

# MEC302: Embedded Computer Systems

## Theme I: Modeling Dynamic Behaviors

### Lecture 3 – Discrete Dynamics: Discrete and Hybrid Systems

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# Lecture outline

- Discrete dynamics:
  - Discrete systems;
  - State machines;
  - Finite-state machines;
  - State machine properties;
  - Extended state machines;
- Hybrid system modelling:
  - Hybrid systems;
  - Timed automata;
  - Supervisory control.

# Discrete dynamics

A **discrete system** operates in a sequence of discrete steps and is said to have **discrete dynamics**.

**Discrete systems** operate with **discrete signals** of the form  $e: \mathbb{R} \rightarrow \{absent\} \cup X$ :

- It is absent most of the time and we can count, in order, the times at which it is not *absent*;
- If  $X = \{present\}$ , the signal carries no value and it is called a **pure signal**;
- Otherwise, the signal is not pure and  $X$  can be any set of values ( $X \subseteq \mathbb{R}$ ).

在离散系统中，纯信号是指只包含有限个离散时间点上的数值，而且在这些时间点上的数值都是确定的、单一的、不受干扰和噪声的信号。

Examples of discrete systems:

- Calculators/computers/controllers;
- Traffic lights;
- Board games;
- Etc.

# Discrete systems

Consider a counter system (e.g., at a parking garage):

- **Inputs:**

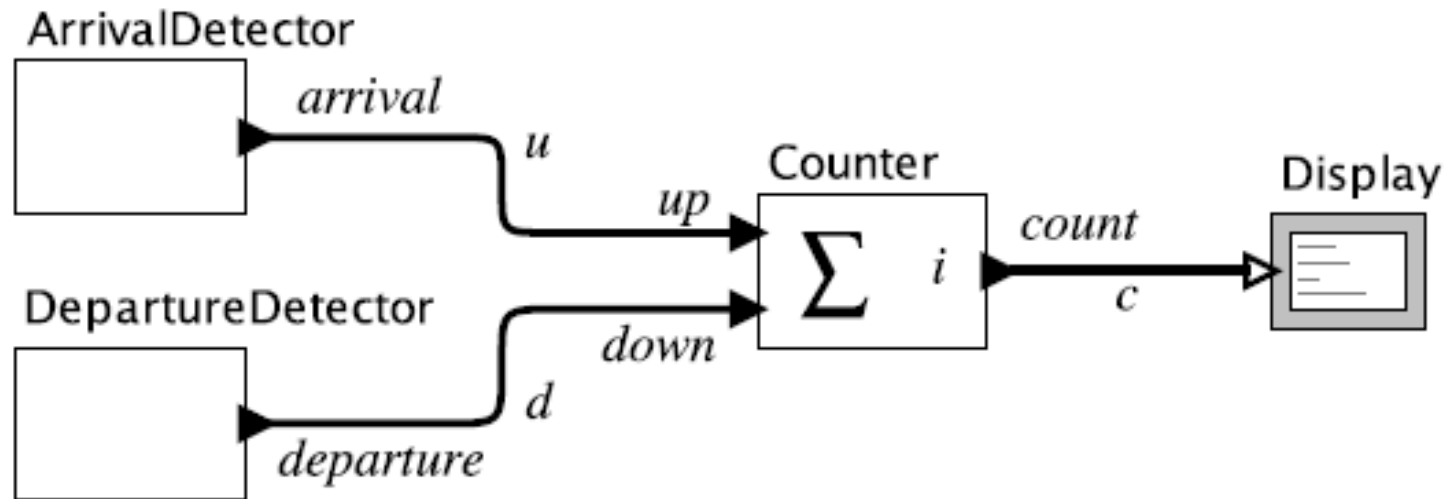
- $u: \mathbb{R} \rightarrow \{absent, present\};$
- $d: \mathbb{R} \rightarrow \{absent, present\};$

- **States\*:**

- $s: \mathbb{R} \rightarrow \mathbb{Z};$

- **Output (two options):**

- $c: \mathbb{R} \rightarrow \{absent\} \cup \mathbb{Z}$  – **Mealy machine** (produces output during transition);
- $c: \mathbb{R} \rightarrow \mathbb{Z}$  – **Moore machine** (produces output when in a state).



\* – Discrete models with finite state space are called finite-state machines.

George H. Mealy and Edward F. Moore are Bell Labs engineers in 1950s.

# State machines

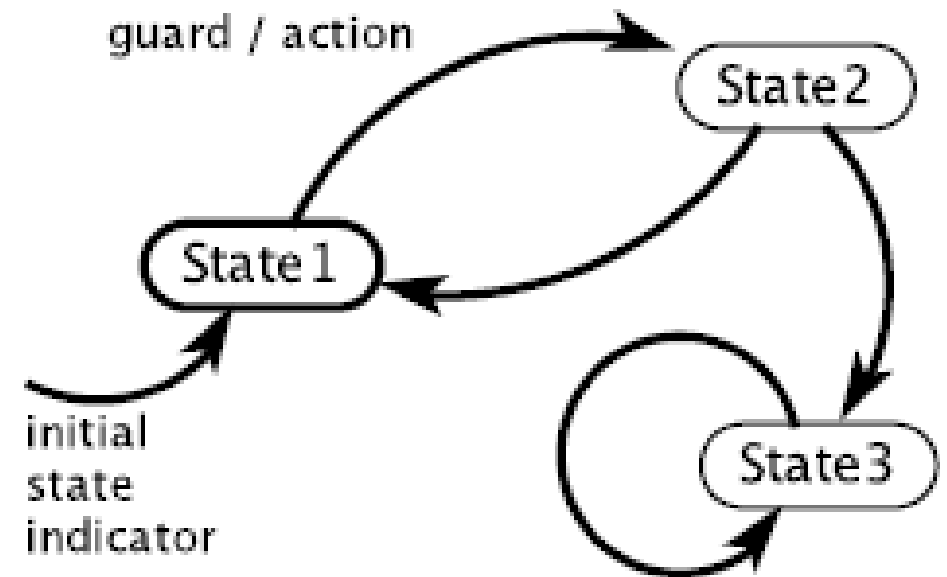
A **State Machine (SM)** is a model of a system with **discrete dynamics** that at each reaction maps valuations of the inputs to valuations of the outputs, where the map may depend on its current state.

**inputs:** name : type/set

**outputs:** name : type/set

It can be represented **graphically** with:

- *Inputs* – specified with names and types/sets;
- *Outputs* – specified with names and types/sets;
- *System states* – distinguished with balloons;
- *Transitions* – represented with arrows;
- *Predicate* (logical expression) – guards;
- *Reaction* (update) – action on a guard.



Or, it can be explicitly formulated with a Mathematical model of a **Finite-SM (FSM)**:

$FSM(States; Inputs; Outputs; update; initialState)$

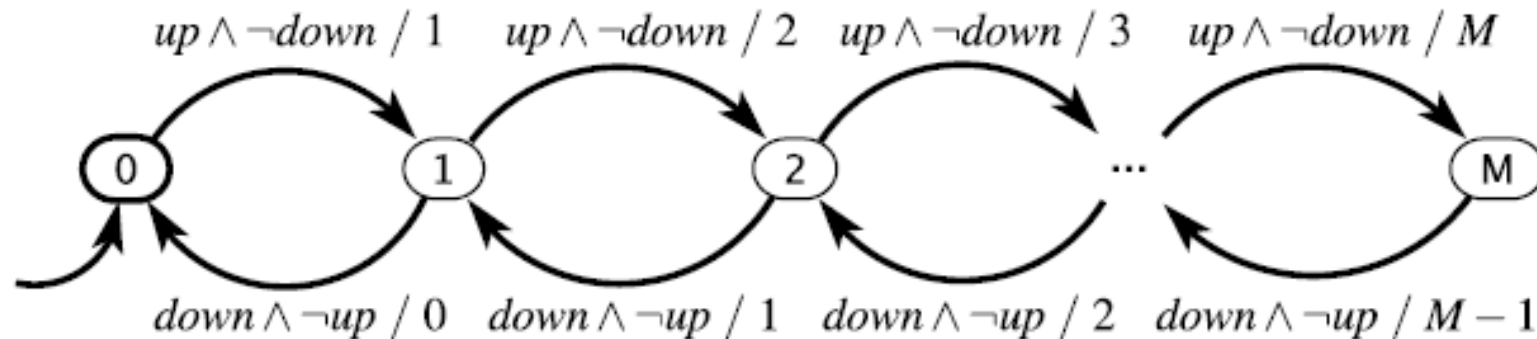
# Finite-state machines

A **Finite-State Machine (FSM)** is an **SM** where the set *States* of possible states is finite.

**FSM** model for the garage counter (graphical representation):

**inputs:** *up*, *down* : pure

**output:** *count* :  $\{0, \dots, M\}$



Predicate standard code (key):

*true*      Transition is always enabled.

$p_1$       Transition is enabled if  $p_1$  is *present*.

$\neg p_1$       Transition is enabled if  $p_1$  is *absent*.

$p_1 \wedge p_2$       Transition is enabled if both  $p_1$  and  $p_2$  are *present*.

$p_1 \vee p_2$       Transition is enabled if either  $p_1$  or  $p_2$  is *present*.

$p_1 \wedge \neg p_2$       Transition is enabled if  $p_1$  is *present* and  $p_2$  is *absent*.

# Finite-state machines

Mathematical model of an **FSM** is formulated with a five-tuple:

$$FSM(States; Inputs; Outputs; update; initialState) = \left( \begin{array}{l} States = \{0, 1, \dots, M\} \\ Inputs = (\{up, down\} \rightarrow \{present, absent\}) \\ Outputs = (\{count\} \rightarrow \{0, 1, \dots, M, absent\}) \\ initialState = 0 \\ update(s, i) = \begin{cases} (s + 1, s + 1) & \text{if } s < M \wedge i(up) = present \wedge i(down) = absent \\ (s - 1, s - 1) & \text{if } s > 0 \wedge i(up) = absent \wedge i(down) = present \\ (s, abs) & \text{otherwise} \end{cases} \end{array} \right)$$

# State machine properties

Important properties of **State Machines (SM)**:

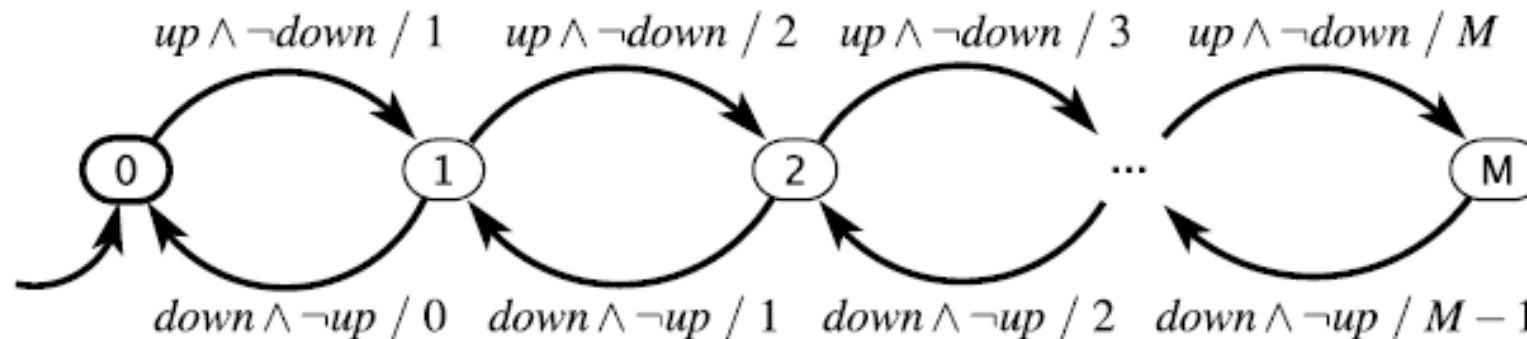
- **Determinacy** – An SM is said to be deterministic if, for each state, there is at most one transition enabled by each input value.
- **Receptiveness** – An SM is said to be receptive if, for each state, there is at least one transition possible on each input symbol.

As a result, if an SM is both deterministic and receptive, there is exactly one transition possible on each input value.

**Is the FSM model of the garage counter deterministic, receptive, neither or both?**

inputs: *up*, *down* : pure

output: *count* :  $\{0, \dots, M\}$





# Extended state machines

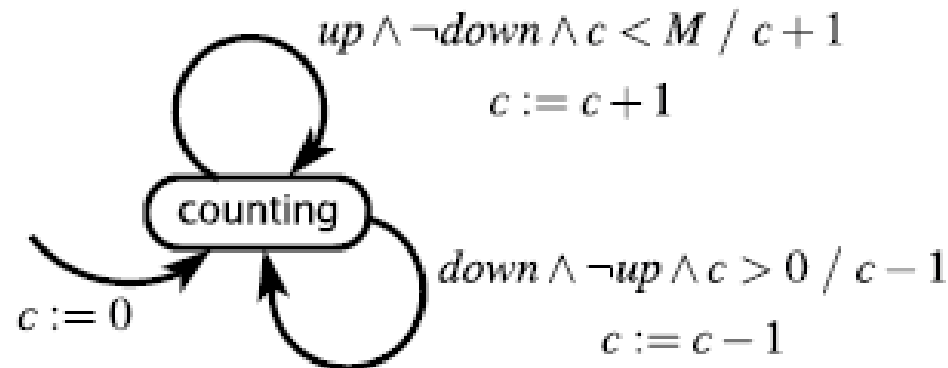
An **FSM** with large number of states can be generalized with an **Extended State Machine (ESM)**.

- Consider ESM model for garage counter:

**variable:**  $c: \{0, \dots, M\}$

**inputs:**  $up, down$ : pure

**output:**  $count: \{0, \dots, M\}$



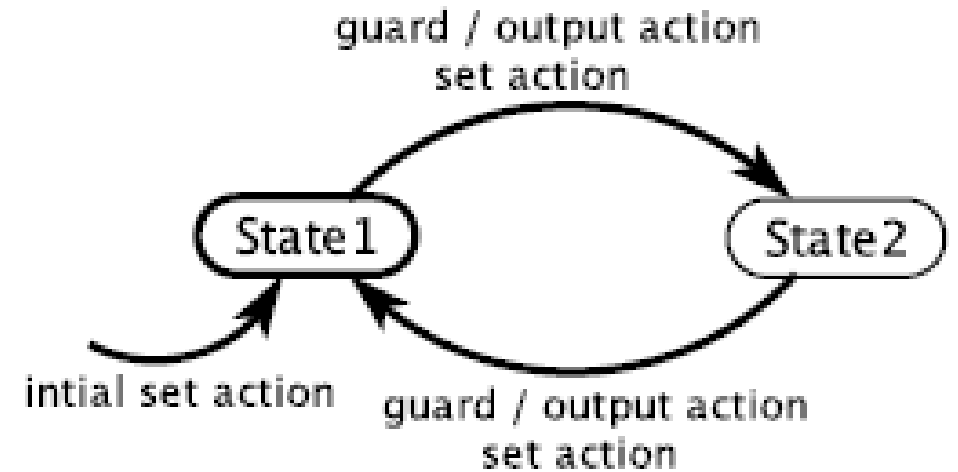
# Extended state machines

The general notation for an **ESM** is as follows:

variable declaration(s)  
input declaration(s)  
output declaration(s)

There are three main differences:

- Variable declarations;
- Variables initialization – initial set action;
- Assignments to variables – set actions.



The state of an **ESM** is defined by both the discrete state (a “bubble”) and states of variables (ie, their values).

Further reading on SM in the textbook (sections: **3.5 Nondeterminism**; **3.6 Behaviors and Traces**):

Lee, E.A. and Seshia, S.A., 2016. Introduction to embedded systems: A cyber-physical systems approach. Mit Press.

# Hybrid system modelling

Modelling techniques considered previously were:

- **Continuous dynamics** uses differential/integral equations to model continuous and “smooth” processes;
- **Discrete dynamics** uses state machines to model **discrete systems**.

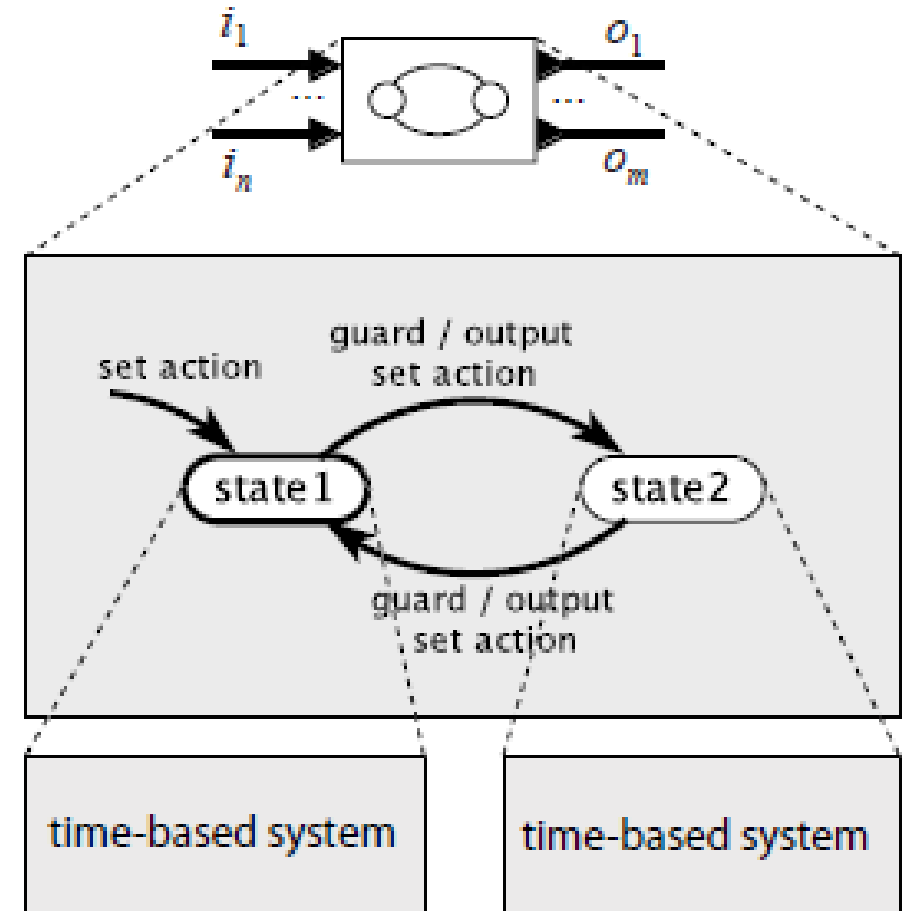
**Hybrid system modelling** is a formalism that incorporates both.

**Hybrid systems** can be very powerful to model cyber-physical systems by integrating their continuous physical dynamics with discrete computational systems.

# Hybrid systems

Discrete **state machines** can be extended to **hybrid systems** by allowing any of the following:

- Continuous inputs (i.e., continuous-time signals);
- Continuous dynamics of the output(s);
- State refinement (i.e., continuous state variables).



# Timed automata

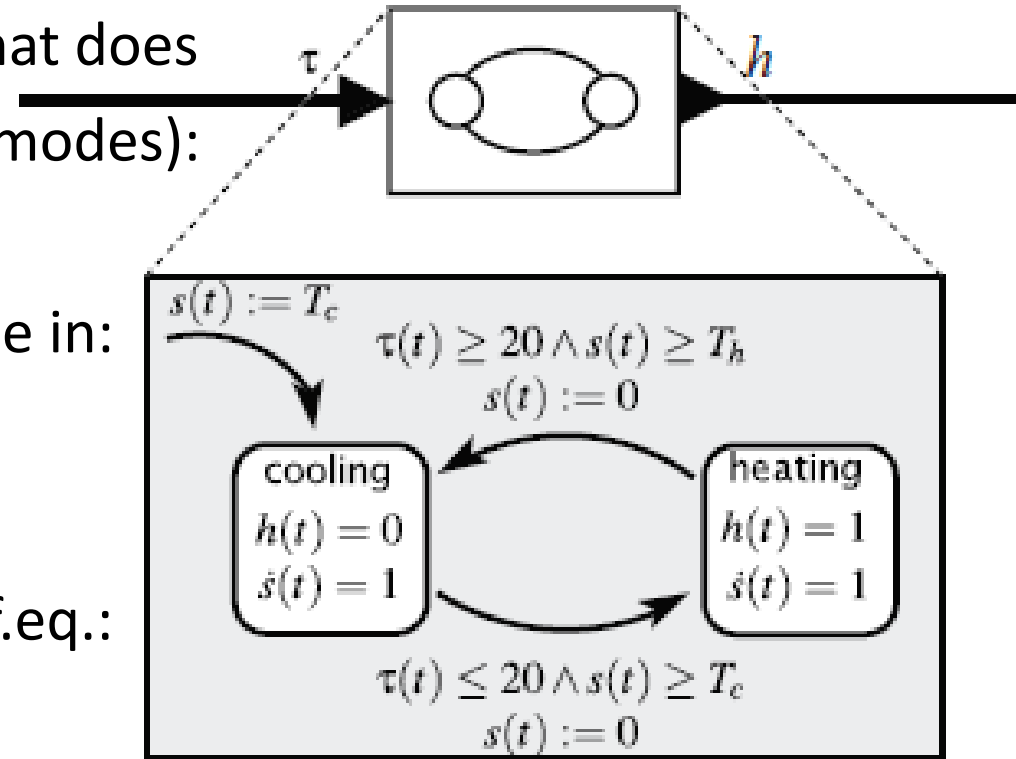
**Timed Automata (TA)** is a modal model with time-based refinement of states.

For example, let us consider a thermostat model that does not allow chattering (frequent transition between modes):

The main differences from **discrete machines** reside in:

- “Bubbles” (States) become **modes**;
- In each **mode**, state is defined by its variables;
- The model tracks the **clock** using a first-order diff.eq.:

$$\dot{s}(t) = 1.$$



# Timed automata

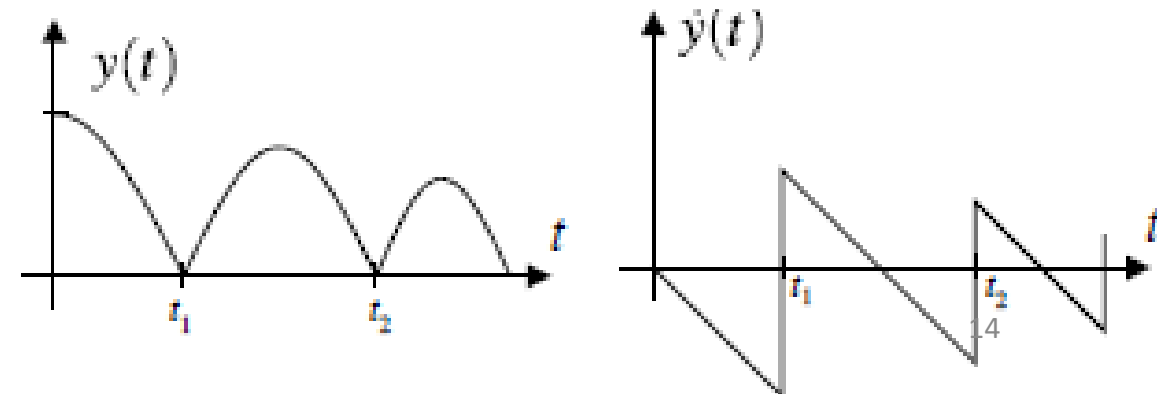
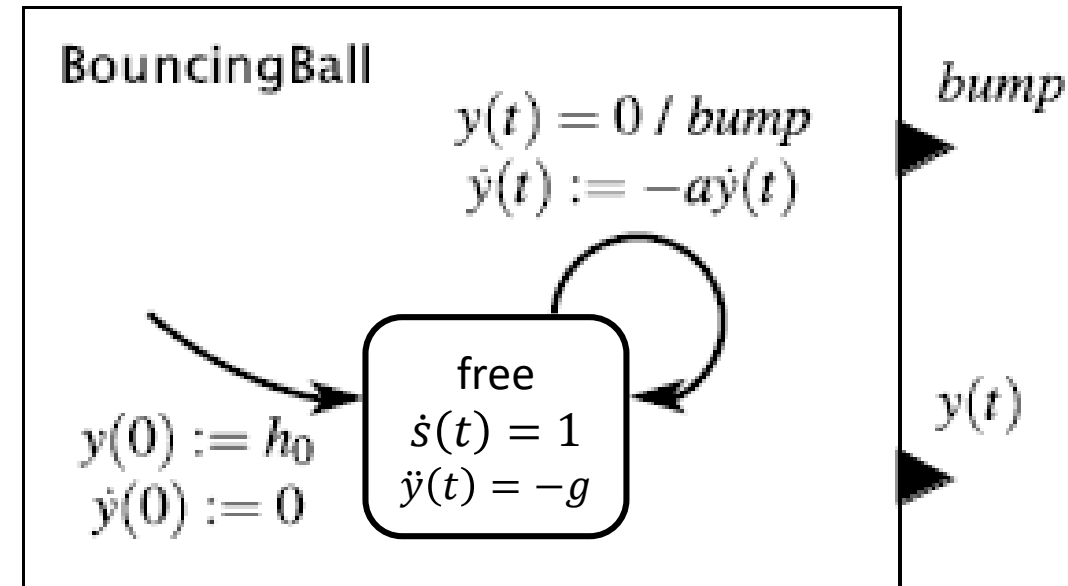
Let us consider another example of an **TA**, which models both continuous and discrete dynamics of a bouncing ball:

Problem description:

- Initial parameters at  $t = 0$ :
  - Ball is released at high  $h_0$  ( $y(0) := h_0$ );
  - Initial speed is zero ( $\dot{y}(0) := 0$ );
- State refinement:
  - Passage of time ( $\dot{s}(t) = 1$ );
  - Ball position in space ( $\ddot{y}(t) = -g$ );
- Predicate (guard):
  - Ball hits the ground ( $y(t) = 0$ )
- Set action (on the predicate):
  - Change ball speed ( $\dot{y}(t) = -a\dot{y}(t)$ ), where  $a \in R_{(0,1)}$  – inelastic collision.
  - Pure signal *bump* is produced.

**TA** characteristics:

- Two outputs (and no inputs);
- Only one mode “free” (instantaneous collision).



# Supervisory control

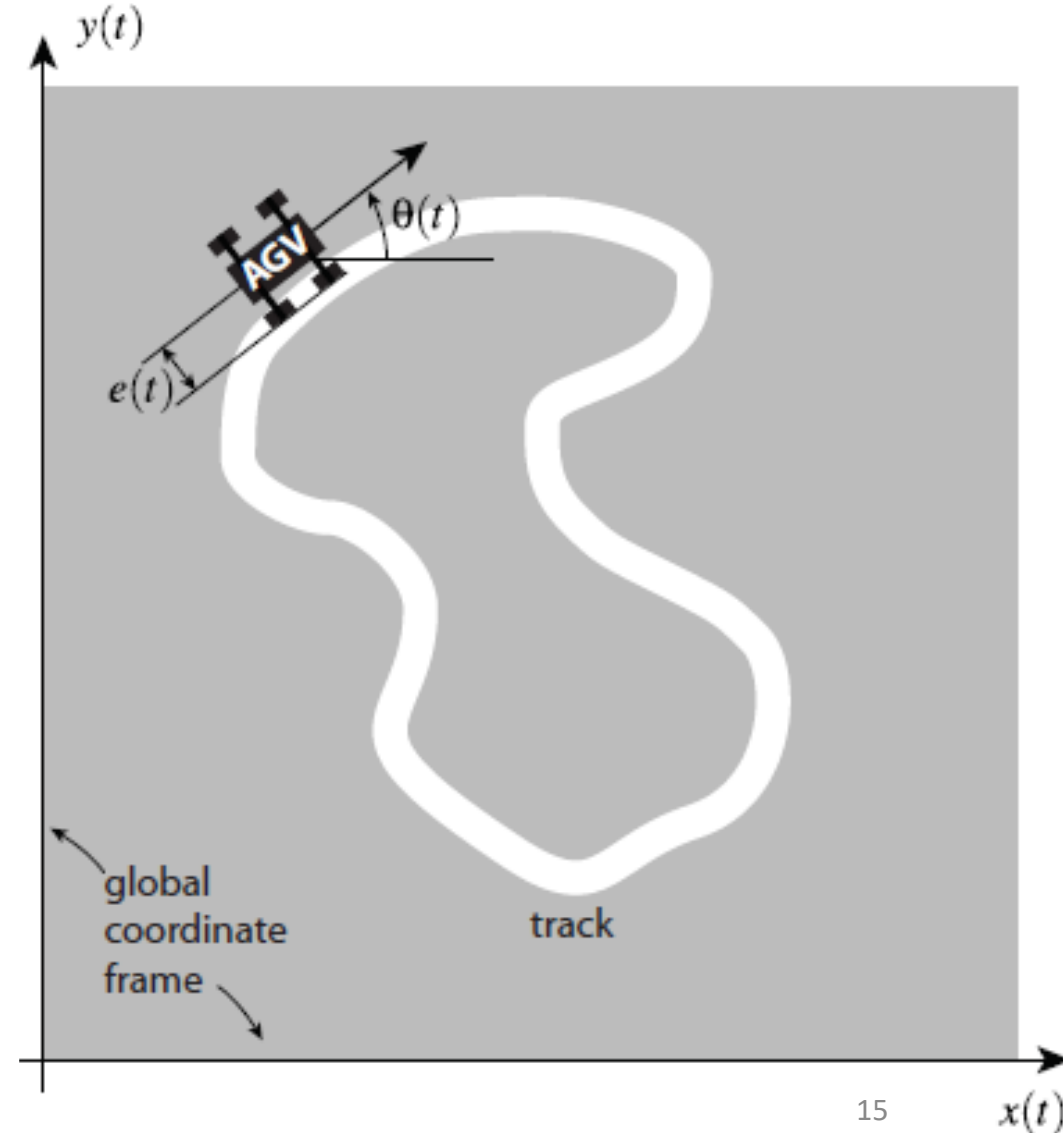
A control system includes four main components:

- A system to be controlled (ie, **plant**);
- **Environment** (where system operates);
- **Sensors** (measure some variables of the plant and environment);
- **Controller** (provide control signals to the plant).

The **controller** has two levels:

- **Low-level control** – determines time-based inputs to the plant;
- **Supervisory control** – determines control strategy to follow.

#Let us consider an Automated Guided Vehicle (AGV) that moves along a closed track painted on a warehouse floor.



# Supervisory control

Problem description:

- Two control variables (of AGV):
  - Translational speed  $u(t) \in R_{[0,10]}$  [m/s];
  - Rotational speed  $\omega(t) \in R_{[-\pi,\pi]}$  [rad/s];

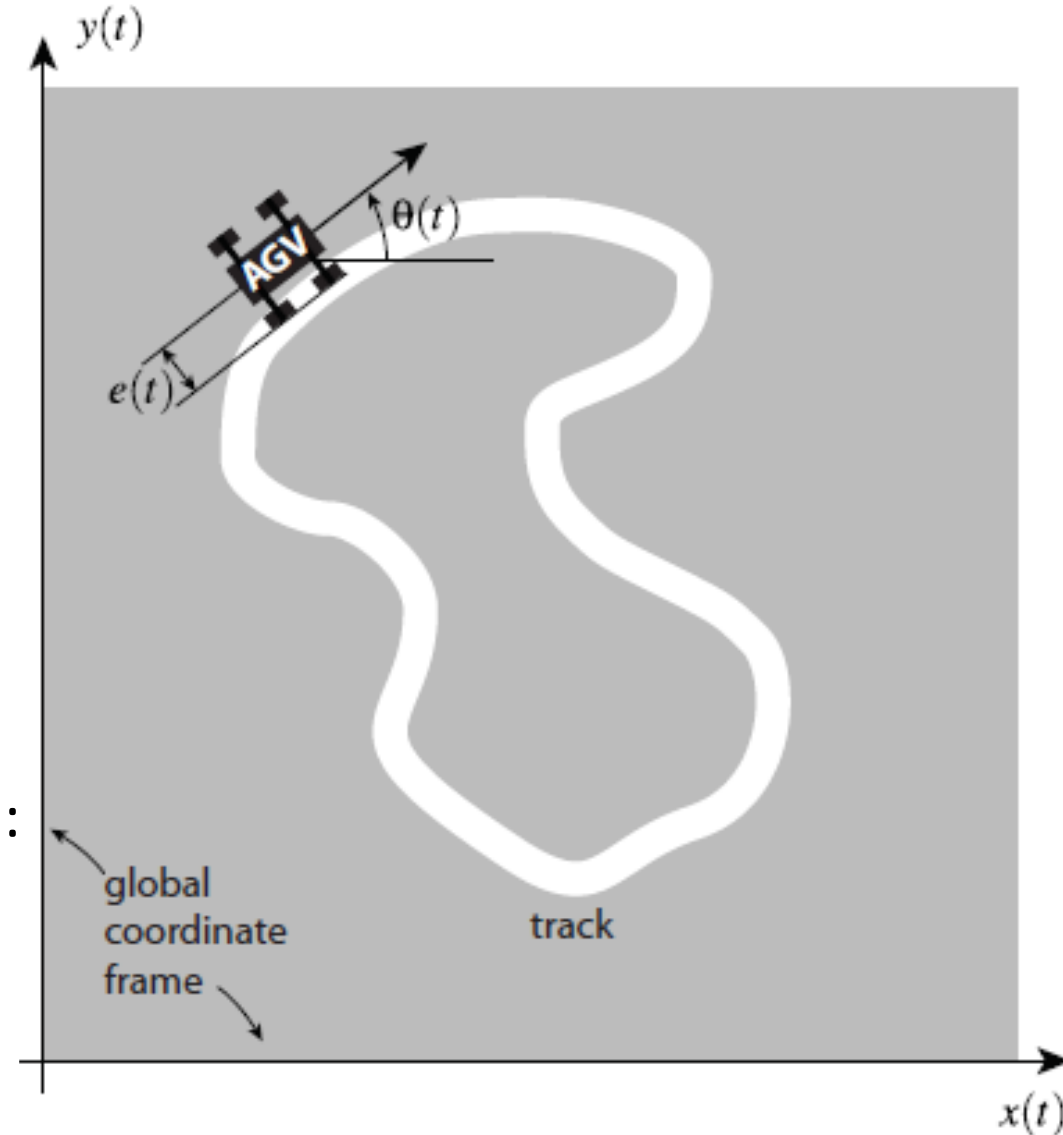
AGV position can be defined with:

- Coordinates  $(x(t), y(t)) \in R^2$ ;
- Orientation  $\theta(t) \in R_{(-\pi,\pi]}$ .

AGV position can be modelled by the **ODE** system:

$$\begin{cases} \dot{x}(t) = u(t) \cos \theta(t), \\ \dot{y}(t) = u(t) \sin \theta(t), \\ \dot{\theta}(t) = \omega(t). \end{cases}$$

#Let us consider an Automated Guided Vehicle (AGV) that moves along a closed track painted on a warehouse floor.





# Supervisory control

Suppose AGV has a sensor that measures distance from the track:

$$e(t) = f(x(t), y(t)),$$

where

$e(t) < 0$  - to the right of the track;

$e(t) > 0$  - to the left of the track.

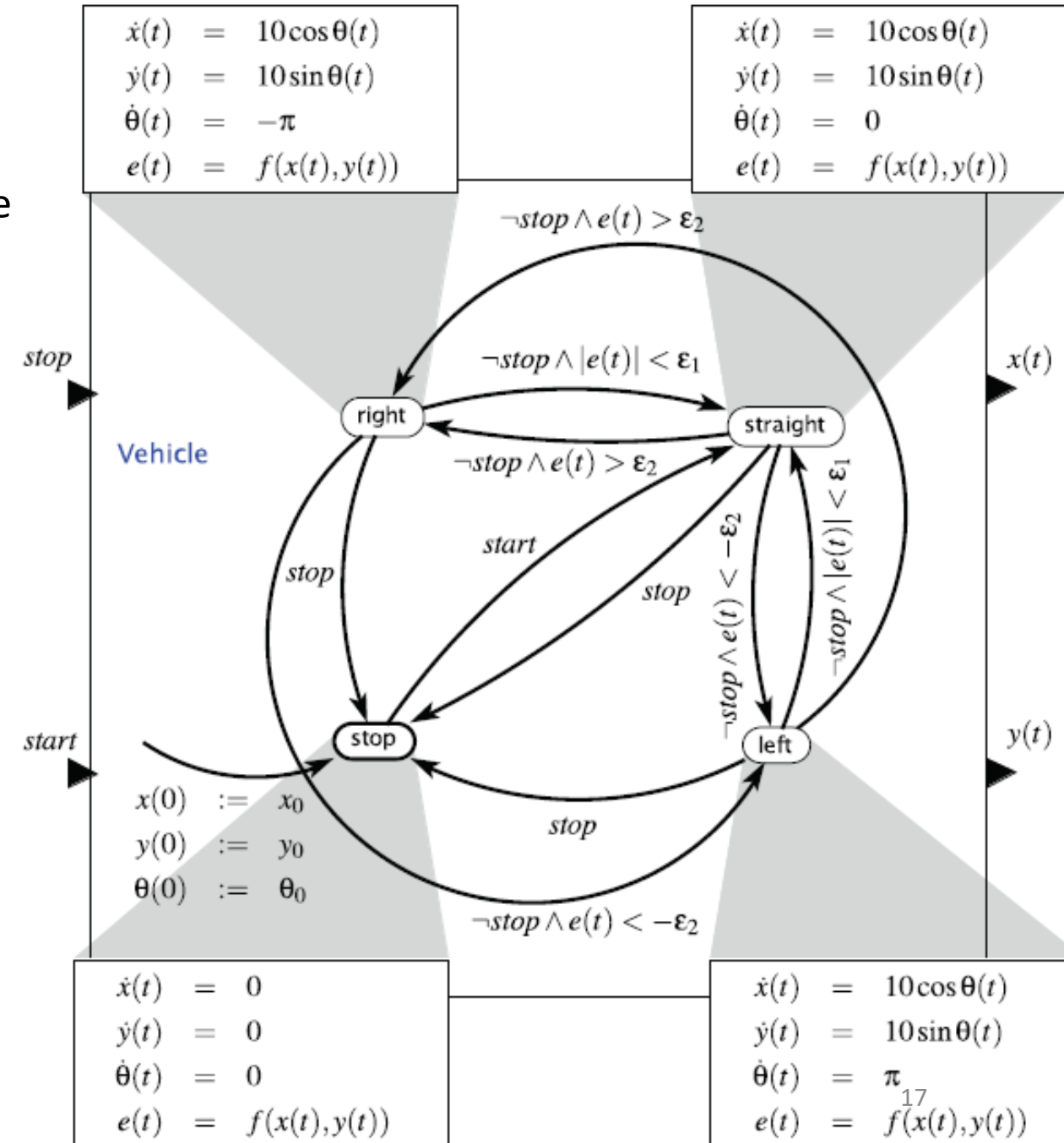
Specify two thresholds  $0 < \varepsilon_1 < \varepsilon_2$ :

- $\varepsilon_1$  - AGV is close enough;
- $\varepsilon_2$  - AGV far away.

Let's assume the simplest low-level control:

- $u(t) \in \{0, 10\}$  m/s;
- $\omega(t) \in \{-\pi, 0, \pi\}$  rad/s.

AGV Supervisory control model:



# To sum up

- A **discrete system** operates in a sequence of discrete steps and is said to have **discrete dynamics**;
- **Discrete systems** can be modelled with **state machines**:
  - Graphical notation useful for FSM and ESM;
  - Mathematical notation to ensure precise model formulation;
- Two main properties of **state machines** are **determinacy** and **receptiveness**, determining if the system can be effectively controlled;
- **Hybrid systems** provide a bridge between continuous and discrete dynamics:
  - **State machines** are used to reflect discrete dynamics (i.e., mode transition);
  - **State refinement** is used to model continuous dynamics within a mode;
- **Timed automata** is the particular example of a hybrid system, where **time-based refinement of states** is modelled;
- **Supervisory control** model has been considered to illustrate the use of **hybrid systems** when designing multi-level control.

# The End

See you next time (March 13)