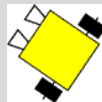


## Unit E

# Control Architectures

Exploring Robotics

Spring, 2013



## Control

- Automated Systems
- Goals
- Feedback
- Control Architectures
- World Model
- Representation
- Deliberative Control
- Intractability
- Reactive Control
- Subsumption Architecture
- Behavior-based Control
- Emergence

## RoboLab

- Loops and Jumps
- Conditional Branches

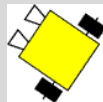
Joel Kammet  
Brooklyn College  
CUNY

## Control theory:

a branch of engineering involving the mathematical study of automated control systems.

Automated control systems include

- industrial processes (assembly lines, etc.)
- airplanes
- nuclear power plants
- robots
- ...



## Control

### Automated Systems

Goals  
Feedback  
Control Architectures  
World Model  
Representation  
Deliberative Control  
Intractability  
Reactive Control  
Subsumption Architecture  
Behavior-based Control  
Emergence

## RoboLab

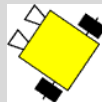
Loops and Jumps  
Conditional Branches

## *A goal state is*

- the desired state of the system
- where, or in what condition, the system wants to be

Goal states include

- achievement goals
- maintenance goals



## Control

Automated Systems

Goals

Feedback

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Loops and Jumps

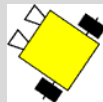
Conditional Branches

## Achievement goals:

- attain some measure of performance
- arrive at a destination
- complete a task

## Maintenance goals:

- keep some parameter (measure of performance) within a predetermined allowable range
- stay on road
- remain upright and balanced



## Control

Automated Systems

Goals

Feedback

Control Architectures

World Model

Representation

Deliberative Control

Intractability

Reactive Control

Subsumption Architecture

Behavior-based Control

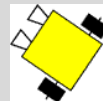
Emergence

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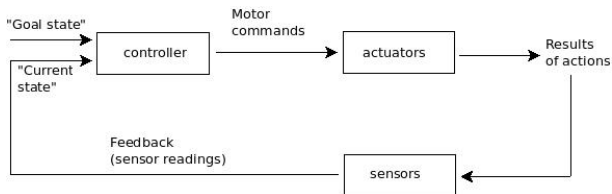
Loops and Jumps

Conditional Branches

# Feedback Control



A closed-loop control system:



## Control

Automated Systems  
Goals

## Feedback

Control Architectures  
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Representation  
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Intractability  
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Behavior-based Control  
Emergence

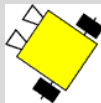
## RoboLab

Loops and Jumps  
Conditional Branches

# Types of Feedback Control

Output signals (motor commands) are adjusted based on the difference (error) between current state and goal state.

- proportional control
  - output is adjusted in proportion to the amount of error
  - the bigger the error, the greater the adjustment
  - $o(t) = K_p e(t)$
- derivative control
  - output is adjusted in proportion to the rate of change of error
  - if error is decreasing rapidly, reduce the adjustment
  - $o(t) = K_d \frac{d}{dt} e(t)$
- integral control
  - output is adjusted in proportion to the duration of error
  - if error persists for a long time, increase the adjustment
  - $o(t) = K_i \int_0^t e(\tau) d\tau$



### Control

Automated Systems  
Goals

### Feedback

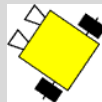
Control Architectures  
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### RoboLab

Loops and Jumps  
Conditional Branches

# Combining Feedback Control Signals

- PD Control
  - Combines proportional and derivative control
  - $o(t) = K_p e(t) + K_d \frac{d}{dt} e(t)$
- PID Control
  - Combines proportional, integral and derivative control
  - $o(t) = K_p e(t) + K_i \int_0^t e(\tau) d\tau + K_d \frac{d}{dt} e(t)$



## Control

Automated Systems  
Goals

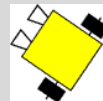
### Feedback

Control Architectures  
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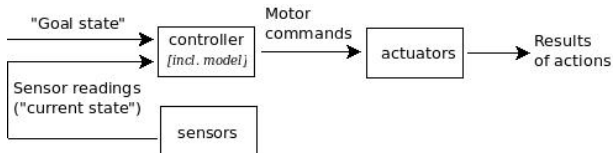
## RoboLab

Loops and Jumps  
Conditional Branches

# Feedforward Control



An open-loop control system:



## Control

Automated Systems  
Goals

## Feedback

Control Architectures  
World Model  
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Deliberative Control  
Intractability  
Reactive Control  
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Behavior-based Control  
Emergence

## RoboLab

Loops and Jumps  
Conditional Branches

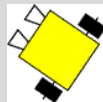


## A control architecture is

the set of principles (i.e., tools, rules, styles, guidelines ...) for organizing a control system

Categories of robot control architectures:

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



## Control

Automated Systems  
Goals  
Feedback

## Control Architectures

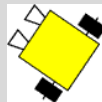
World Model  
Representation  
Deliberative Control  
Intractability  
Reactive Control  
Subsumption Architecture  
Behavior-based Control  
Emergence

## RoboLab

Loops and Jumps  
Conditional Branches

# Differences Among Control Architectures

- Modularity  
how control program is broken down
- Time-scale  
immediate real-time response vs. long-range plan
- Representation  
how robot “envisions” its world



## Control

Automated Systems  
Goals  
Feedback

## Control Architectures

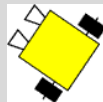
World Model  
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Intractability  
Reactive Control  
Subsumption Architecture  
Behavior-based Control  
Emergence

## RoboLab

Loops and Jumps  
Conditional Branches

# Considerations for Choice of Architecture

- sensor noise
- actuator noise
- static or dynamic environment
- fully- or partially-observable environment
- speed at which sensors react
- speed at which controller and effectors react
- need to remember past events/conditions
- need to predict future events/conditions
- need to learn (to improve behavior)



### Control

Automated Systems  
Goals  
Feedback

### Control Architectures

World Model  
Representation  
Deliberative Control  
Intractibility  
Reactive Control  
Subsumption Architecture  
Behavior-based Control  
Emergence

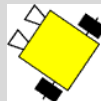
### RoboLab

Loops and Jumps  
Conditional Branches

## A world model is

a simplified, abstract description of its environment:

- “map” of the world
- its own possible actions
- expected or possible consequences of actions
- expected or possible changes in environment
- its tasks or goals
- physical “laws”
- sensor readings/motor commands (sensorimotor state)
- contents of its memory
  - values of variables
  - remembered facts
  - predictions



## Control

Automated Systems

Goals

Feedback

Control Architectures

## World Model

Representation

Deliberative Control

Intractability

Reactive Control

Subsumption Architecture

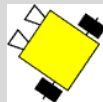
Behavior-based Control

Emergence

## RoboLab

Loops and Jumps

Conditional Branches



## Representation is

what information is stored and how it is encoded

- detailed measurements/“pictures”
- landmarks
- sensor readings
- history of events, actions, consequences

## Control

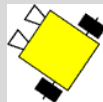
Automated Systems  
Goals  
Feedback  
Control Architectures  
World Model

## Representation

Deliberative Control  
Intractability  
Reactive Control  
Subsumption Architecture  
Behavior-based Control  
Emergence

## RoboLab

Loops and Jumps  
Conditional Branches



## Representation is

what information is stored and how it is encoded

- detailed measurements/“pictures”
- landmarks
- sensor readings
- history of events, actions, consequences
- lookup tables of transition rules
- graph illustrating transition rules

## Control

Automated Systems  
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World Model

## Representation

Deliberative Control  
Intractability  
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Behavior-based Control  
Emergence

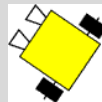
## RoboLab

Loops and Jumps  
Conditional Branches

# Any questions?



## Control Architecture



### Control

- Automated Systems
- Goals
- Feedback
- Control Architectures
- World Model

### Representation

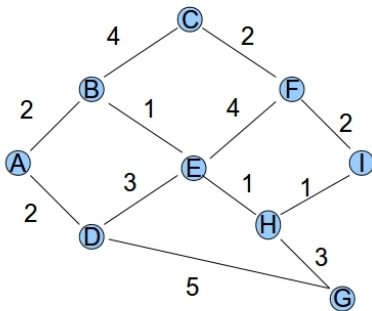
- Deliberative Control
- Intractability
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### RoboLab

- Loops and Jumps
- Conditional Branches

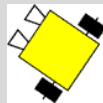
# Two different representations of a map

A	B	C
D	E	F
G	H	I



## Representation is

- what information is stored
- how it is encoded



### Control

Automated Systems  
Goals  
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World Model

### Representation

Deliberative Control  
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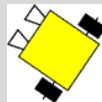
Loops and Jumps  
Conditional Branches



## Next time...

How a world model and representation are used in actual control architectures:

- Deliberative control (chapter 13)
- Reactive control (chapter 14)



### Control

Automated Systems  
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World Model

### Representation

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### RoboLab

Loops and Jumps  
Conditional Branches

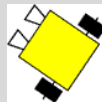
## A boolean expression is

an expression that has only two possible values:  
**true** or **false**

## A conditional statement is

a statement in the form  
**“if [predicate] then [consequent]”**

(The predicate is a *boolean expression*.)



### Control

- Automated Systems
- Goals
- Feedback
- Control Architectures
- World Model

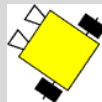
### Representation

- Deliberative Control
- Intractability
- Reactive Control
- Subsumption Architecture
- Behavior-based Control
- Emergence

### RoboLab

- Loops and Jumps
- Conditional Branches

- Sense, model, plan, act
- Search through alternative possible sequences of actions for
  - success
  - optimality
  - approximation/compromise



### Control

Automated Systems

Goals

Feedback

Control Architectures

World Model

Representation

**Deliberative Control**

Intractability

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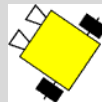
### RoboLab

Loops and Jumps

Conditional Branches

# Planning: Requirements

- time
- space
- information
- plan must remain accurate
- must maintain awareness of state
- accuracy of effectors



## Control

Automated Systems

Goals

Feedback

Control Architectures

World Model

Representation

**Deliberative Control**

Intractability

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Emergence

## RoboLab

Loops and Jumps

Conditional Branches

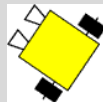
## Intractable means

highly complex; difficult to solve.

(Sensor/state space grows exponentially.)

## Other obstacles:

- dynamic environment
- not fully observable
- noise



## Control

Automated Systems

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Deliberative Control

## Intractability

Reactive Control

Subsumption Architecture

Behavior-based Control

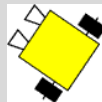
Emergence

## RoboLab

Loops and Jumps

Conditional Branches

- Reflex action
- Sense  $\longrightarrow$  act
- Action selection
  - Mutually exclusive conditions
  - Command arbitration (choose one out of several commands)
  - Command fusion (combine multiple commands into one)



### Control

Automated Systems

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Subsumption Architecture

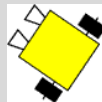
Behavior-based Control

Emergence

### RoboLab

Loops and Jumps

Conditional Branches



## Example (RCX line-following)

- threshold 1 = 41
- threshold 2 = 37
- rule 1: sensor reading  $\leq$  threshold 1 stop right motor, fwd left motor
- rule 2: sensor reading  $\leq$  threshold 2 reverse right motor, fwd left motor
- rule 3: otherwise stop left motor, fwd right motor

## Control

Automated Systems

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Subsumption Architecture

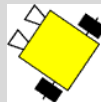
Behavior-based Control

Emergence

## RoboLab

Loops and Jumps

Conditional Branches



## Example (simple navigation)

- rule 1: facing red wall turn right
- rule 2: facing blue wall turn left
- rule 3: facing treasure stop
- rule 4: otherwise go straight ahead

### Control

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Loops and Jumps

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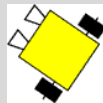


## Subsume (according to Merriam-Webster) means:

to include or place within something larger or more comprehensive; encompass as a subordinate or component element. e.g.: Red, green, and yellow are subsumed under the term “color”.

## Subsumption Architecture (Rodney Brooks, 1985)

- “layered”, bottom-up design
- capabilities added incrementally
- inspired by biology
- higher layers use lower layers to help achieve their goals
- higher layers can suppress or inhibit lower layers



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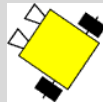
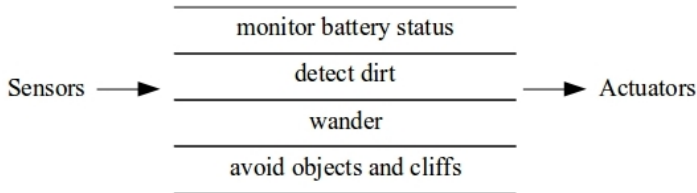
### Subsumption Architecture

Behavior-based Control  
Emergence

### RoboLab

Loops and Jumps  
Conditional Branches

# Subsumption Architecture - Example



## Control

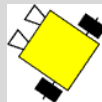
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## Subsumption Architecture

- Behavior-based Control
- Emergence

## RoboLab

- Loops and Jumps
- Conditional Branches



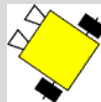
- layered design similar to that of reactive control but:
- modules of a reactive control architecture produce simple actions whereas
- modules of a behavior-based control architecture produce *behaviors*

### Control

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### RoboLab

Loops and Jumps  
Conditional Branches



### Characteristics of *behaviors*:

- more complex than the simple actions of reactive control
- behaviors maintain or achieve specific goals
- behaviors are *time-extended*
- behaviors can take input not only from sensors but also from other behaviors
- behaviors can send output to other behaviors as well as to actuators

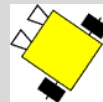
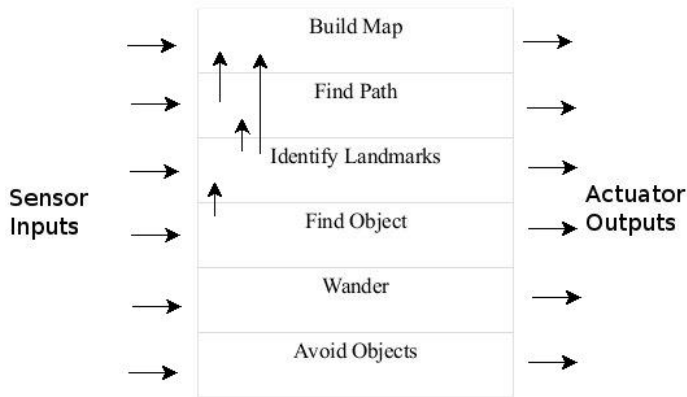
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**Behavior-based Control**  
Emergence

### RoboLab

Loops and Jumps  
Conditional Branches

# Behavior-based Architecture - Example



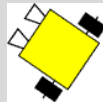
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## RoboLab

- Loops and Jumps
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# Behavior-based Mapping Application

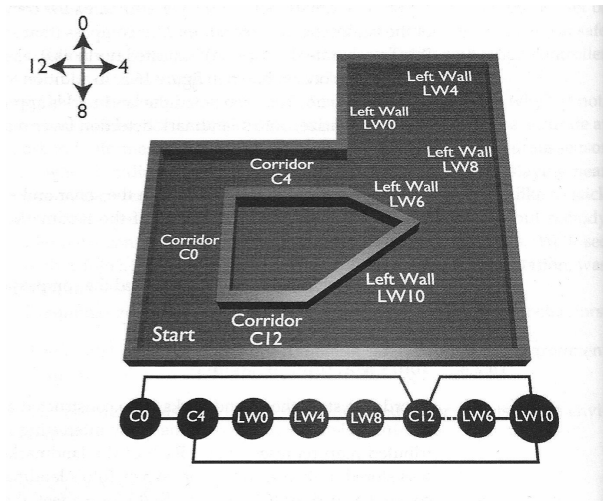


## Control

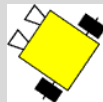
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## RoboLab

- Loops and Jumps
- Conditional Branches



Toto's environment



## Toto's Mapping Behavior Attributes (Variables)

- Behavior-type
- Compass-direction
- Approximate-location
- Approximate-length
- Active-status (true/false)
- Goal-status (true/false)
- Most-recent-message-distance
- Most-recent-message-source

### Control

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**Behavior-based Control**  
Emergence

### RoboLab

Loops and Jumps  
Conditional Branches

# What Is Emergent Behavior?

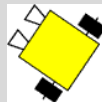
“The whole is greater than the sum of its parts.”

## A “naive” definition

Unexpected behavior that results from interaction between the system and its environment.

## A better definition

Emergent behavior is a pattern of behavior that results from interaction between the system and its environment and is apparent from an observer’s viewpoint but not from the from the controller’s (internal) viewpoint.



## Control

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## Emergence

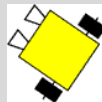
## RoboLab

- Loops and Jumps
- Conditional Branches



# Emergent Behavior - Examples

- wall following (with no model of a “wall”)
- flocking (with no model of a “flock”)
- ants’ paths converging towards food



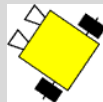
## Control

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## Emergence

## RoboLab

Loops and Jumps  
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- Representation
- Deliberative Control
- Intractability
- Reactive Control
- Subsumption Architecture
- Behavior-based Control

## Emergence

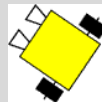
## RoboLab

- Loops and Jumps
- Conditional Branches

Can you think of other examples of emergence in nature?

Can surprise be predictable?

Is surprise necessary for emergence?



### DIFFERENCES BETWEEN ROBOT PROGRAMS

Properties	Traditional	Developmental
Not task specific	No	Yes
Tasks are unknown	No	Yes
Generates a representation of an unknown task	No	Yes
Animal-like online learning	No	Yes
Open-ended learning	No	Yes

### Control

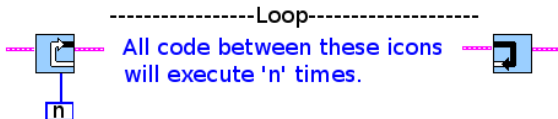
- Automated Systems
- Goals
- Feedback
- Control Architectures
- World Model
- Representation
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### RoboLab

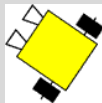
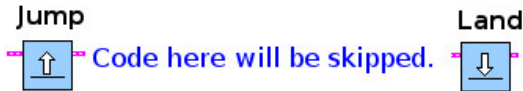
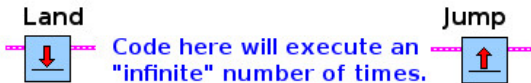
- Loops and Jumps
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# Loops and Jumps

Conditional:



Unconditional:



## Control

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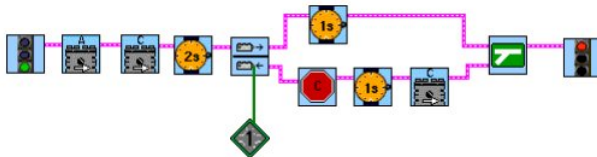
## RoboLab

### Loops and Jumps

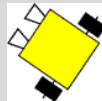
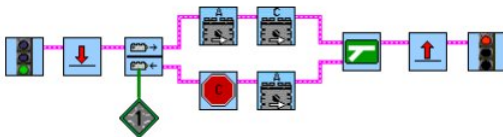
Conditional Branches

# Conditional Branch: Touch Sensor Fork

Not so useful:



Much better:



## Control

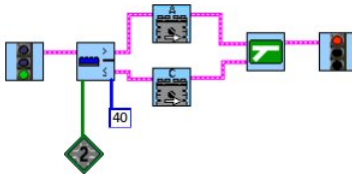
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## RoboLab

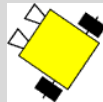
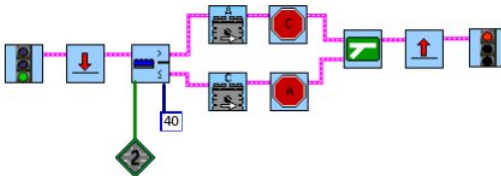
- Loops and Jumps
- Conditional Branches

# Conditional Branch: Light Sensor Fork

Not so useful:



Much better:



## Control

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## RoboLab

- Loops and Jumps
- Conditional Branches