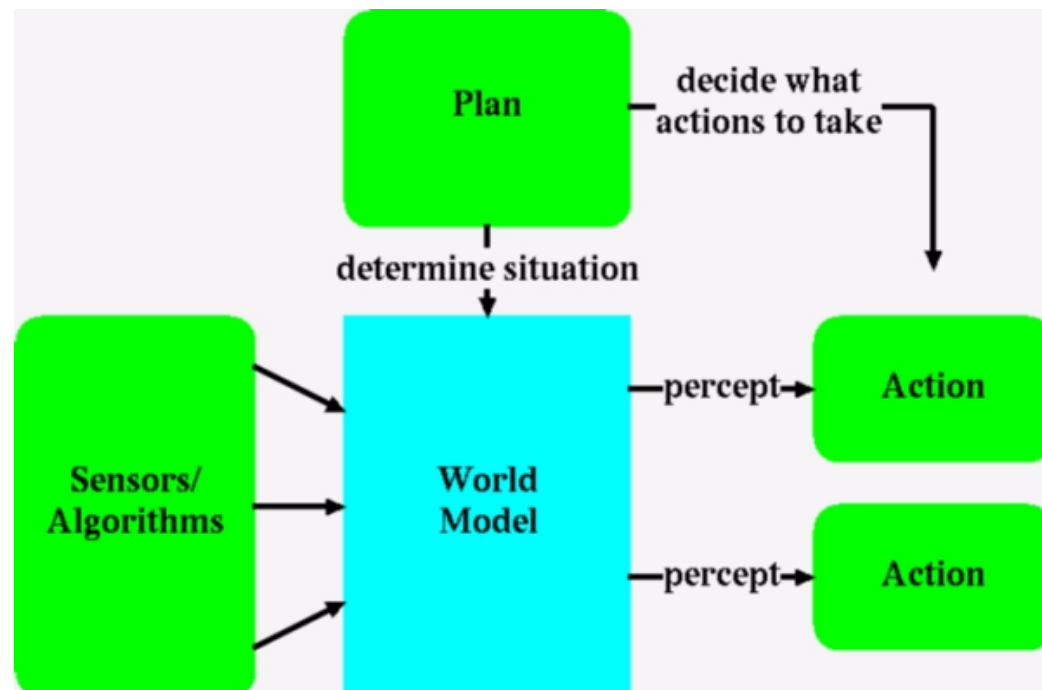
# Deliberative Architecture

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- Robot builds a model of the world, and deliberates over the model before acting.

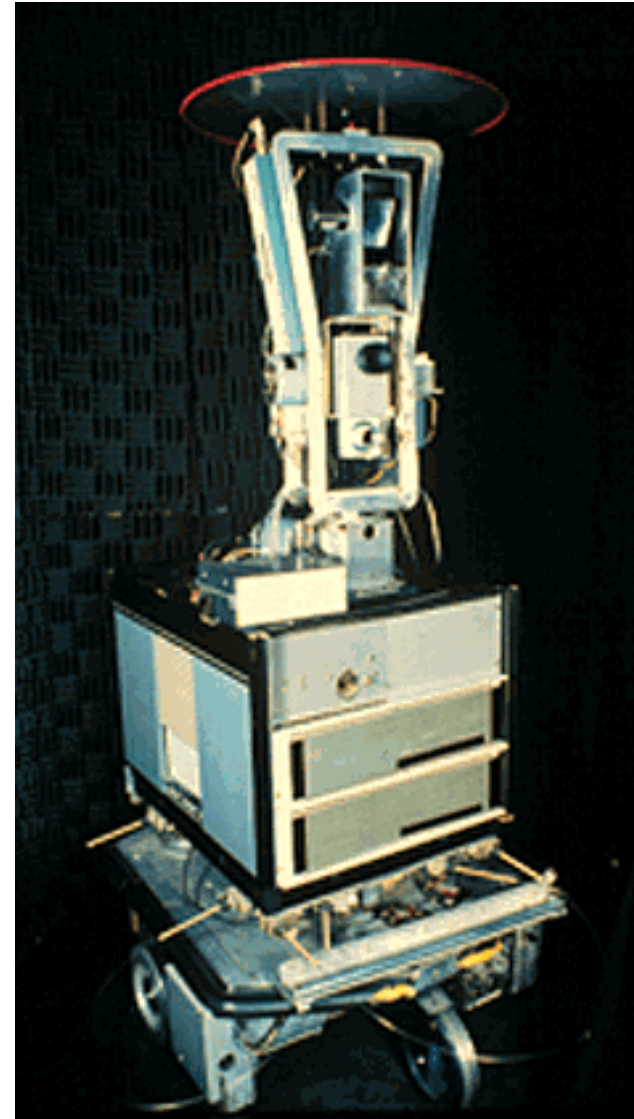
World model:  
1. A priori rep  
2. Sensed info  
3. Cognitive



# Shakey

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- Early research robot platform
- Built by SRI (Stanford Research Institute) for DARPA 1967-9
- Used **STRIPS** as main algorithm for controlling what to do
- (**ST**anford **R**esearch **I**nstitute **P**roblem **S**olver)
- STRIPS uses a propositional logic representation of the world.
- 50<sup>th</sup> anniversary of Shakey!



# General Approach to Planning

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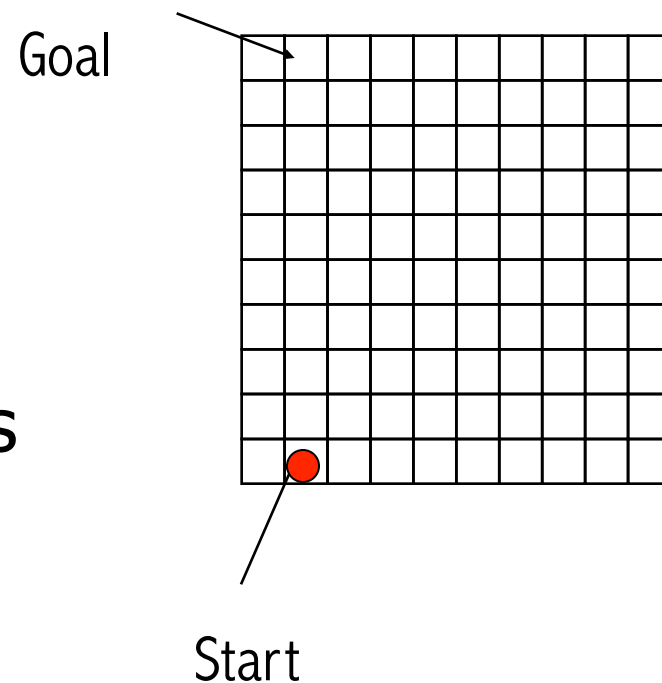
- Define
  - Possible states (e.g. situations)
  - Operators (actions) that move the robot from one state to another
  - Operator costs
- Problem
  - Find some sequence of operators that move robot from start state to goal state
- Optimize
  - Search to find operator sequence with minimum cost

# Example: Navigation

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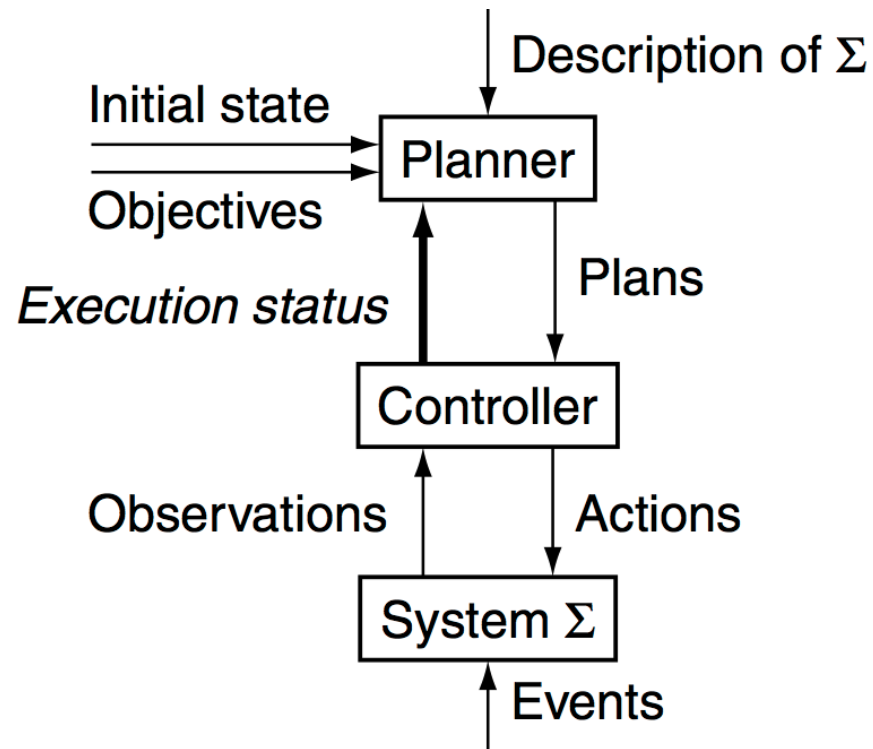
- State: location  $(x,y)$
- Operators: move N, S, E, W
- Costs: 1 per move

- Start
- Goal
- But planning can be applied to many problems beyond navigation



# AI Planning

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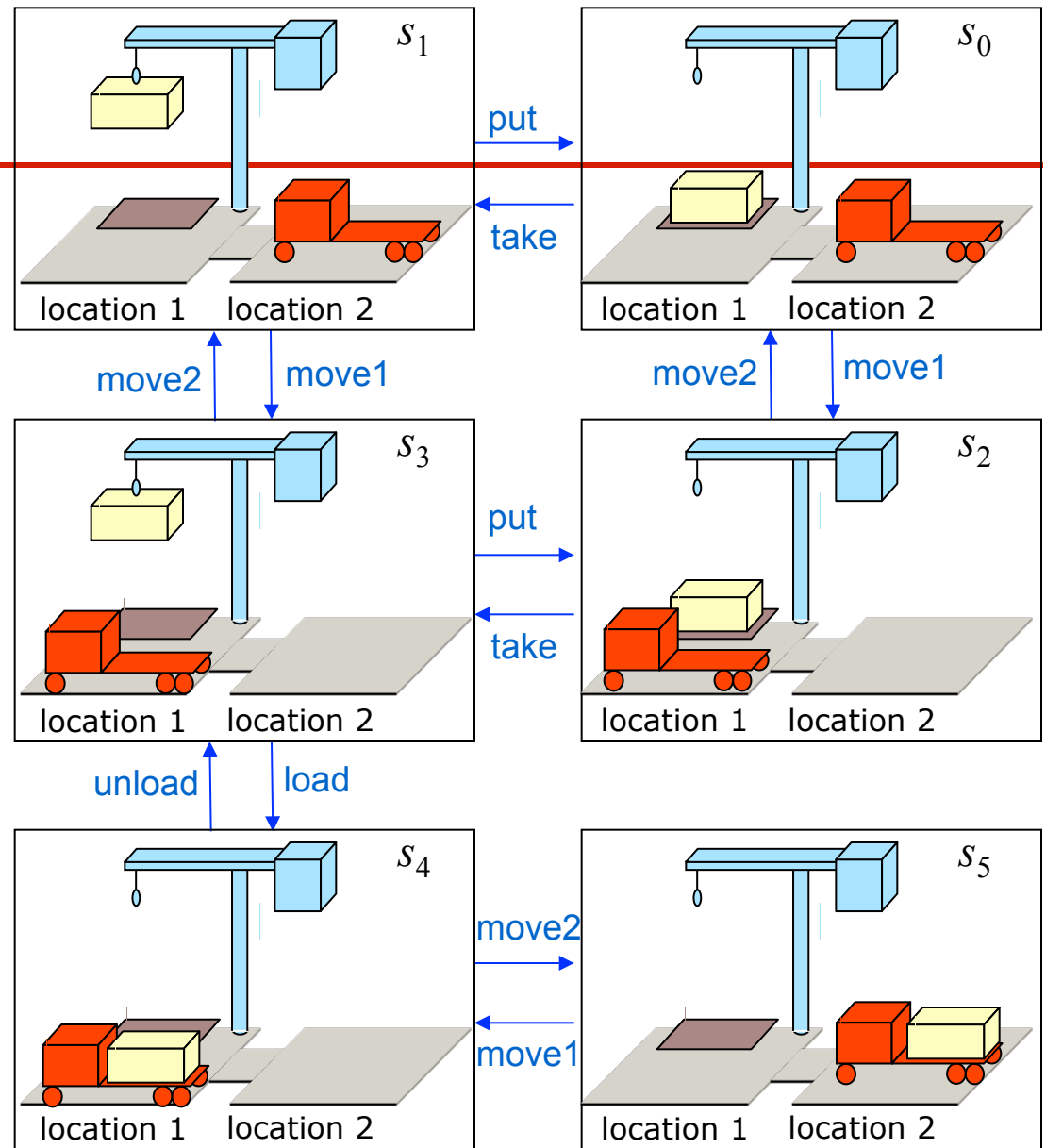
- **Planner** operates on a the (symbolic) model of world state
- Using search and optimization techniques the planner constructs a procedure for the agent to follow
- **Controller** takes plan and translates it into executable commands.



# State Transition Model

$$\Sigma = (S, A, E, \gamma)$$

- $S = \{\text{states}\}$
- $A = \{\text{actions}\}$
- $E = \{\text{exogenous events}\}$
- State-transition function  
 $\gamma: S \times (A \cup E)$ 
  - $S = \{s_0, \dots, s_5\}$
  - $A = \{\text{move1, move2, put, take, load, unload}\}$
  - $E = \{\}$
  - $\gamma$ : see the arrows



The Dock Worker Robots (DWR) domain

# Problem Description

Description of  $\Sigma$

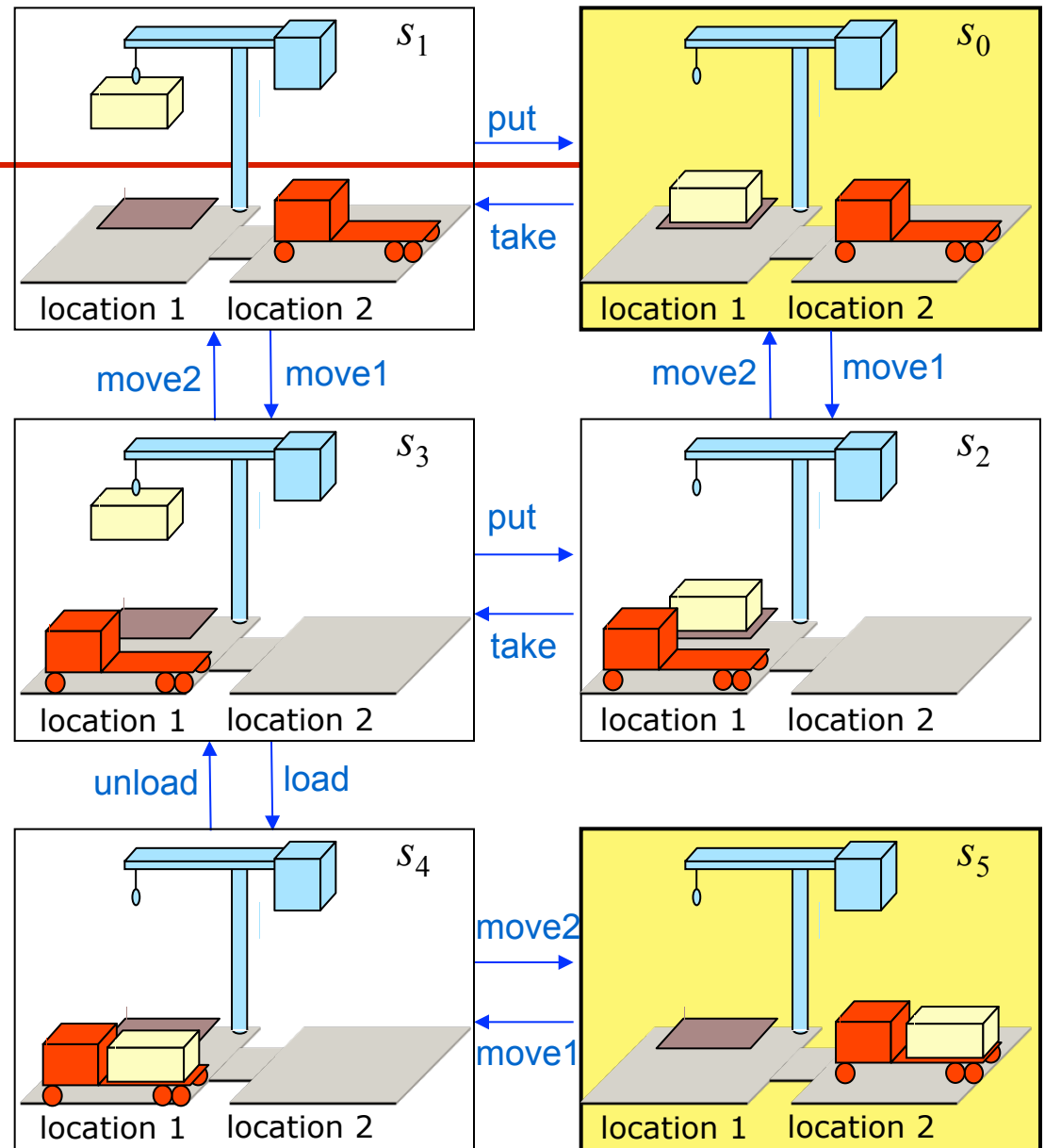
Initial state or set of states

Initial state =  $s_0$

Objective

Goal state, set of goal states, set of tasks, “trajectory” of states, objective function, ...

Goal state =  $s_5$



The Dock Worker Robots (DWR) domain

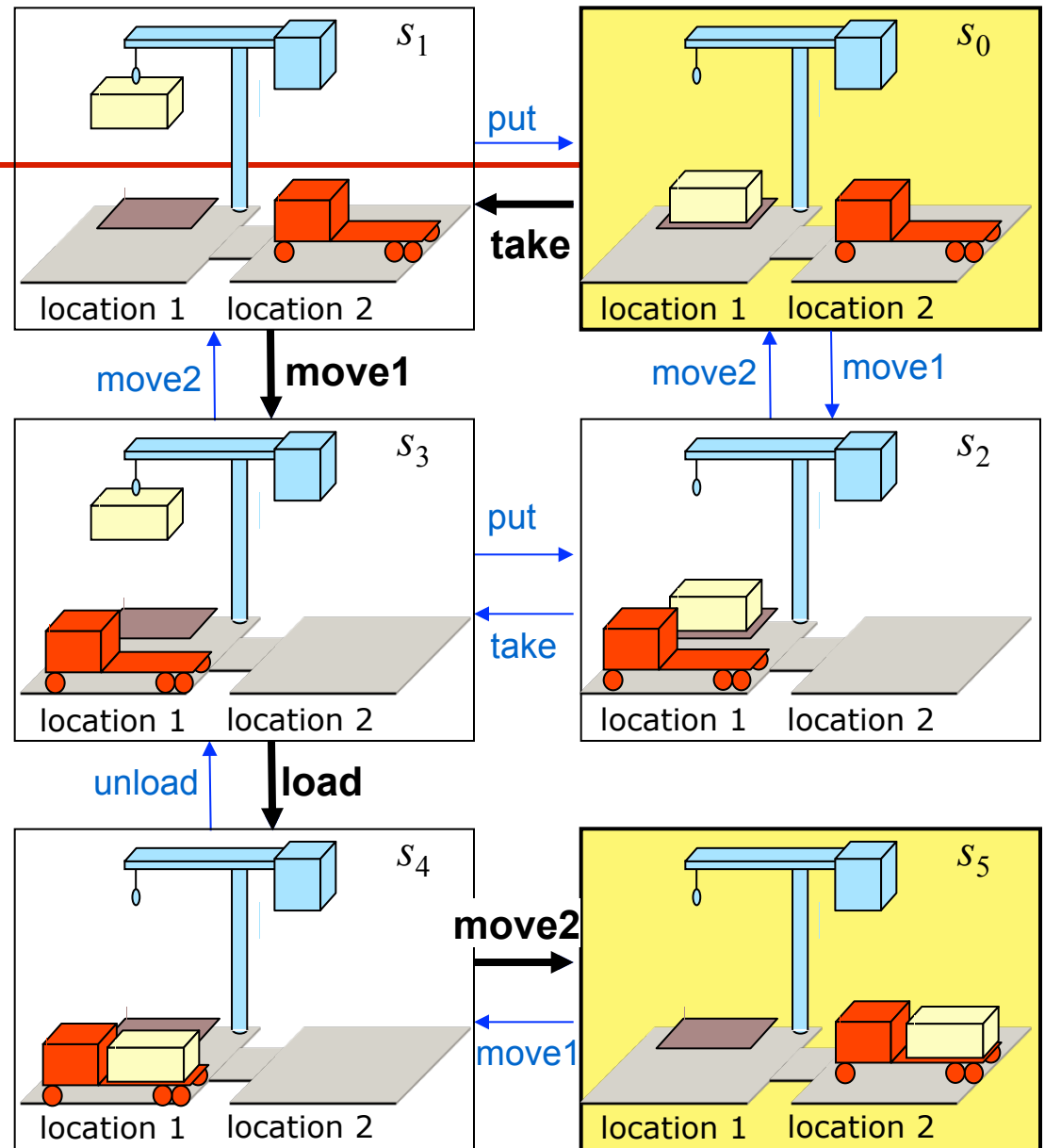
# Plans

**Classical plan:** a sequence of actions

$\langle \text{take}, \text{move1}, \text{load}, \text{move2} \rangle$

**Policy:** partial function from  $S$  into  $A$

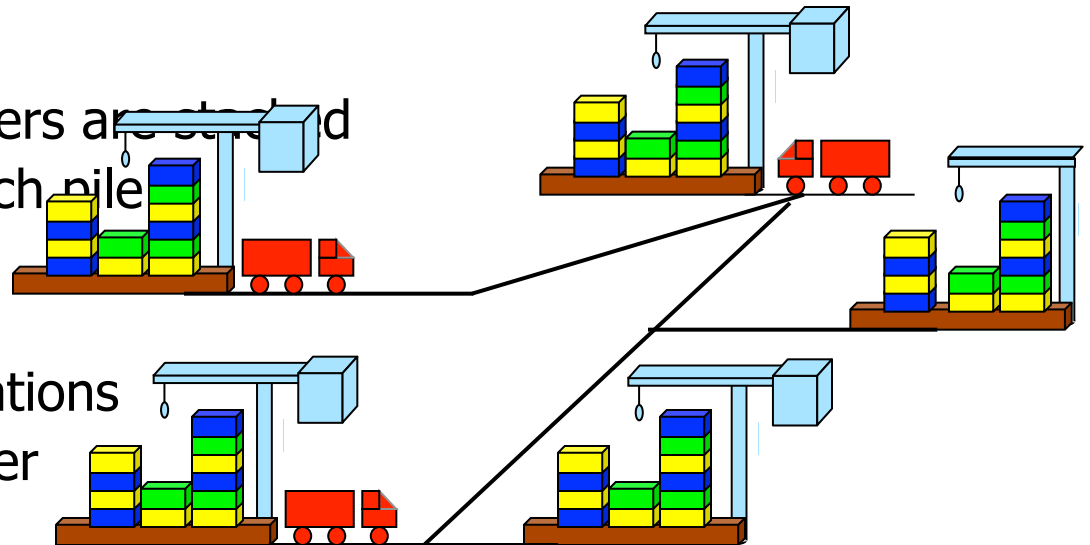
$\{(s_0, \text{take}),$   
 $(s_1, \text{move1}),$   
 $(s_3, \text{load}),$   
 $(s_4, \text{move2})\}$



The Dock Worker Robots (DWR) domain

# World Model

- **Locations:**  $l_1, l_2, \dots$
- **Containers:**  $c_1, c_2, \dots$ 
  - can be stacked in piles, loaded onto robots, or held by cranes
- **Piles:**  $p_1, p_2, \dots$ 
  - fixed areas where containers are stacked
  - pallet at the bottom of each pile
- **Robot carts:**  $r_1, r_2, \dots$ 
  - can move to adjacent locations
  - carry at most one container
- **Cranes:**  $k_1, k_2, \dots$ 
  - each belongs to a single location
  - move containers between piles and robots
  - if there is a pile at a location, there must also be a crane there



# How to construct a plan?

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- Search through the list of possible actions (and parameters) until you find a valid sequence that changes the world state in a desired way
- Research issues:
  - Representing world state
  - Making the search fast/tractable
  - Choosing good order for selecting operators
  - Handling conflicting subgoals
- We'll discuss this in more detail when we talk about motion planning.

# STRIPS: Means-ends analysis

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“Go to Stanford AI Lab”

INITIAL STATE: Tampa, Florida (0,0)

GOAL STATE: Stanford, California (1000,200)

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Difference: 1020 miles

Use difference to determine which operator is relevant in a situation

States are represented by sets of propositions and a truth value

# Difference Table

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Distance (difference)	Mode of transportation (OPERATOR)
$d \leq 200$ miles	FLY
$100 < d < 200$	TRAIN
$d \leq 100$	DRIVE
$d < 1$	WALK

***mode=difference\_table(INITIAL STATE, GOAL STATE, difference)***

1. Look up what to do: FLY
2. Not at Stanford, so repeat
3. Look up what to do: DRIVE

# Preconditions

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difference	OPERATOR	PRECONDITIONS
$d \leq 200$ miles	FLY	
$100 < d < 200$	TRAIN	
$d \leq 100$	DRIVE (rental)	at airport
	DRIVE (personal car)	at home
$d < 1$	WALK	

In order for the operator to be applied the precondition must be true.



# Updating World Model

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distance	OPERATOR	PRECONDITI ONS	ADD-LIST	DELETE- LIST
$d \leq 200$ miles	FLY		at city Y at airport	at city X
$100 < d < 200$	TRAIN		at city Y at train station	at city X
$d \leq 100$	D R I V E (rental)	at airport		
	D R I V E (personal)	at home		
$d < 1$	WALK			

# STRIPS Summary

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- Designer must set up
  - World model representation
  - Difference table with operators, preconditions, add & delete lists
  - Difference evaluator
- Pros
  - Relatively easy to define new domains
  - Handles many domains quite well (blocks-world, transportation planning)
- Cons
  - ?

# STRIPS Summary

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- Assumes ***closed world***
  - Closed world: world model contains everything needed for robot (implication is that it doesn't change)
  - Open world: world is dynamic and world model may not be complete
- Suffers from ***frame problem***
  - How to represent effects of actions without explicitly having to enumerate intuitively obvious side effects
  - Representation grows too large to reasonably operate over
- Simplistic representation (doesn't handle planning about resources, metacontrol, uncertainty)

# Shakey Video

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- <https://www.youtube.com/watch?v=qXdn6ynwpiI>

# Docking using Deliberation

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- How does the robot find home base and dock using a planner and deliberative architecture?

# Summary

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- Deliberative control architectures maintain a world model and lookahead to possible future states.
- STRIPS/Shakey is one of the earliest examples of coupling a robot with a planner.
- Main problem with deliberative planners is that dynamic environments quickly render their plans obsolete
- In practice, deliberative planners are usually coupled with a lower layer of reactive control primitives within a hybrid architecture.

# Control Architecture Types

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- Deliberative control
- **Reactive control**
- Hybrid control
- Behavior-based control

# Reactive Architecture

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- No maps, no state
- No look ahead
- No planner, no need for fancy search techniques
- Biologically inspired by S-R behaviors in animals





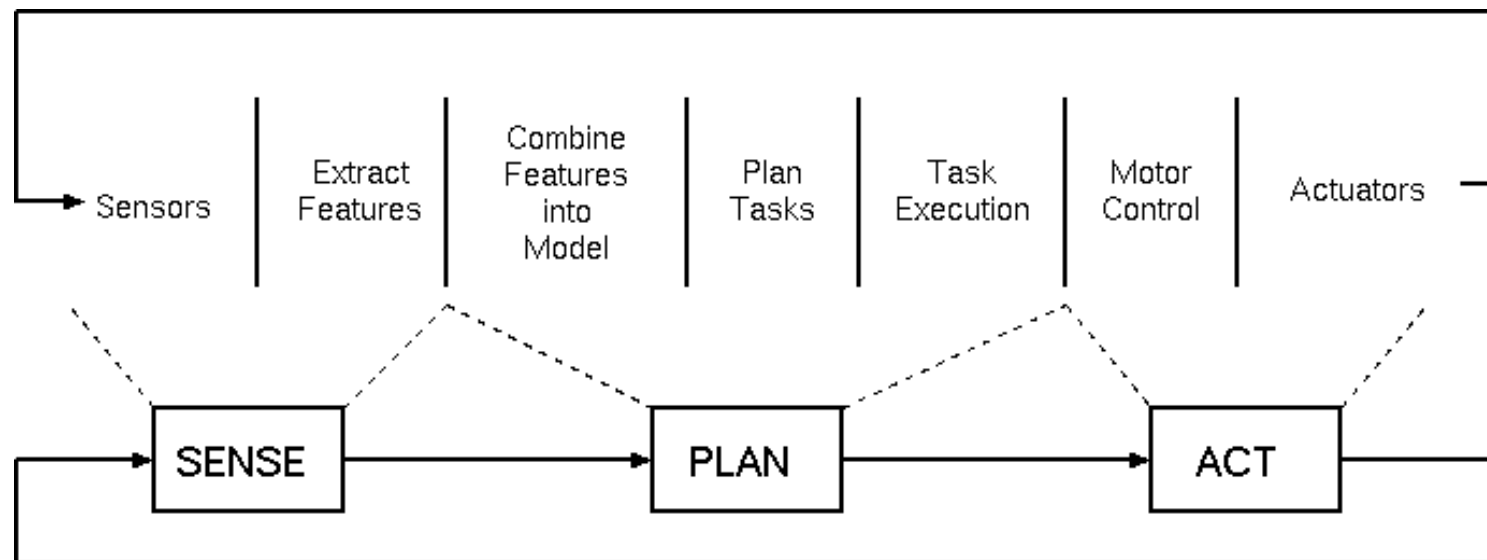
# Animal Behavior

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- Some robots model the form of animals (Sony Aibo).
- Many roboticists have been inspired to mimic and model animal behaviors.
  - fleeing
  - foraging
  - taxes (movement towards a particular orientation)
  - homing
- Reactive architectures have been used to model many types of animal behaviors.

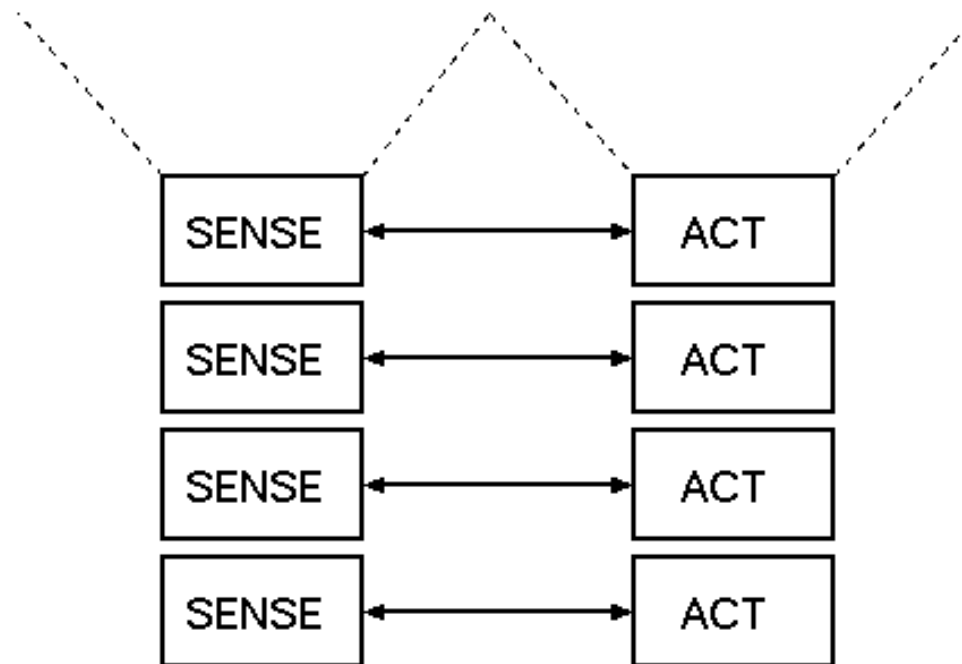
# Deliberative Architectures are “Horizontal”

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# More Biological is “Vertical”

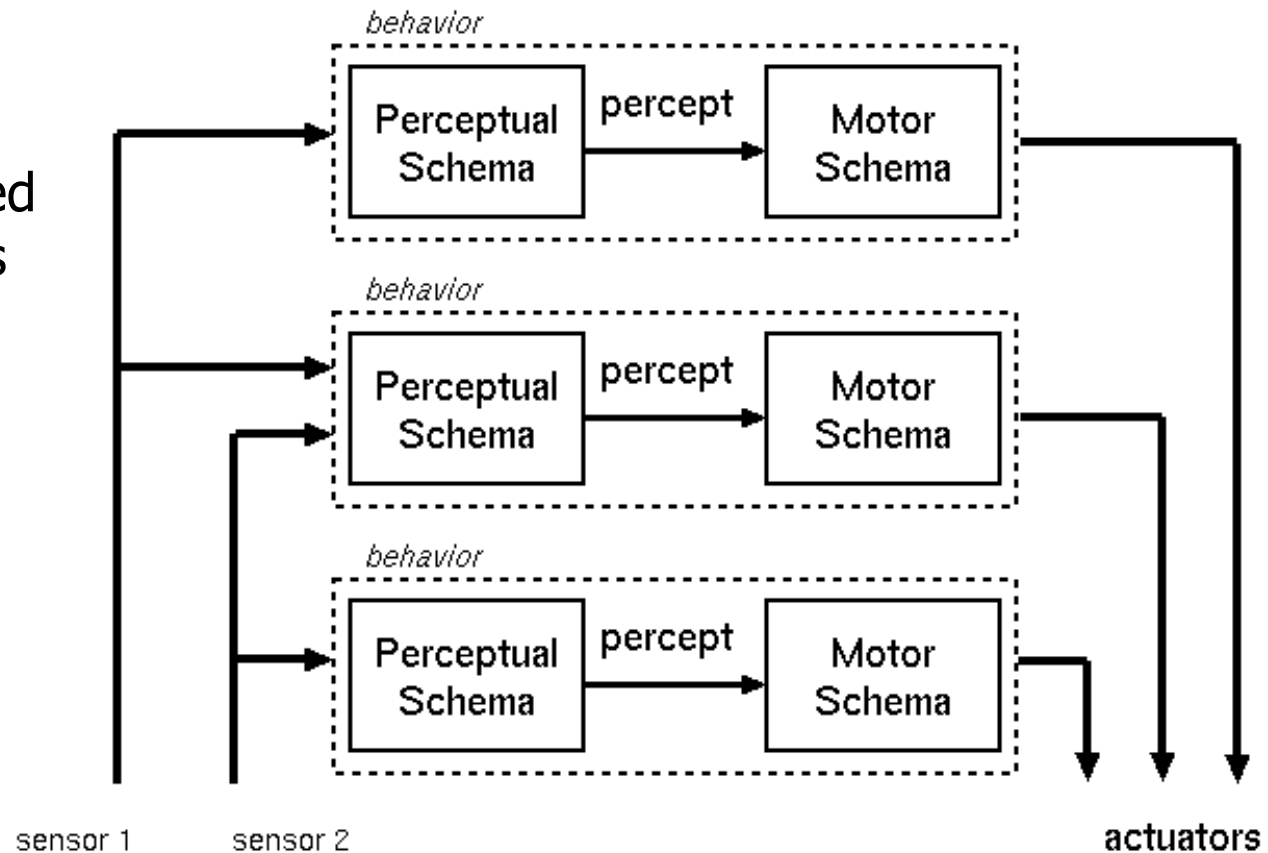
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# Sensing is Behavior-Specific or Local

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No central world model maintained across behaviors



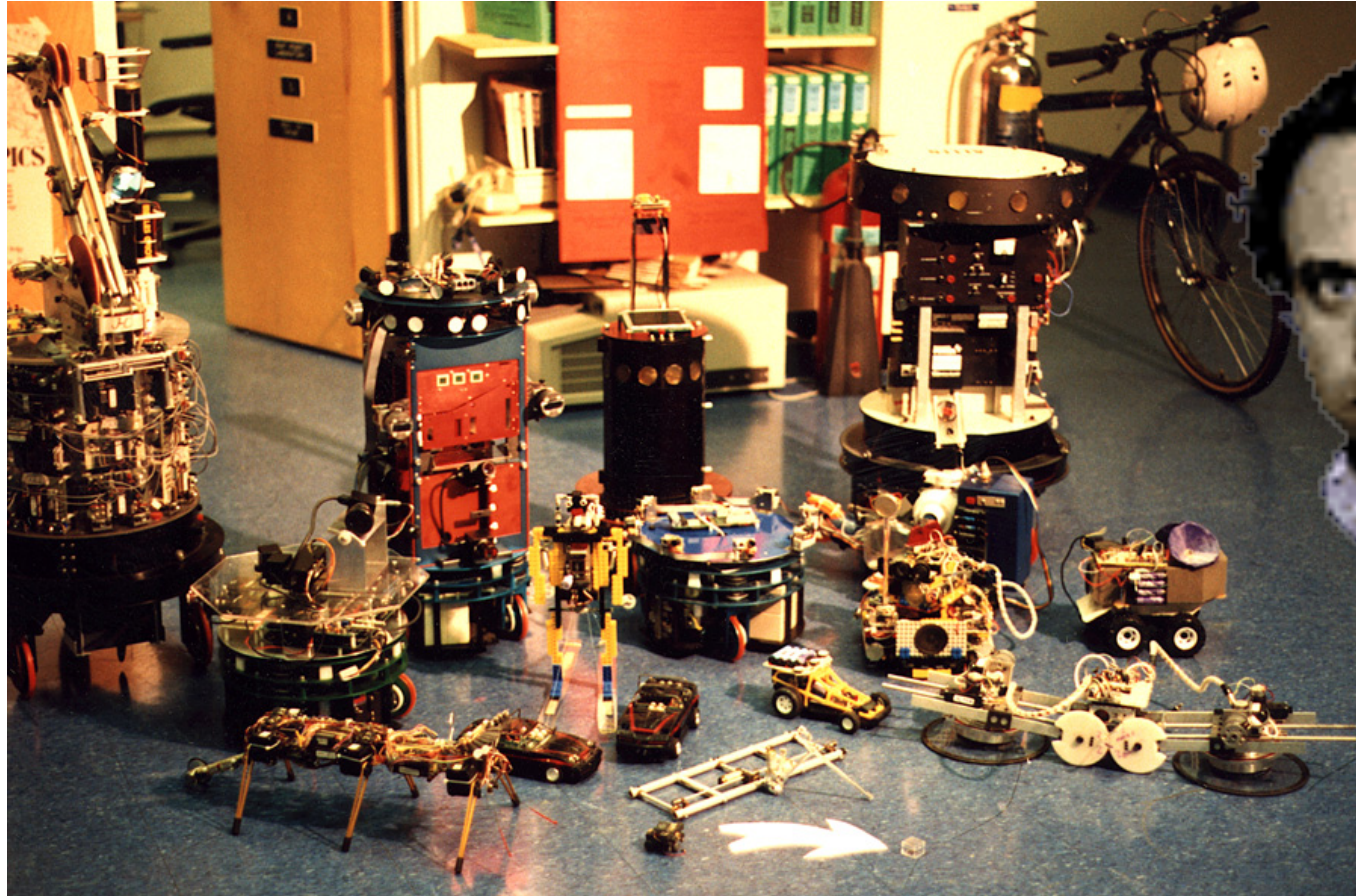
# Reactive

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- Historically, there are two main styles of creating a reactive system
  - Subsumption architecture
    - Layers of behavioral competence
    - How to control relationships
  - Potential fields
    - Concurrent behaviors
    - How to navigate
- They are equivalent in power; the main difference is in how the behaviors are combined.

# Subsumption (Brooks, MIT)

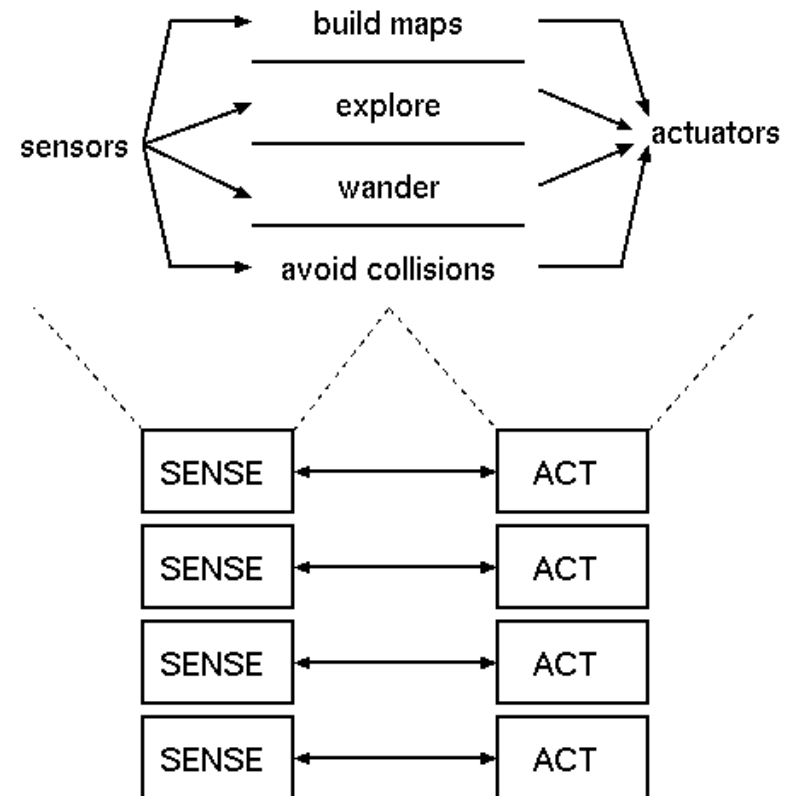
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<http://www.youtube.com/watch?v=K2xUHYFcYKI>

# Subsumption Philosophy

- Modules should be grouped into *layers of competence*
- Modules in a higher level can override or *subsume* behaviors in the next lower level
  - Suppression: substitute input going to a module
  - Inhibit: turn off output from a module
- **No internal state** in the sense of a local, persistent representation similar to a world model.
- Architecture should be *taskable*: accomplished by a higher level turning on/off lower layers

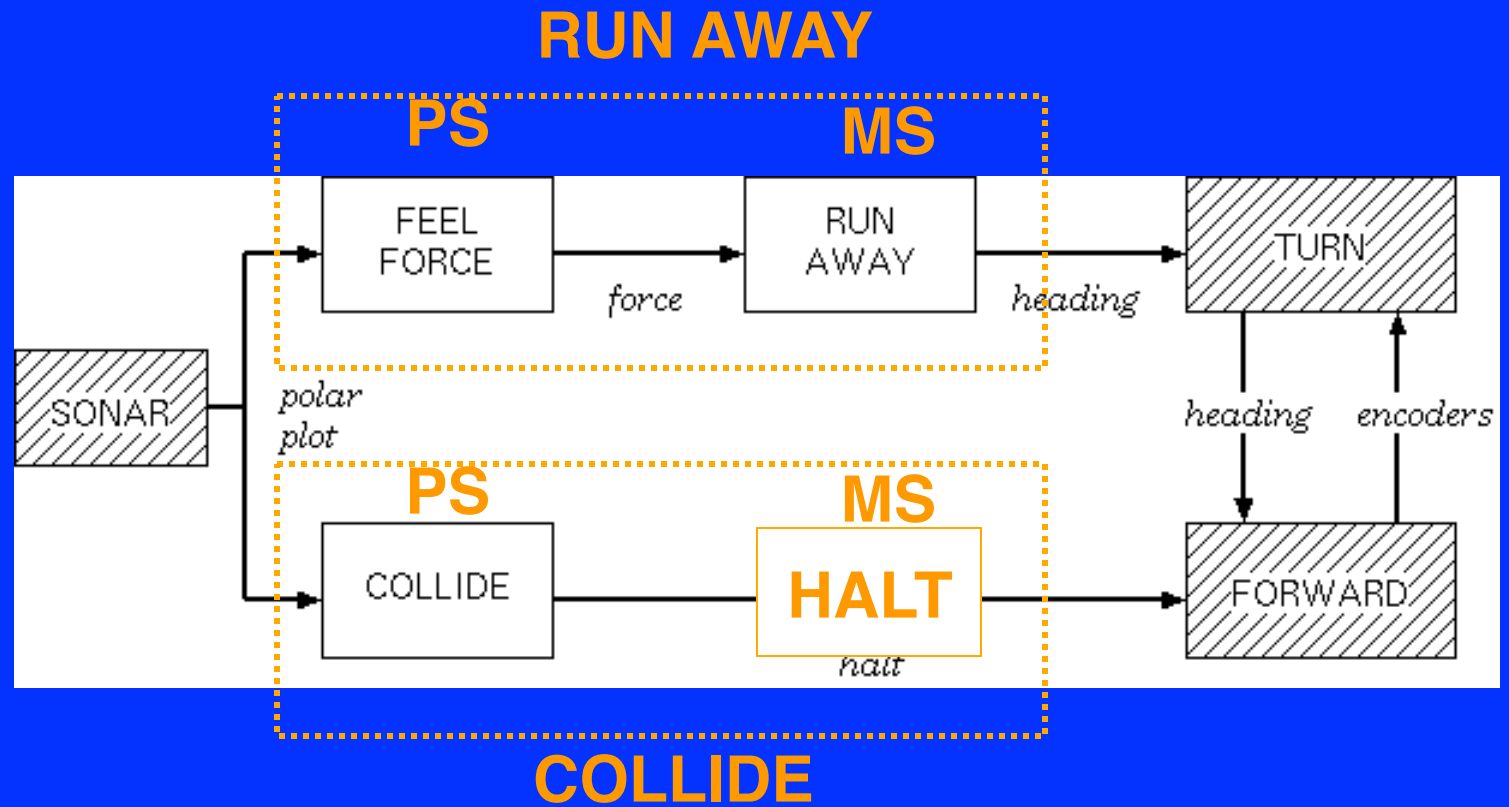


# Level 0: Runaway

follow-corridor 2

wander 1

**runaway 0**



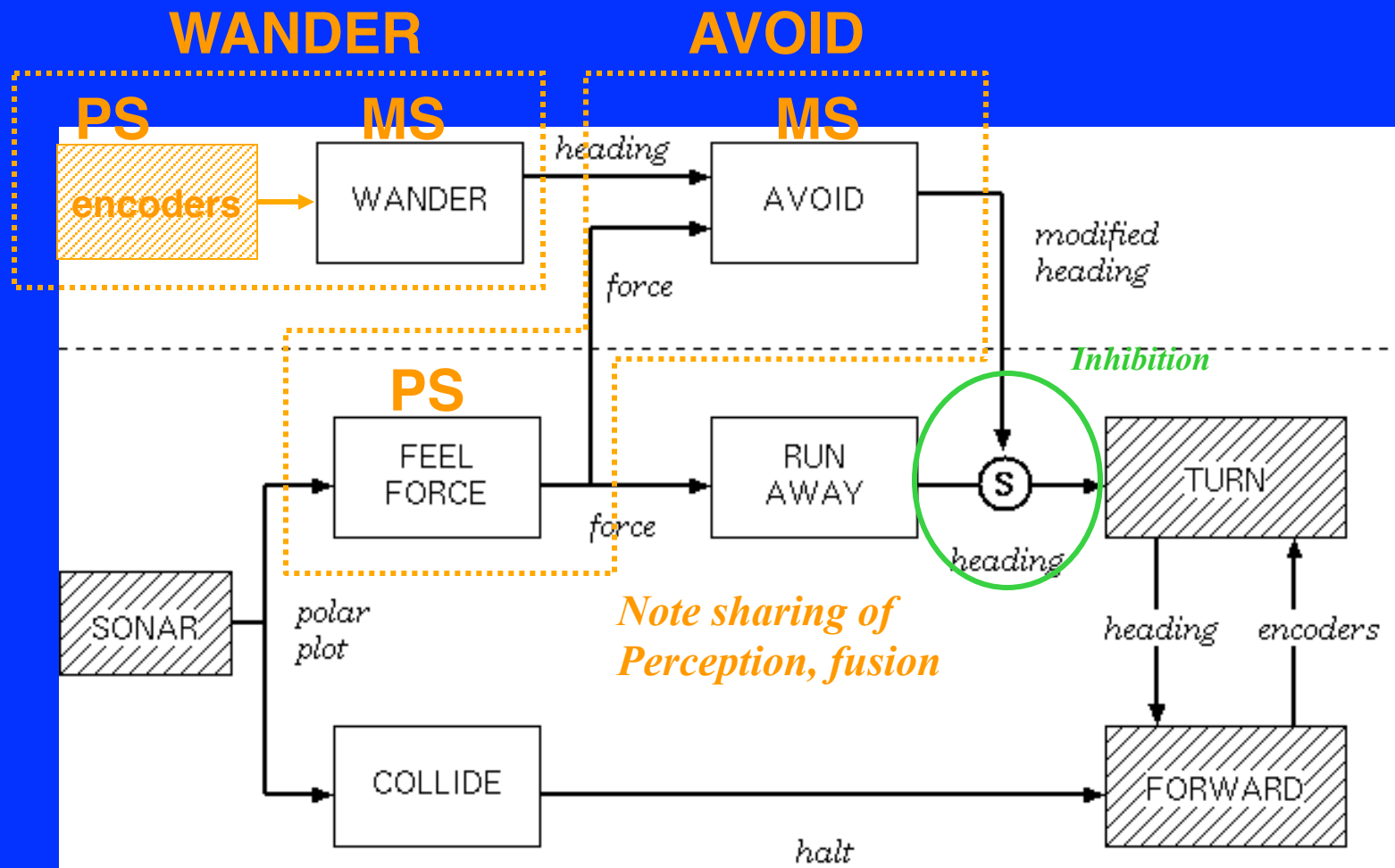


# Level 1: Wander

follow-corridor 2

wander 1

runaway 0



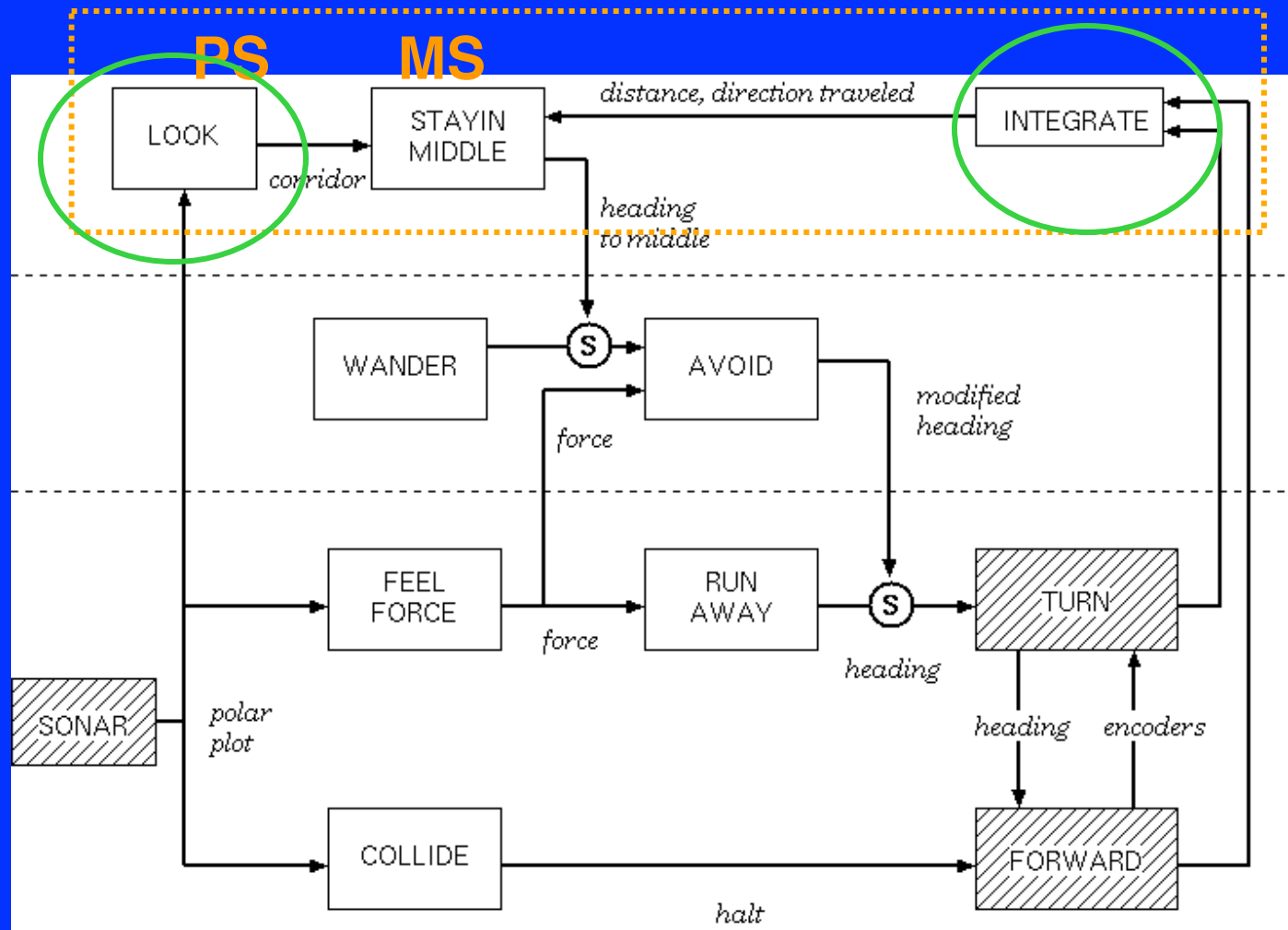
# Level 2: Follow-Corridors

follow-corridor 2

wander 1

runaway 0

## STAY-IN-MIDDLE



# Subsumption Summary

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- Many modules operating concurrently at different layers of competence.
- Modules from higher layers of competence can inhibit or suppress other lower level modules.
- Higher level modules can be added to the system without removing or modifying lower-level modules.
- No single world model is maintained; each module can draw from the outputs of different sensors and modules.

# Potential Fields: R. Arkin (G. Tech)

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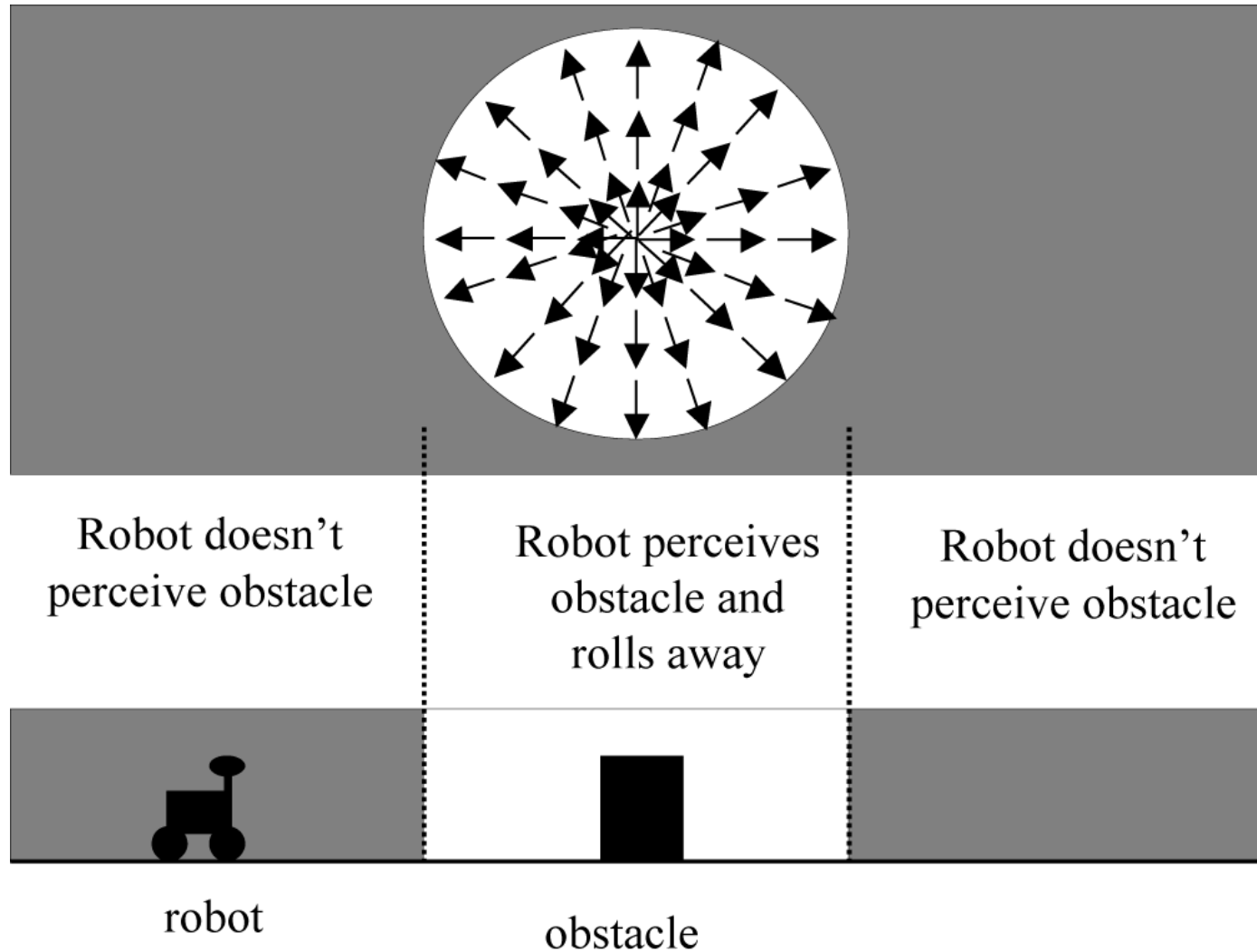
# Potential Fields Philosophy

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- The motor schema component of a behavior can be expressed with a potential fields methodology
  - A potential field can be a “primitive” or constructed from primitives which are summed together
  - The output of behaviors are combined using vector summation
- From each behavior, the robot “feels” a vector or force
  - Magnitude = force, strength of stimulus, or *velocity*
  - Direction
- But we visualize the “force” as a field, where every point in space represents the vector that it would feel if it were at that point

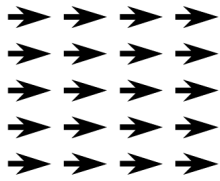
# Run Away via Repulsion

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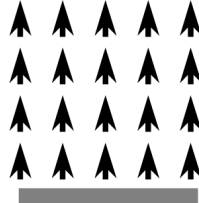


# 5 Primitive Potential Fields

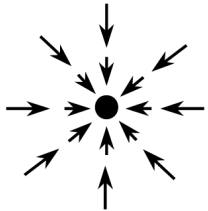
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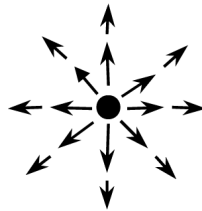
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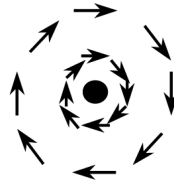
b



c



d

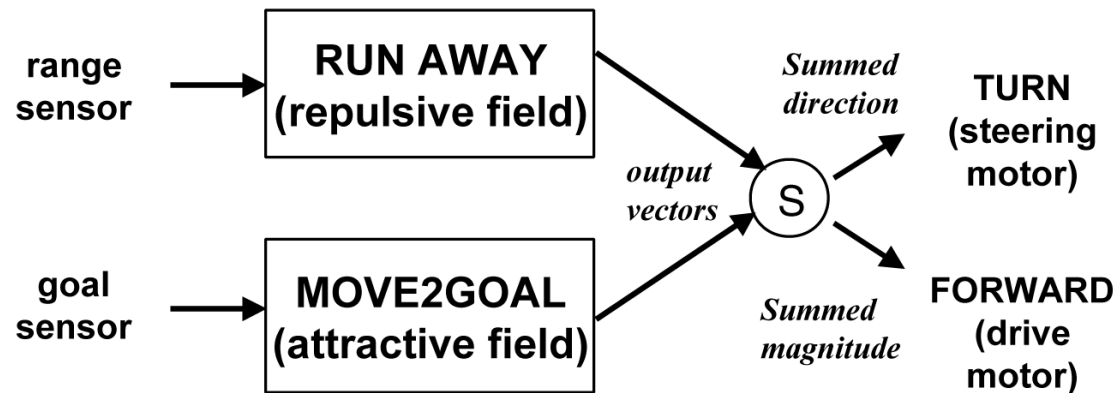
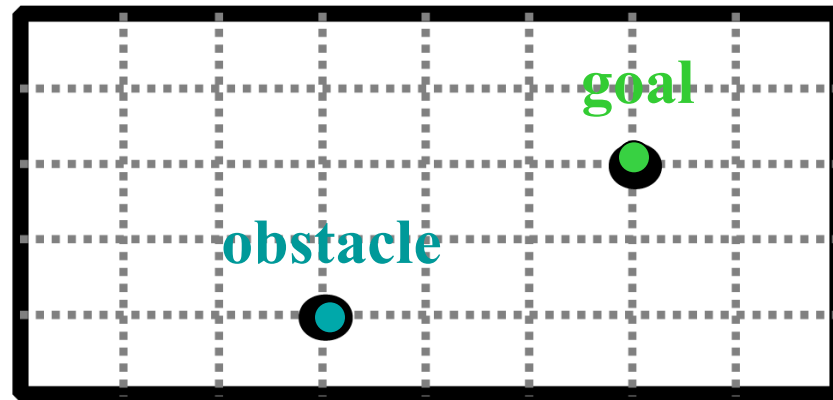


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- Uniform
  - Move in a particular direction, corridor following
- Perpendicular
  - Corridor following
- Repulsion
  - Runaway (obstacle avoidance)
- Attraction
  - Move to goal
- Tangential
  - Move through door, docking

# Combining Fields for Emergent Behavior

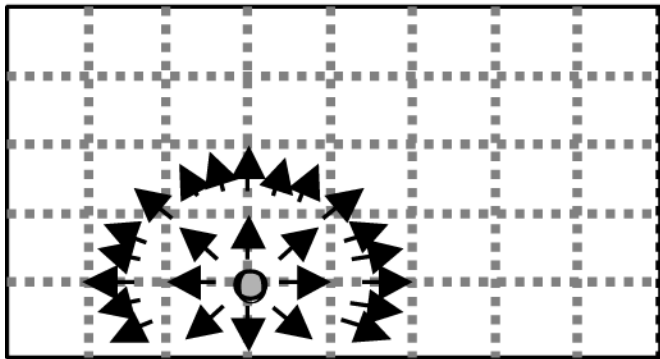
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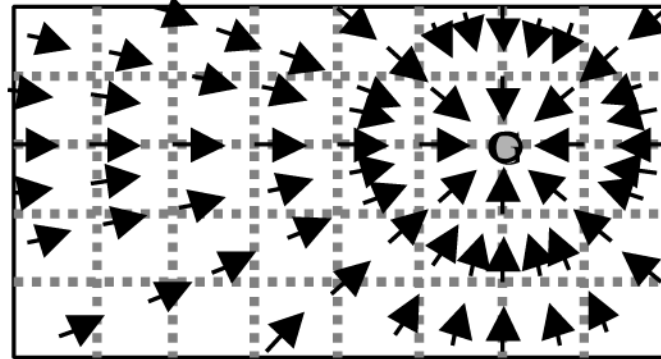


# Fields and Their Combination

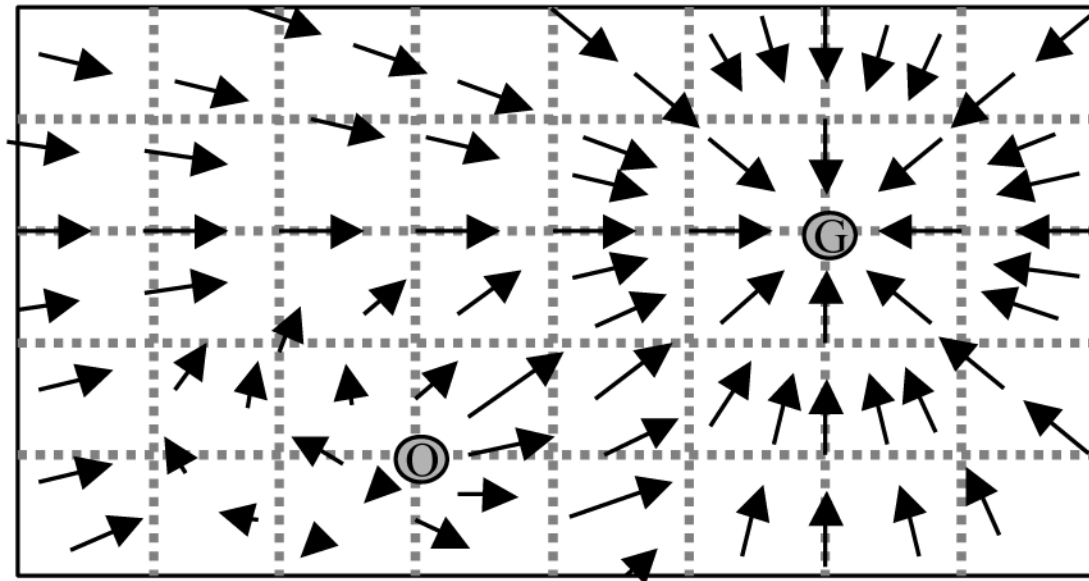
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a.



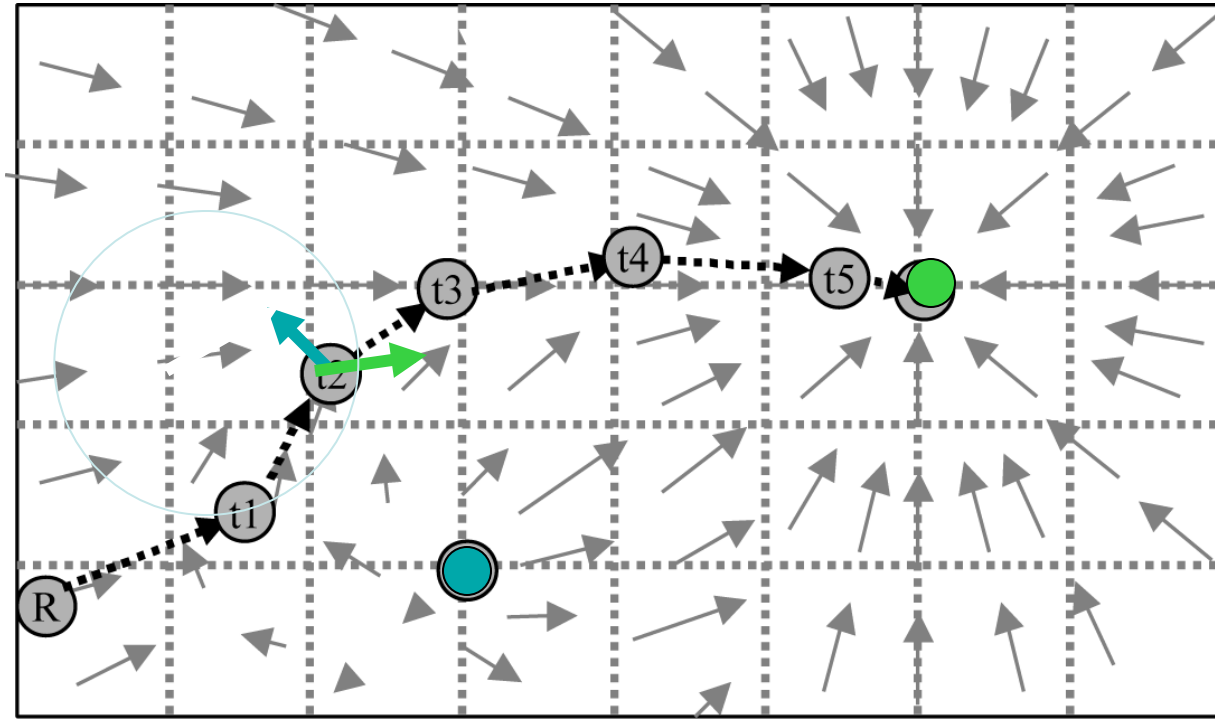
b.



c.

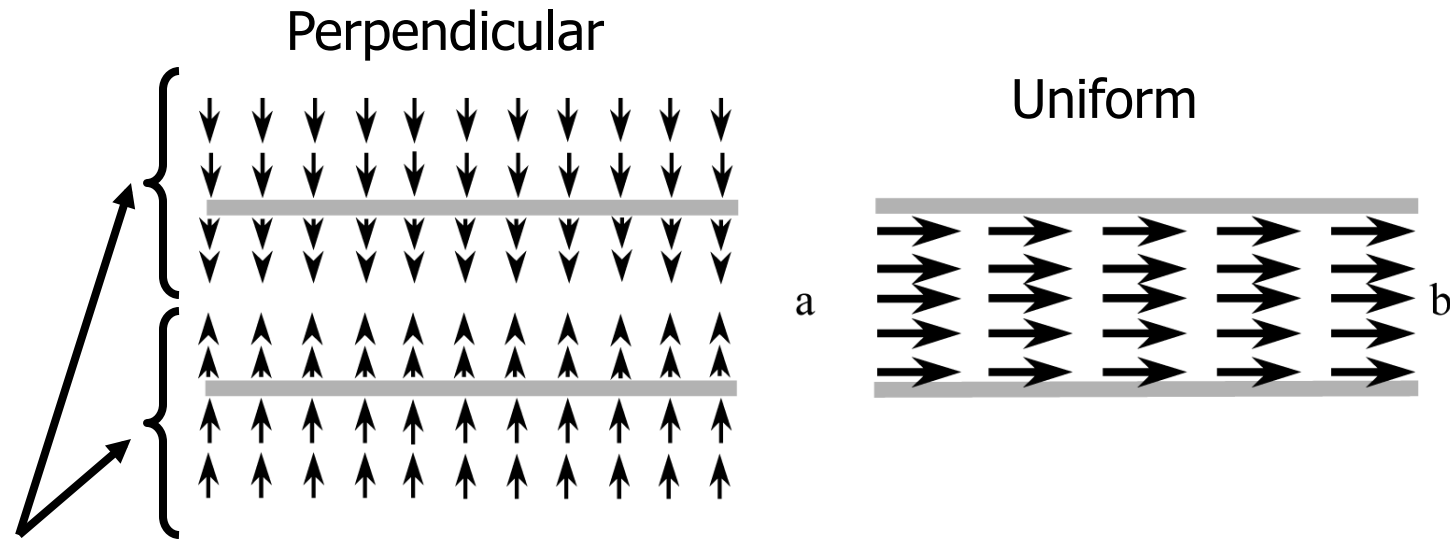
# Path Taken

Robot only  
feels  
vectors for  
this  
point when it  
(if)  
reaches that  
point

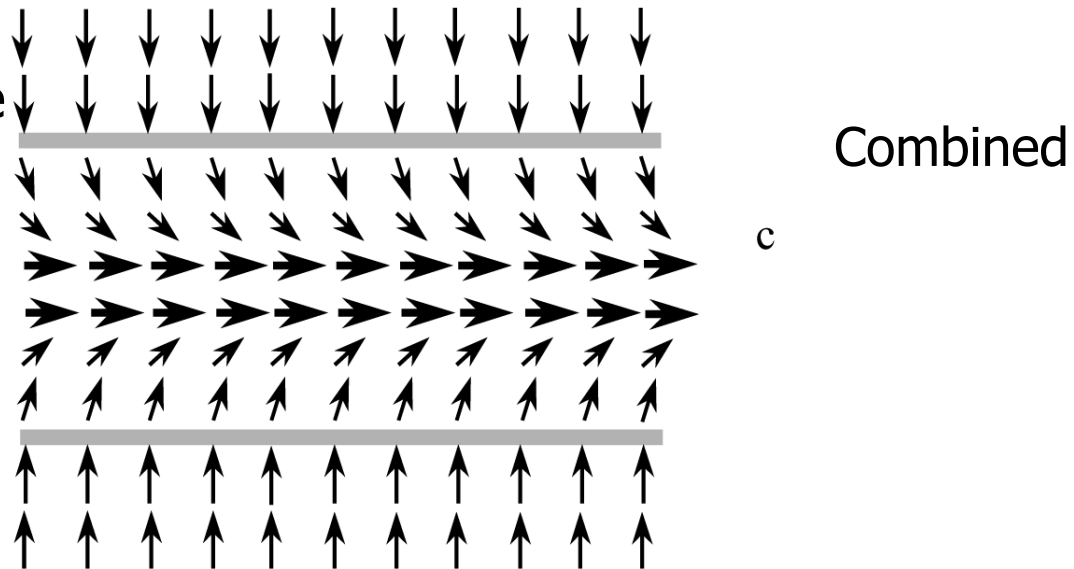


- If robot started at this location, it would take the following path
- It would only “feel” the vector for the location, then move accordingly, “feel” the next vector, move, etc.
- Pfield visualization allows us to see the vectors at all points, but robot never computes the “field of vectors” just the local vector

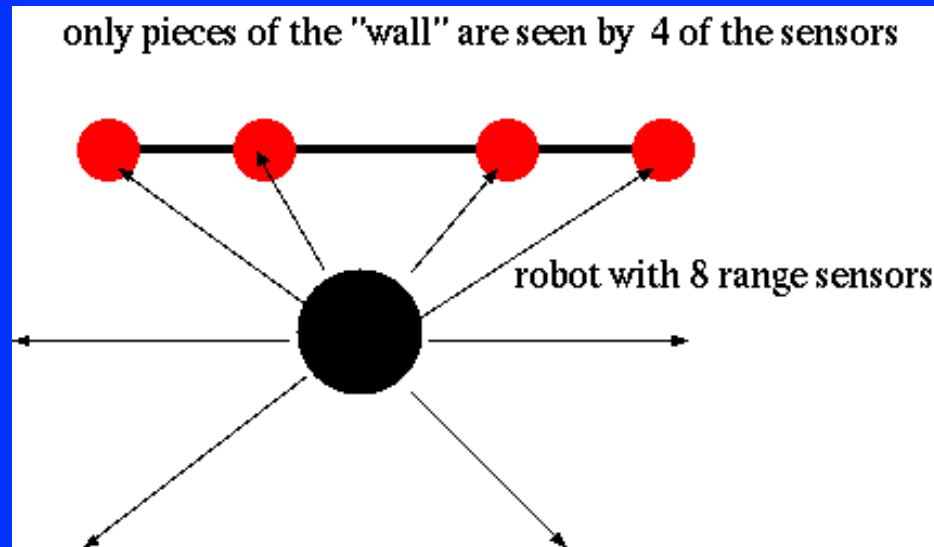
# Example: follow-corridor or follow-sidewalk



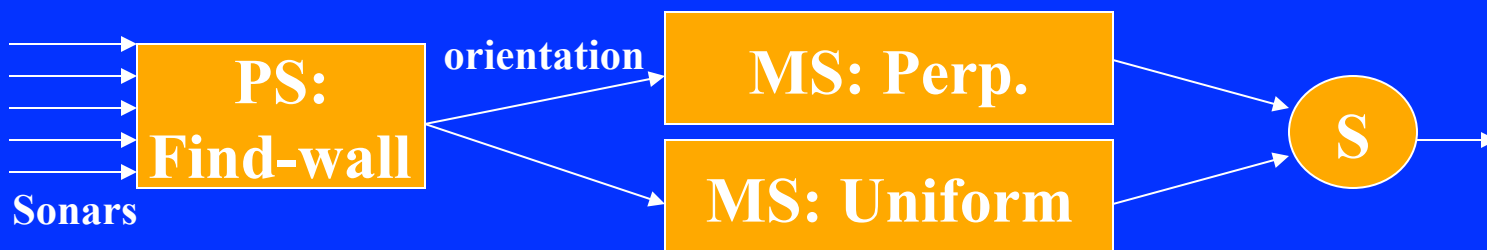
Note that a magnitude profile can be used to modify the vectors at different points



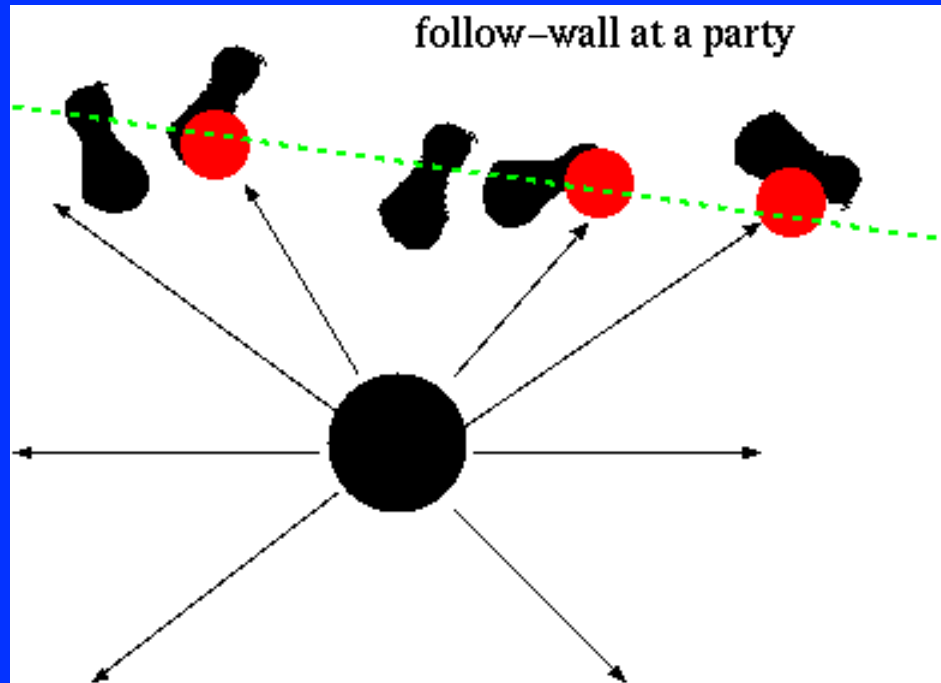
# But how does the robot see a wall without reasoning or intermediate representations?



- Perceptual schema “connects the dots”, returns relative orientation

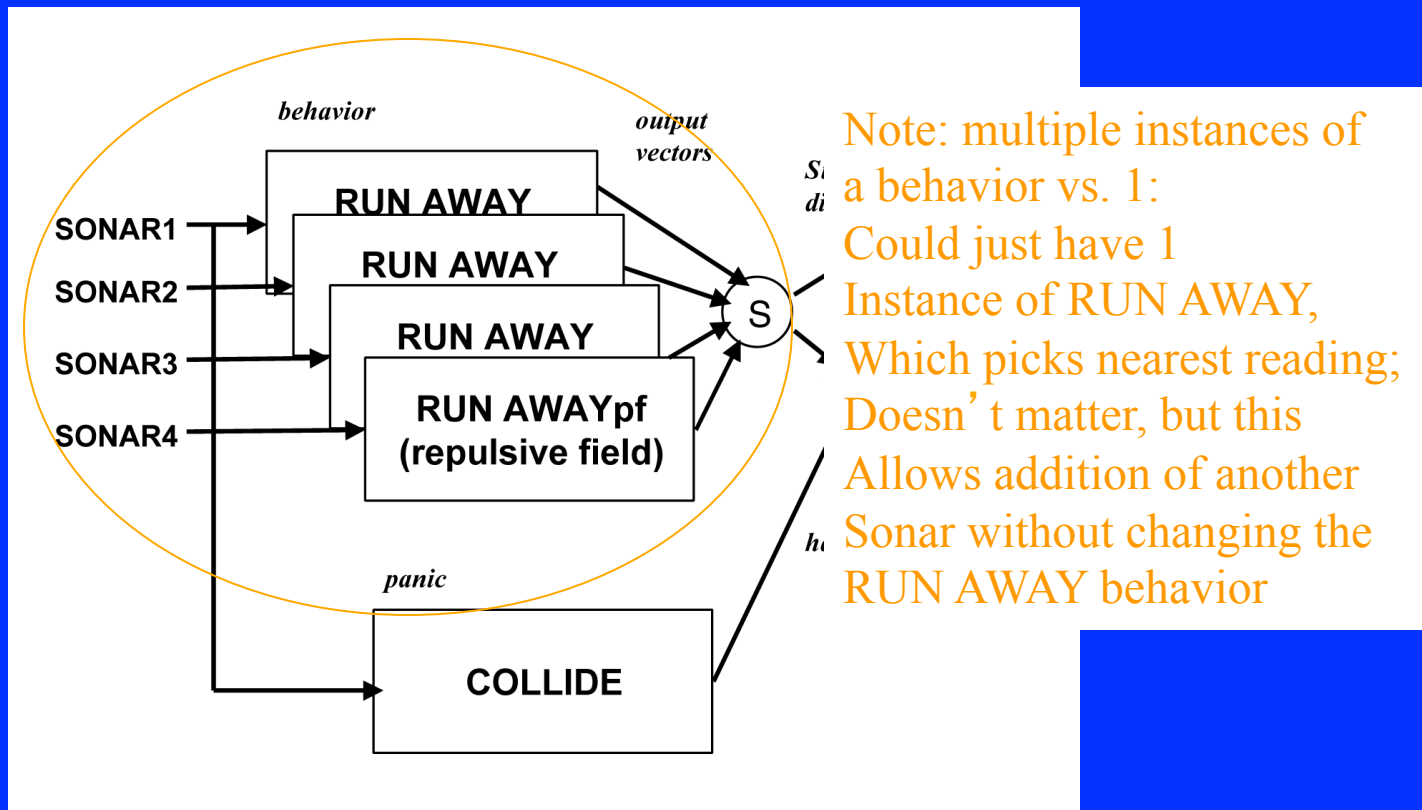
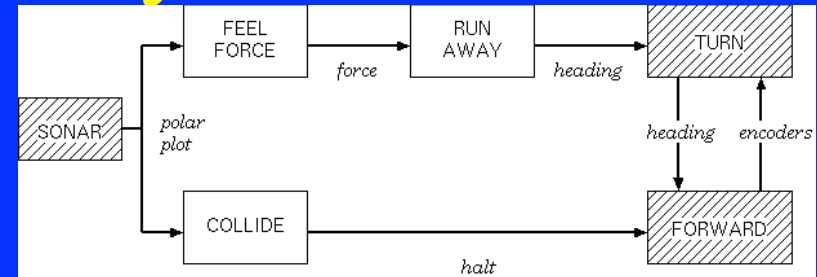


# OK, But why isn't that a representation of a wall?



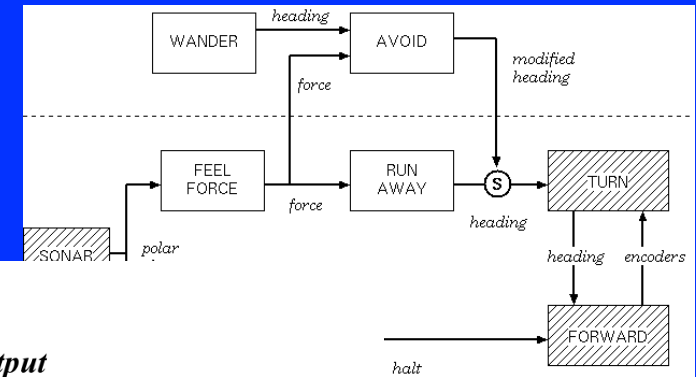
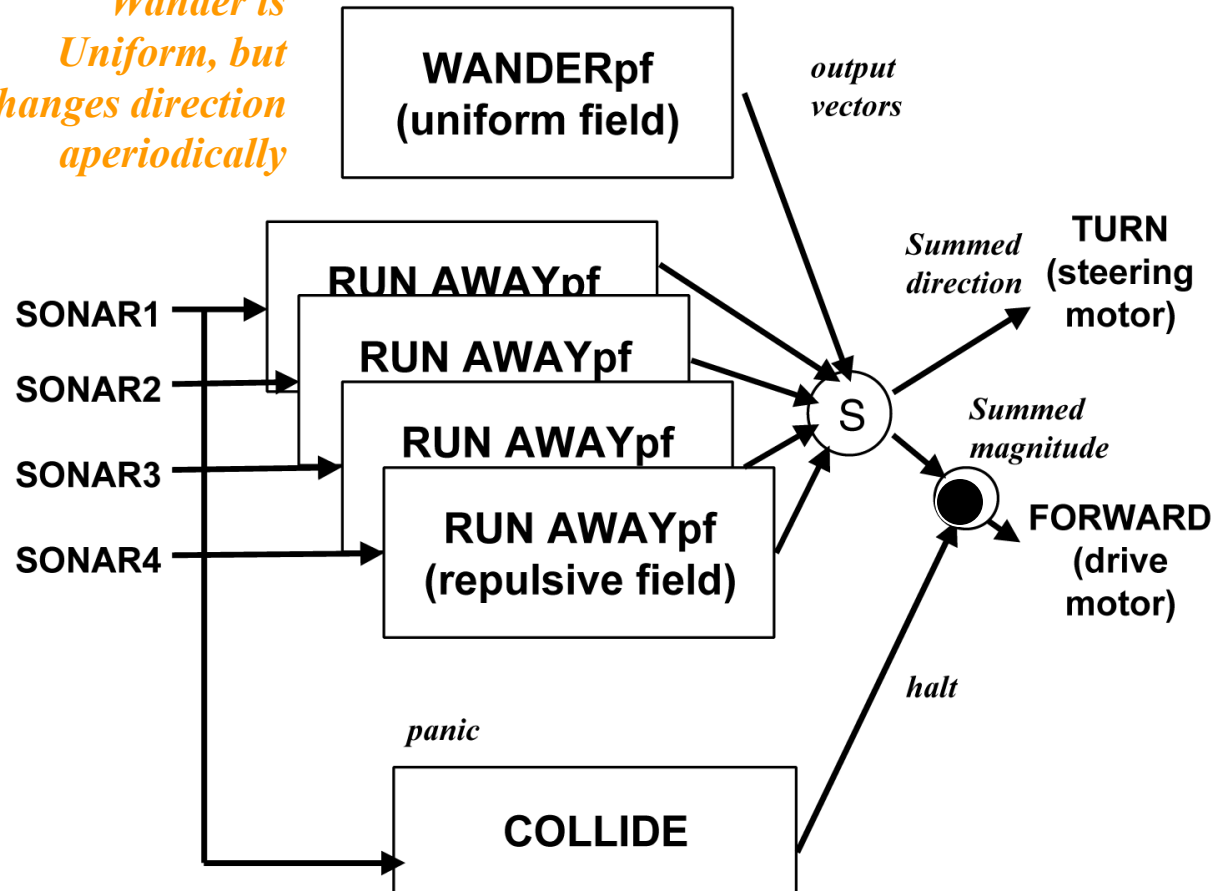
- It's not really *reasoning* that it's a wall, rather it is reacting to the stimulus which happens to be smoothed (common in neighboring neurons)

# Level 0: Runaway

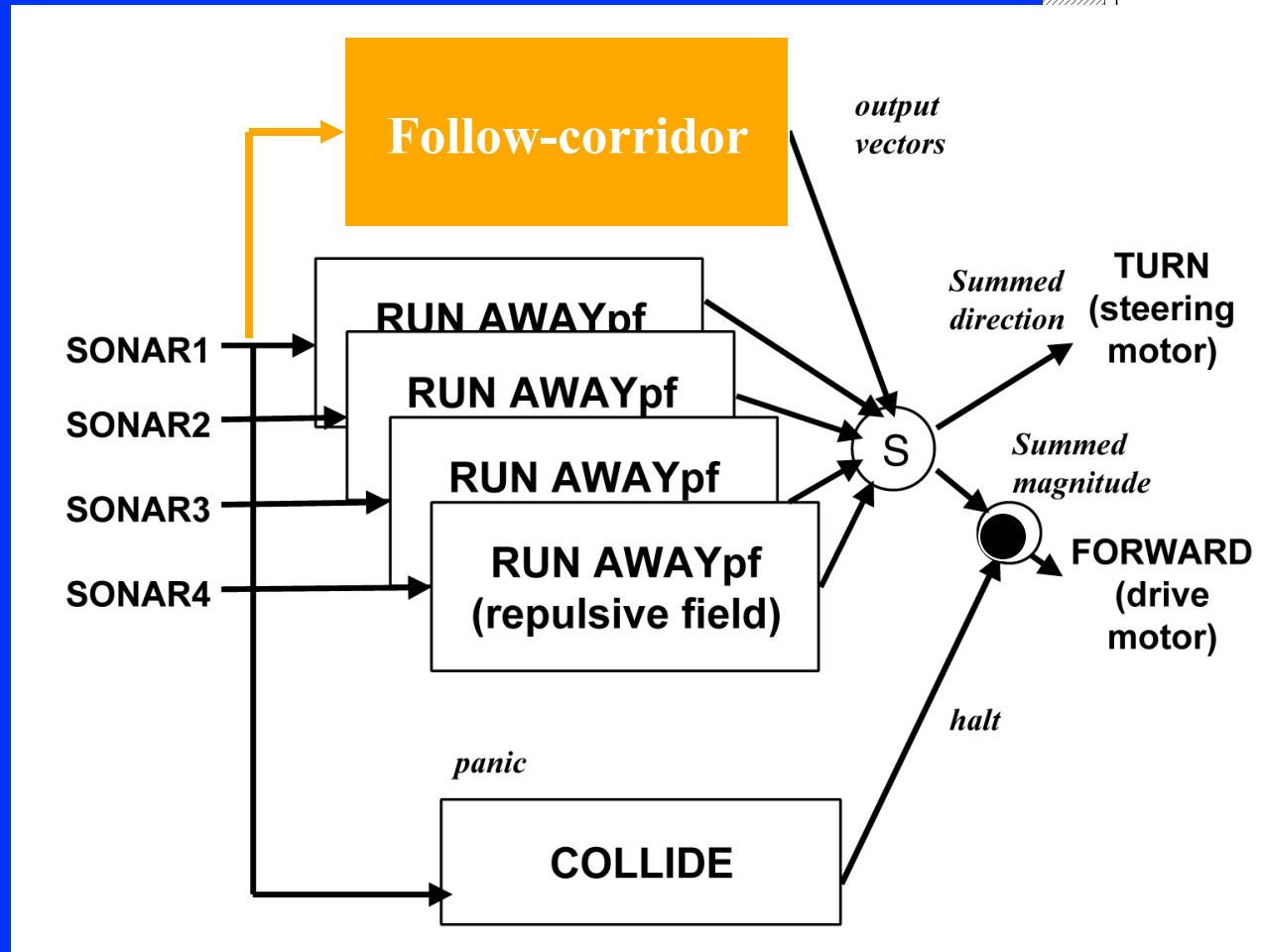
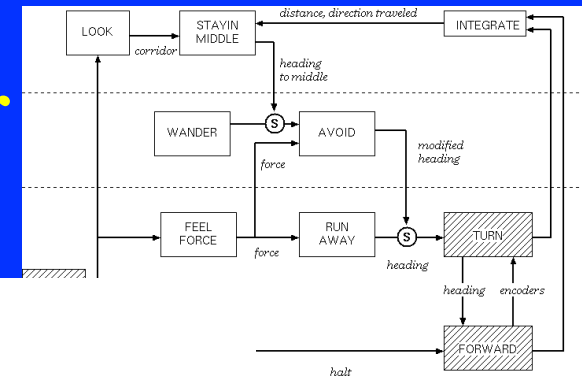


# Level 1: Wander

*Wander is  
Uniform, but  
Changes direction  
aperiodically*



# Level 2: Follow Corridor





# Potential Fields Summary

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- Advantages
  - Easy to visualize
  - Easy to build up software libraries
  - Fields can be parameterized
  - Combination mechanism is fixed, tweaked with gains
- Disadvantages
  - Local minima problem (sum to magnitude=0)
    - Box canyon problem
  - Jerky motion

# Summary

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- Reactive Paradigm: SA, sensing is local
  - Solves the *Open World problem* by emulating biology
  - Eliminates the *frame problem* by not using any global or persistent representation
  - Perception is direct, ego-centric, and distributed
- Two architectural styles are: *subsumption* and *pfields*
- Behaviors in pfield methodologies are a tight coupling of sensing to acting; modules are mapped to schemas conceptually
- Potential fields and subsumption are logically equivalent but different implementations
- Pfield problems include
  - local minima (ways around this)
  - jerky motion
  - bit of an art