

# Hybrid Control and Switched Systems

## Lecture #2 How to describe a hybrid system? Formal models for hybrid system

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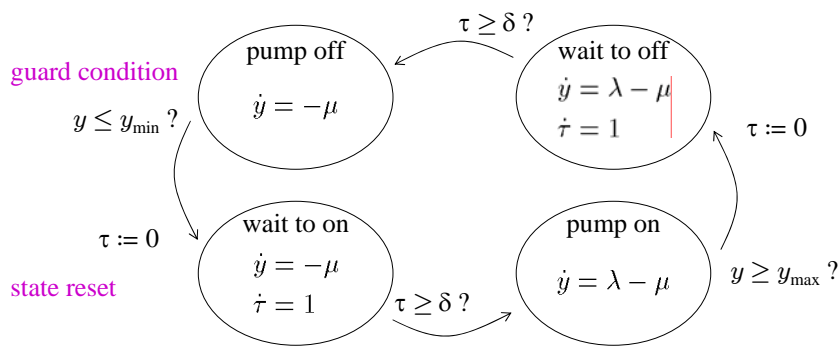
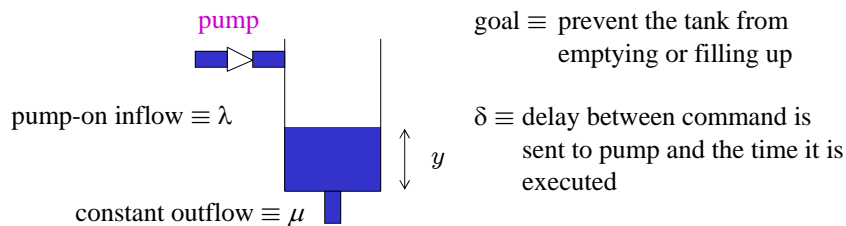
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## Summary

1. **Formal models for hybrid systems:**
  - Finite automata
  - Differential equations
  - Hybrid automata
  - Open hybrid automaton
2. Nondeterministic vs. stochastic systems
  - Non-deterministic hybrid automata
  - Stochastic hybrid automata

## Example #5: Multiple-tank system



How to formally describe this hybrid system?

## Deterministic finite automaton

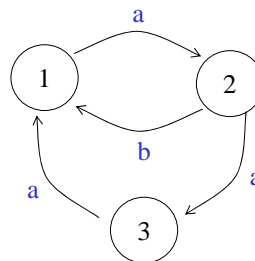
automata  $M$   $\left\{ \begin{array}{l} \mathcal{Q} := \{q_1, q_2, \dots, q_n\} \equiv \text{finite set of states} \\ \Sigma := \{a, b, c, \dots\} \equiv \text{finite set of input symbols (alphabet)} \\ \Phi : \mathcal{Q} \times \Sigma \rightarrow \mathcal{Q} \equiv \text{transition function} \end{array} \right.$

Example:

$q \in \mathcal{Q}$	$s \in \Sigma$	$\Phi(q, s)$
1	a	2
1	b	$\emptyset$
2	a	3
2	b	1
3	a	1
3	b	$\emptyset$
$\emptyset$	a/b	$\emptyset$

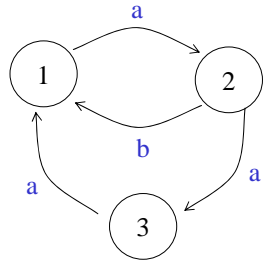
blocking state

Graph representation:



- one node per state (except for blocking state  $\emptyset$ )
- one directed edge (arrow) from  $q$  to  $\Phi(q, s)$  with label  $s$  for each pair  $(q, s)$  for which  $\Phi(q, s) \neq \emptyset$

## Deterministic finite automaton



**Notation:** Given set  $\mathcal{A}$   
 string  $\equiv$  finite sequence of symbols  
 $\epsilon \equiv$  empty string  
 $\mathcal{A}^* \equiv$  set of all strings of symbols in set  $\mathcal{A}$   
 e.g.,  $\mathcal{A} = \{a, b\}$   
 $s = abbbbaab \in \mathcal{A}^*$   
 $s[3] = b$  (3rd element)  
 $|s| = 8$  (length of string)

Definition: Given

- initial state  $q_1 \in Q$
- set of final states  $\mathcal{F} \subset Q$

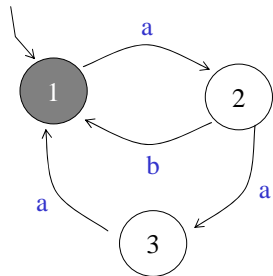
$M$  **accepts** a string  $s \in \Sigma^*$  with length  $n := |s|$  if there exists a sequence of states  $q \in Q^*$  with length  $|q| = n+1$  (**execution**) such that

1.  $q[1] = q_1$  (starts at initial state)
2.  $q[i+1] = \Phi(q[i], s[i])$ ,  $i \in \{1, 2, \dots, n\}$  (follows arrows with correct label)
3.  $q[n+1] \in \mathcal{F}$  (ends in set of final states)

Definition: **language** accepted by automaton  $M$   
 $L(M) := \{ \text{set of all strings accepted by } M \}$

There is no concept of time—the whole string is accepted “instantaneously”

## Deterministic finite automaton



Example:

$q_1 := 1$   
 $\mathcal{F} := \{1\}$   
 $L(M) = \{ \epsilon, ab, aaa, abab, abaaa, aaaab, \dots \}$   
 $= ((ab)^*(aaa)^*)^*$

Questions in formal language theory:

Is there a finite automaton that accepts a given language?  
 Do two given automata accept the same language?  
 What is the smallest automaton that accepts a given language? etc.

Definition: Given

- initial state  $q_1 \in Q$
- set of final states  $\mathcal{F} \subset Q$

$M$  **accepts** a string  $s \in \Sigma^*$  with length  $n := |s|$  if there exists a sequence of states  $q \in Q^*$  with length  $|q| = n+1$  (**execution**) such that

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Definition: **language** accepted by automaton  $M$   
 $L(M) := \{ \text{set of all strings accepted by } M \}$

## Differential equation

ordinary differential equation with input  $\Sigma$   $\left\{ \begin{array}{ll} \mathbb{R}^n & \equiv \text{state space} \\ \mathbb{R}^m & \equiv \text{input space} \\ f: \mathbb{R}^n \times \mathbb{R}^m \rightarrow \mathbb{R}^n & \equiv \text{vector field} \end{array} \right.$

$$\dot{x} = f(x, u)$$

Definition: Given an input signal  $u : [0, \infty) \rightarrow \mathbb{R}^m$

A signal  $x : [0, \infty) \rightarrow \mathbb{R}^n$  is a **solution** to  $\Sigma$  (in the sense of Caratheodory) if

1.  $x$  is piecewise differentiable

2.  $x(t) = x_0 + \int_0^t f(x(\tau), u(\tau)) d\tau \quad \forall t \geq 0$

If  $x$  is a solution then

$$\left. \frac{dx}{dt}(t) = f(x(t), u(t)) \right|$$

at any time  $t$  for which the derivative exists

## Differential equation (no inputs)

ordinary differential equation without input  $\Sigma$   $\left\{ \begin{array}{ll} \mathbb{R}^n & \equiv \text{state space} \\ f: \mathbb{R}^n \rightarrow \mathbb{R}^n & \equiv \text{vector field} \end{array} \right.$

$$\dot{x} = f(x)$$

Definition:

A signal  $x : [0, \infty) \rightarrow \mathbb{R}^n$  is a **solution** to  $\Sigma$  (in the sense of Caratheodory) if

1.  $x$  is piecewise differentiable

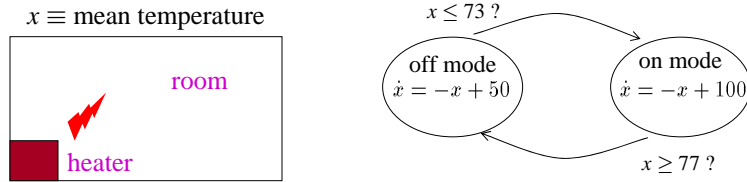
2.  $x(t) = x_0 + \int_0^t f(x(\tau)) d\tau \quad \forall t \geq 0$

If  $x$  is a solution then

$$\left. \frac{dx}{dt}(t) = f(x(t)) \right|$$

at any time  $t$  for which the derivative exists

## Hybrid Automaton (Example #2: Thermostat)



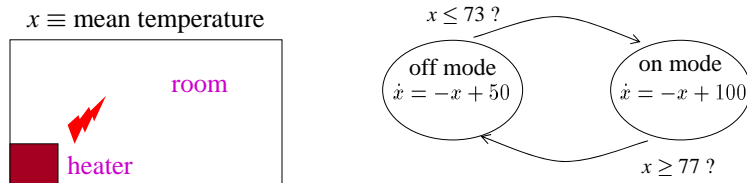
$Q$   $\equiv$  set of discrete states  
 $\mathbb{R}^n$   $\equiv$  continuous state-space  
 $f : Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n \equiv$  vector field  
 $\varphi : Q \times \mathbb{R}^n \rightarrow Q \equiv$  discrete transition

Example:  $Q := \{ \text{off, on} \}$   $n := 1$

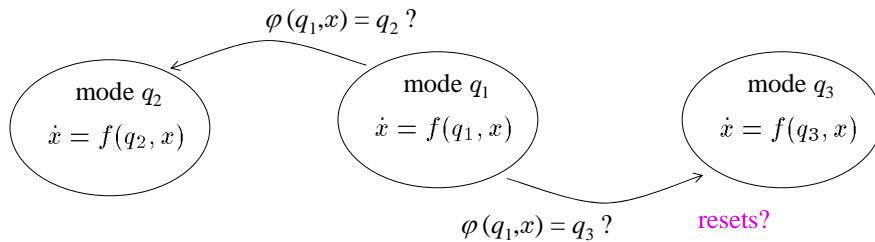
$$f(q, x) := \begin{cases} -x + 50 & q = \text{off} \\ -x + 100 & q = \text{on} \end{cases} \quad \varphi(q, x) := \begin{cases} \text{on,} & q = \text{off, } x \leq 73 \\ \text{off,} & q = \text{off, } x > 73 \\ \text{off,} & q = \text{on, } x \geq 77 \\ \text{on,} & q = \text{on, } x < 77 \end{cases}$$

*note "closed" inequalities associated with jump and "open" inequalities with flow*

## Hybrid Automaton (Example #2: Thermostat)

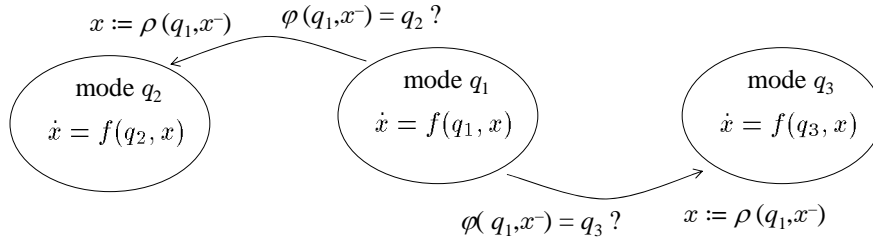


$Q$   $\equiv$  set of discrete states  
 $\mathbb{R}^n$   $\equiv$  continuous state-space  
 $f : Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n \equiv$  vector field  
 $\varphi : Q \times \mathbb{R}^n \rightarrow Q \equiv$  discrete transition



## Hybrid Automaton

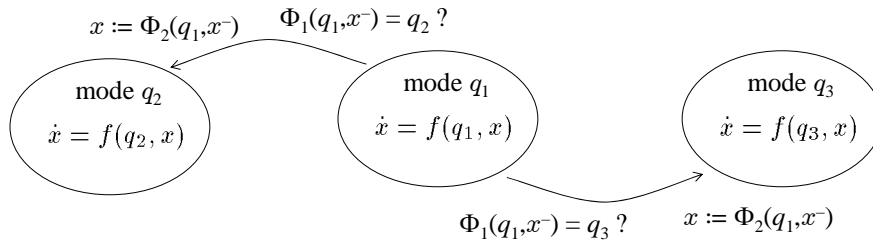
$\mathcal{Q}$   $\equiv$  set of discrete states  
 $\mathbb{R}^n$   $\equiv$  continuous state-space  
 $f: \mathcal{Q} \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  vector field  
 $\varphi: \mathcal{Q} \times \mathbb{R}^n \rightarrow \mathcal{Q}$   $\equiv$  discrete transition  
 $\rho: \mathcal{Q} \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  reset map



## Hybrid Automaton

$\mathcal{Q}$   $\equiv$  set of discrete states  
 $\mathbb{R}^n$   $\equiv$  continuous state-space  
 $f: \mathcal{Q} \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  vector field  
 $\Phi: \mathcal{Q} \times \mathbb{R}^n \rightarrow \mathcal{Q} \times \mathbb{R}^n$   $\equiv$  discrete transition (& reset map)

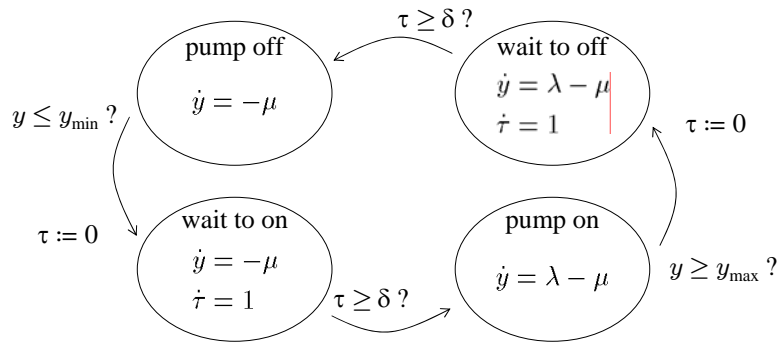
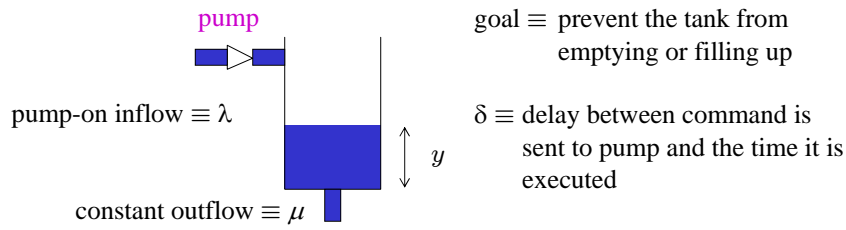
$$\Phi(q, x) = \begin{bmatrix} \Phi_1(q, x) \\ \Phi_2(q, x) \end{bmatrix} = \begin{bmatrix} \varphi(q, x) \\ \rho(q, x) \end{bmatrix}$$



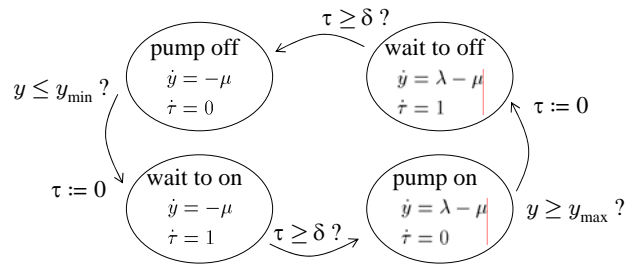
Compact representation of a hybrid automaton

$$\dot{x} = f(q, x) \quad (q, x) = \Phi(q^-, x^-) \quad q \in \mathcal{Q}, x \in \mathbb{R}^n$$

### Example #5: Multiple-tank system



### Example #5: Multiple-tank system



$\mathcal{Q} := \{ \text{off, won, on, woff} \}$   
 $\mathbb{R}^2 \equiv$  continuous state-space

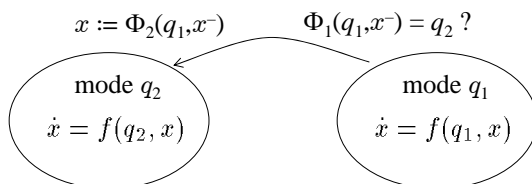
$$f(q, x) := \begin{cases} \begin{bmatrix} -\mu \\ 0 \end{bmatrix} & q = \text{off} \\ \begin{bmatrix} -\mu \\ 1 \end{bmatrix} & q = \text{won} \\ \begin{bmatrix} \lambda - \mu \\ 0 \end{bmatrix} & q = \text{on} \\ \begin{bmatrix} \lambda - \mu \\ 1 \end{bmatrix} & q = \text{woff} \end{cases}$$

$$\varphi(q, x) := \begin{cases} \text{off} & q = \text{woff}, \tau \geq \delta \\ \text{off} & q = \text{off}, y > y_{\min} \\ \text{won} & q = \text{off}, y \leq y_{\min} \\ \text{won} & q = \text{won}, \tau < \delta \\ \vdots & \end{cases}$$

$$\rho(q, x) := \begin{cases} x & q = \text{woff}, \tau \geq \delta \\ x & q = \text{off}, y > y_{\min} \\ \begin{bmatrix} y \\ 0 \end{bmatrix} & q = \text{off}, y \leq y_{\min} \\ x & q = \text{won}, \tau < \delta \\ \vdots & \end{cases}$$

## Solution to a hybrid automaton

$$\dot{x} = f(q, x) \quad (q, x) = \Phi(q^-, x^-) \quad q \in \mathcal{Q}, x \in \mathbb{R}^n$$



Definition: A **solution** to the hybrid automaton is a pair of right-continuous signals  
 $x : [0, \infty) \rightarrow \mathbb{R}^n$        $q : [0, \infty) \rightarrow \mathcal{Q}$

such that

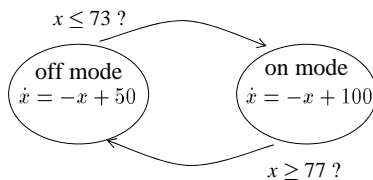
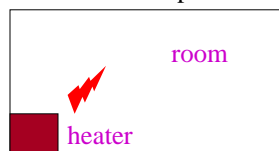
1.  $x$  is piecewise differentiable &  $q$  is piecewise constant
2. on any interval  $(t_1, t_2)$  on which  $q$  is constant and  $x$  continuous

$$x(t) = x(t_1) + \int_{t_1}^t f(q(t_1), x(\tau)) d\tau \quad \forall t \in [t_1, t_2) \quad \text{continuous evolution}$$

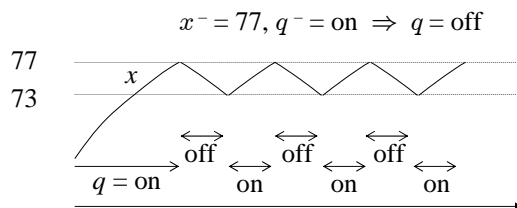
$$3. (q(t), x(t)) = \Phi(q^-(t), x^-(t)) \quad \forall t \geq 0 \quad \text{discrete transitions}$$

## Hybrid Automaton (Example #2: Thermostat)

$x \equiv$  mean temperature



$$f(q, x) := \begin{cases} -x + 50 & q = \text{off} \\ -x + 100 & q = \text{on} \end{cases} \quad \varphi(q, x) := \begin{cases} \text{on,} & q = \text{off, } x \leq 73 \\ \text{off,} & q = \text{off, } x > 73 \\ \text{off,} & q = \text{on, } x \geq 77 \\ \text{on,} & q = \text{on, } x < 77 \end{cases}$$



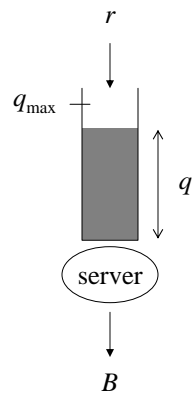
no transition would occur if the "jump branch" had a strict inequality  $x > 77$

note "closed" inequalities associated with jumps and "open" inequalities with flows



## Example #7: Server system with congestion control

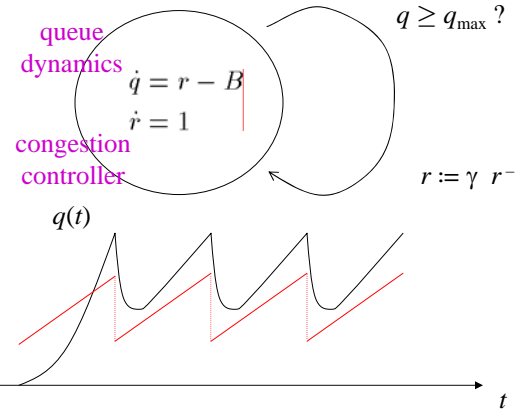
incoming rate



rate of service  
(bandwidth)

Additive increase/multiplicative decrease congestion control (AIMD):

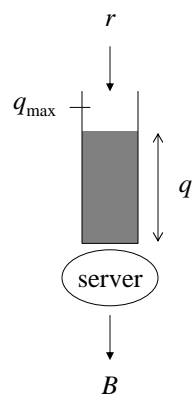
- while  $q < q_{\max}$  increase  $r$  linearly
- when  $q$  reaches  $q_{\max}$  instantaneously multiply  $r$  by  $\gamma \in (0,1)$



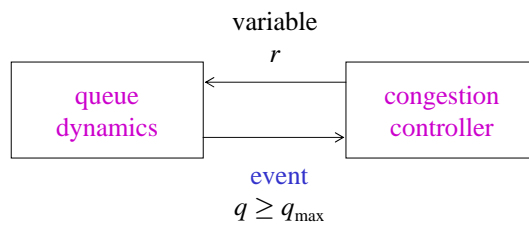
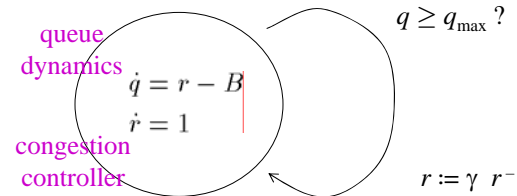
## Open Automaton

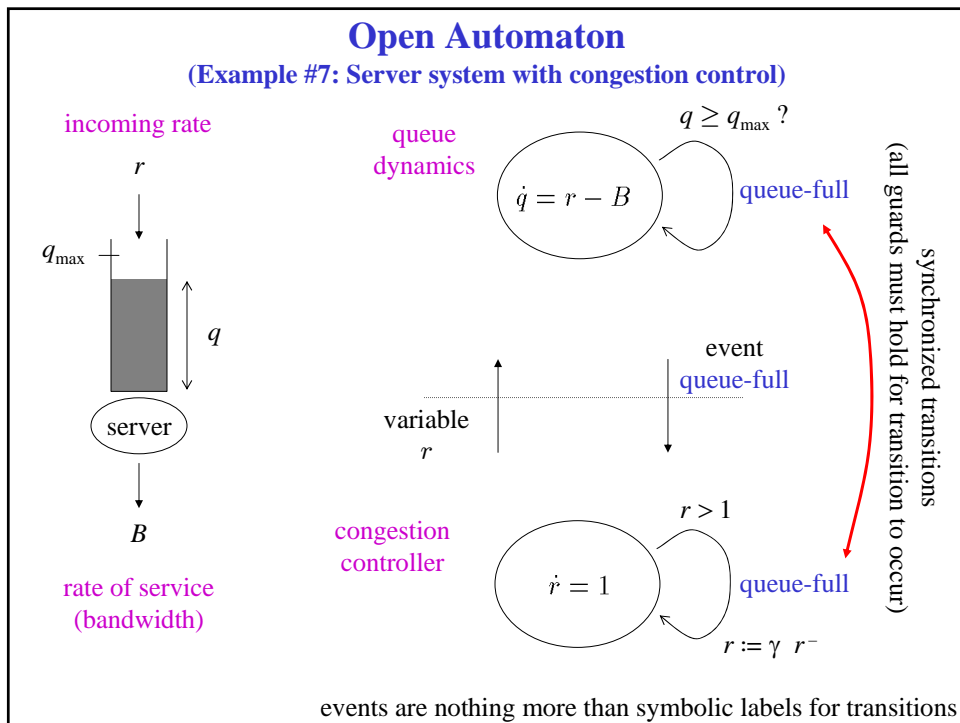
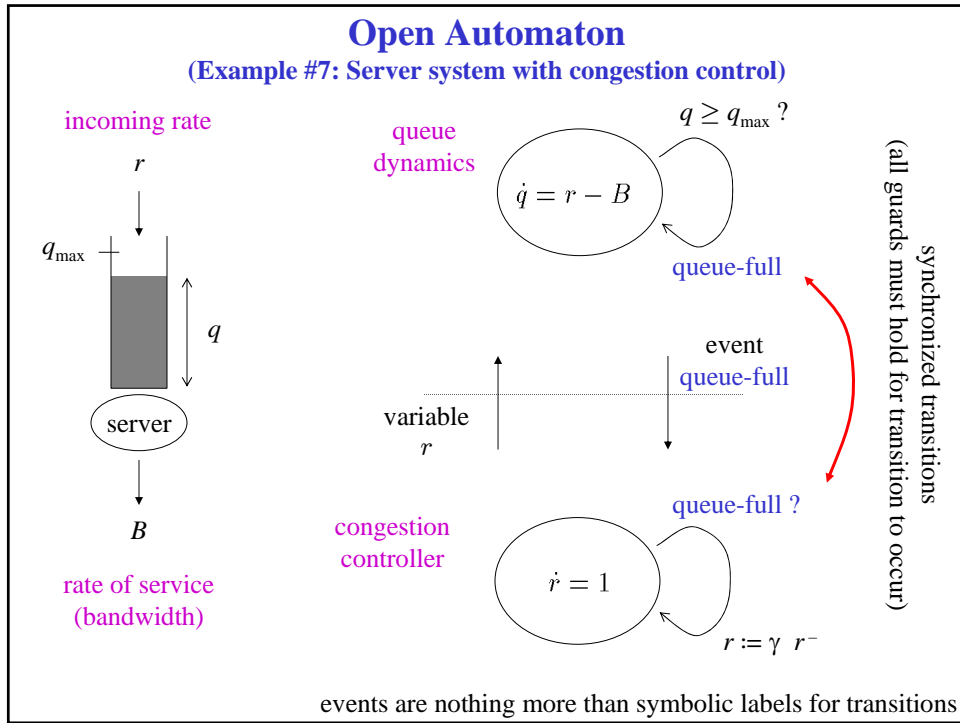
(Example #7: Server system with congestion control)

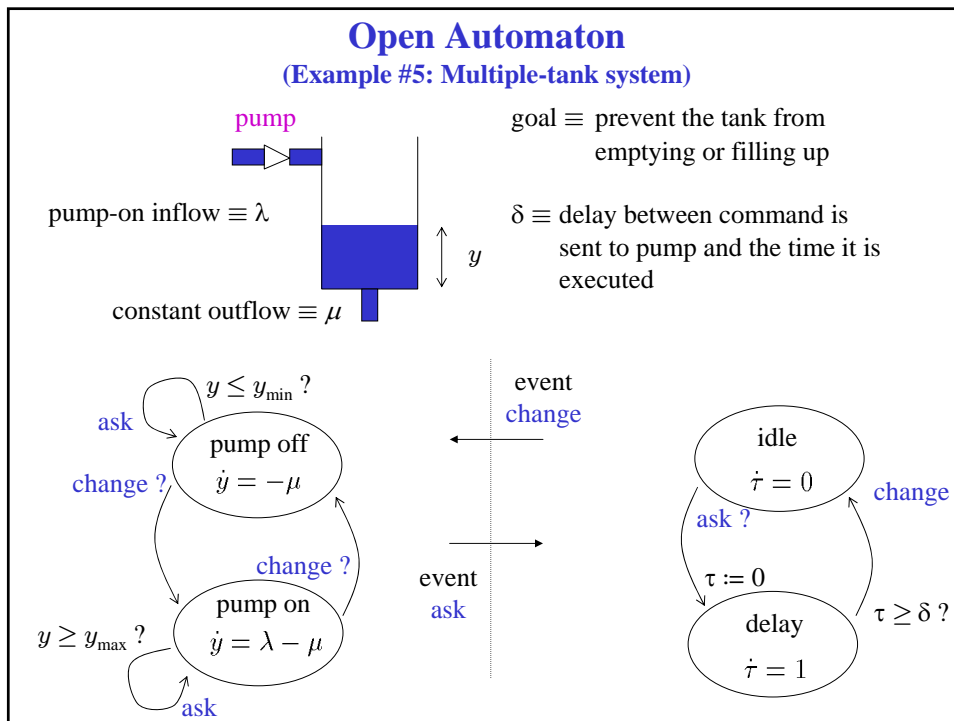
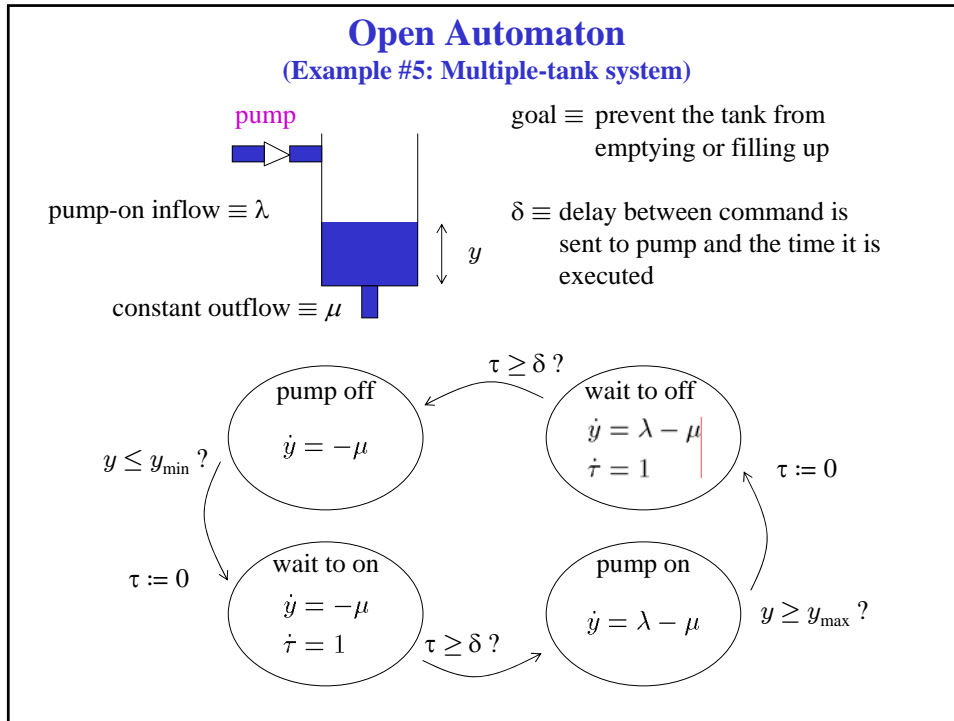
incoming rate



rate of service  
(bandwidth)







## Deterministic finite automaton

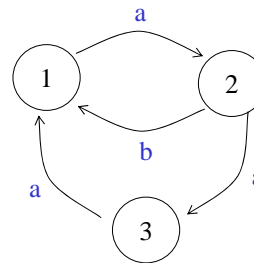
automata  $M$   $\left\{ \begin{array}{l} \mathcal{Q} := \{q_1, q_2, \dots, q_n\} \equiv \text{finite set of states} \\ \Sigma := \{a, b, c, \dots\} \equiv \text{finite set of input symbols (alphabet)} \\ \Phi : \mathcal{Q} \times \Sigma \rightarrow \mathcal{Q} \equiv \text{transition function} \end{array} \right.$

Example:

$q \in \mathcal{Q}$	$s \in \Sigma$	$\Phi(q,s)$
1	a	2
1	b	$\emptyset$
2	a	3
2	b	1
3	a	1
3	b	$\emptyset$
$\emptyset$	a/b	$\emptyset$

blocking state

Graph representation:



- one node per state (except for blocking state  $\emptyset$ )
- one directed edge (arrow) from  $q$  to  $\Phi(q, s)$  with label  $s$  for each pair  $(q, s)$  for which  $\Phi(q, s) \neq \emptyset$

## Nondeterministic finite automaton

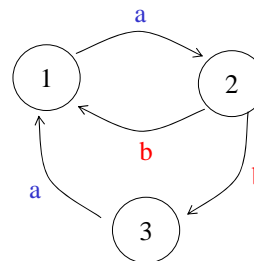
automata  $M$   $\left\{ \begin{array}{l} \mathcal{Q} := \{q_1, q_2, \dots, q_n\} \equiv \text{finite set of states} \\ \Sigma := \{a, b, c, \dots\} \equiv \text{finite set of input symbols (alphabet)} \\ \Phi : \mathcal{Q} \times \Sigma \rightarrow 2^{\mathcal{Q}} \equiv \text{transition set-valued function} \end{array} \right.$

Example:

$q \in \mathcal{Q}$	$s \in \Sigma$	$\Phi(q,s)$
1	a	{2}
1	b	{ $\emptyset$ }
2	a	{ $\emptyset$ }
2	b	{1,3}
3	a	{1}
3	b	{ $\emptyset$ }
$\emptyset$	a/b	{ $\emptyset$ }

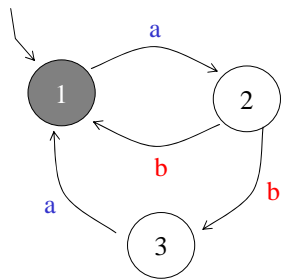
blocking state

Graph representation:



**Notation:** Given a set  $\mathcal{A}$ ,  
 $2^{\mathcal{A}} \equiv$  *power-set* of  $\mathcal{A}$ , i.e., the set of all subsets of  $\mathcal{A}$   
 e.g.,  $\mathcal{A} = \{1,2\} \Rightarrow 2^{\mathcal{A}} = \{\epsilon, \{1\}, \{2\}, \{1,2\}\}$   
 When  $\mathcal{A}$  has  $n < \infty$  elements then  $2^{\mathcal{A}}$  has  $2^n$  elements

## Nondeterministic finite automaton



Example:

$q_1 := 1$

$\mathcal{F} := \{1\}$

$L(M) = \{ \epsilon, ab, aba, abab, ababa, abaab, \dots \}$

$= ((ab)^*(aba)^*)^*$

Definition: Given

- initial state  $q_1 \in Q$
- set of final states  $\mathcal{F} \subset Q$

$M$  accepts a string  $s \in \Sigma^*$  with length  $n := |s|$  if

there exists a sequence of states  $q \in Q^*$  with length  $|q| = n+1$  (*execution*) such that

1.  $q[1] = q_1$  (starts at initial state)
2.  $q[i+1] \in \Phi(q[i], s[i])$ ,  $i \in \{1, 2, \dots, n\}$  (follows arrows with correct label)
3.  $q[n+1] \in \mathcal{F}$  (ends in set of final states)

Definition: *language* accepted by automaton  $M$

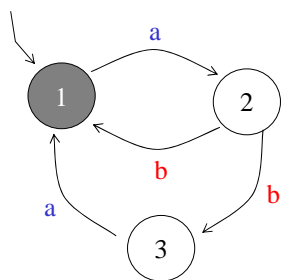
$L(M) := \{ \text{set of all strings accepted by } M \}$

## Determinization

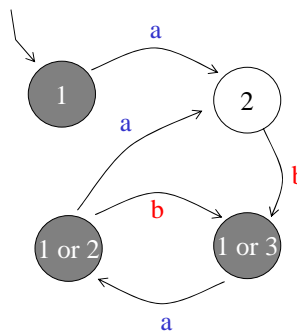
From formal language theory:

For every nondeterministic finite automaton there is a deterministic one that accepts the same language (but generally the deterministic one needs more states)

nondeterministic automaton  $M$



deterministic automaton  $N$



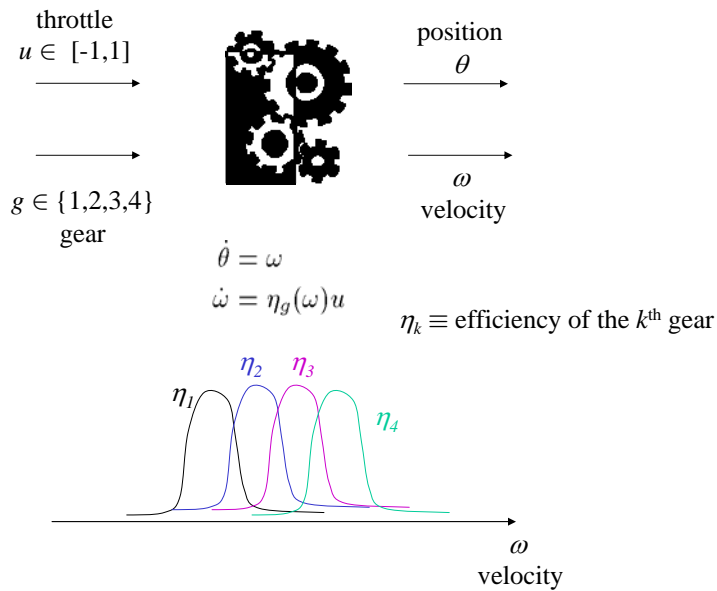
- from 1 only accepts a and goes to 2
- from 2 only accepts b and can go to either 1 or 3
- from 1 or 3 only accepts a and goes to 2 or 1 resp.
- from 1 (or 2) can accept a and go to 2
- from (1 or 2) can accept b and go to 1 or 3

Same language:

$L(M) = L(N) = ((ab)^*(aba)^*)^*$

$M$  provides more compact representation

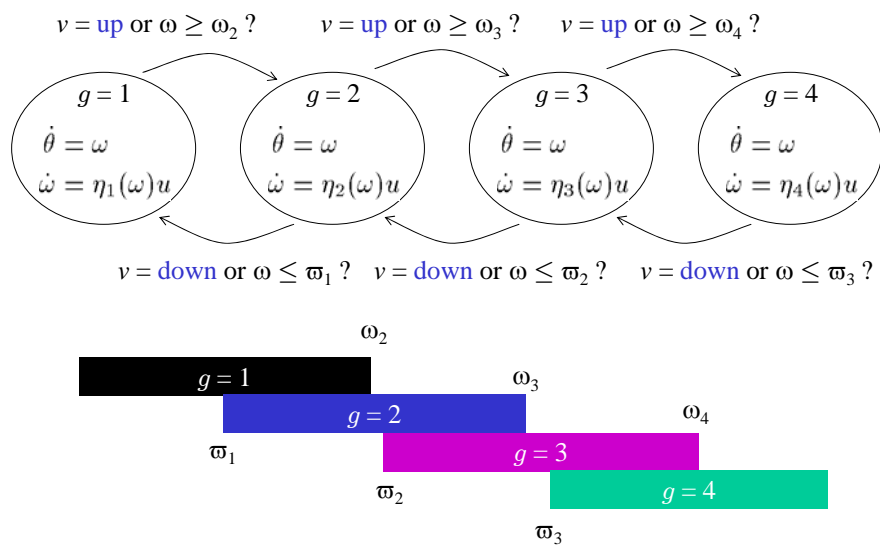
### Example #3: Transmission



[Hedlund, Rantzer 1999]

### Example #3: Semi-automatic transmission

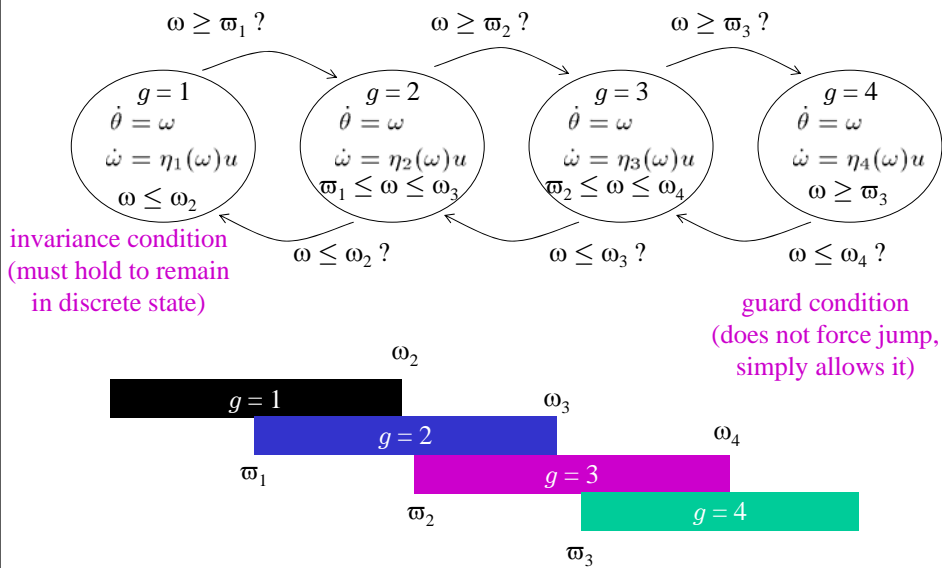
$v(t) \in \{ \text{up, down, keep} \} \equiv$  drivers input (discrete)



## Nondeterministic Hybrid Automaton

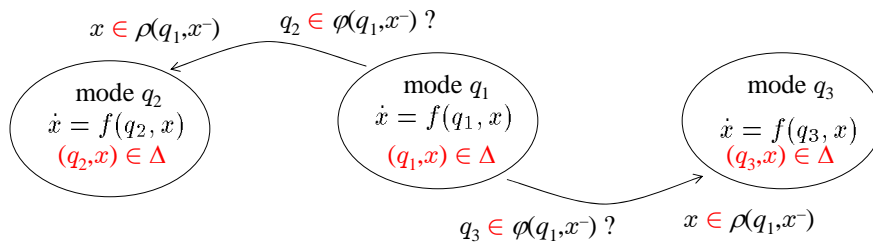
(Example #3: Semi-automatic transmission)

Suppose we want to consider *all possible driver inputs*:



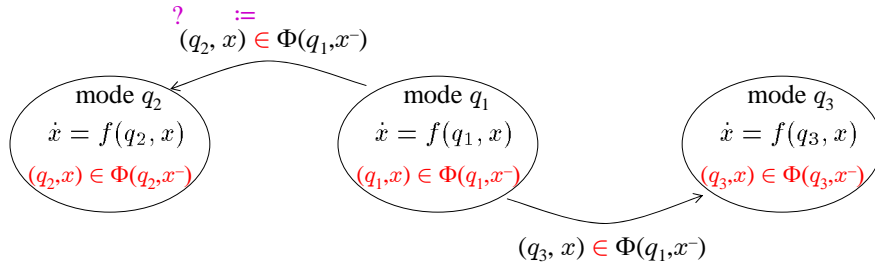
## Nondeterministic Hybrid Automaton

- $Q$   $\equiv$  set of discrete states
- $\mathbb{R}^n$   $\equiv$  continuous state-space
- $f: Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  vector field
- $\varphi: Q \times \mathbb{R}^n \rightarrow 2^Q$   $\equiv$  **set-valued** discrete transition
- $\rho: Q \times \mathbb{R}^n \rightarrow 2^{\mathbb{R}^n}$   $\equiv$  **set-valued** reset map
- $\Delta \subset Q \times \mathbb{R}^n$   $\equiv$  **domain** or invariant set



## Nondeterministic Hybrid Automaton

$\mathcal{Q}$   $\equiv$  set of discrete states  
 $\mathbb{R}^n$   $\equiv$  continuous state-space  
 $f: \mathcal{Q} \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  vector field  
 $\Phi: \mathcal{Q} \times \mathbb{R}^n \rightarrow 2^{\mathcal{Q} \times \mathbb{R}^n}$   $\equiv$  **set-valued** discrete transition (& reset & domain)  
 $\Phi(q, x) = (\varphi(q, x) \times \rho(q, x)) \cap \Delta$

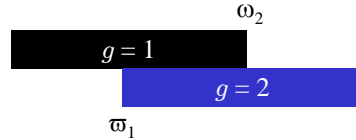
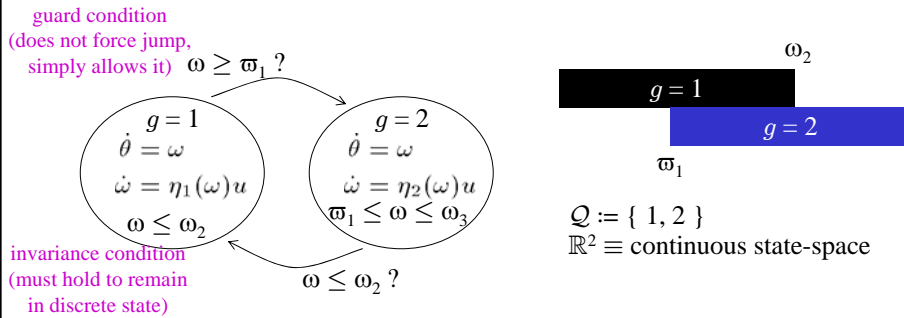


Compact representation of a nondeterministic hybrid automaton

$$\dot{x} = f(q, x) \quad (q, x) \in \Phi(q^-, x^-) \quad q \in \mathcal{Q}, x \in \mathbb{R}^n$$

## Nondeterministic Hybrid Automaton

(Example #3: Semi-automatic transmission)



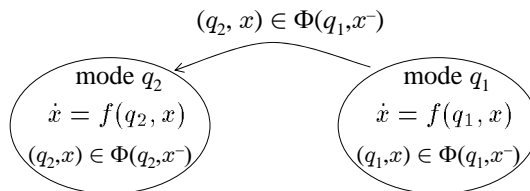
$\mathcal{Q} := \{ 1, 2 \}$   
 $\mathbb{R}^2 \equiv$  continuous state-space

$$f(q, x) = \begin{bmatrix} \omega \\ \eta_q(\omega)u \end{bmatrix} \quad \Phi(q, x) = \begin{cases} \{(1, x)\} & q = 1, \omega < \varpi_1 \\ \{(1, x), (2, x)\} & q = 1, \omega \in [\varpi_1, \varpi_2] \\ \{(2, x)\} & q = 1, \omega > \varpi_2 \\ \{(2, x)\} & q = 2, \omega > \varpi_2 \\ \{(1, x), (2, x)\} & q = 2, \omega \in [\varpi_1, \varpi_2] \\ \{(1, x)\} & q = 2, \omega < \varpi_1 \end{cases}$$



## Solution to a nondeterministic hybrid automaton

$$\dot{x} = f(q, x) \quad (q, x) \in \Phi(q, x^-) \quad q \in \mathcal{Q}, x \in \mathbb{R}^n$$



Definition: A **solution** to the hybrid automaton is a pair of right-continuous signals  
 $x : [0, \infty) \rightarrow \mathbb{R}^n$        $q : [0, \infty) \rightarrow \mathcal{Q}$

such that

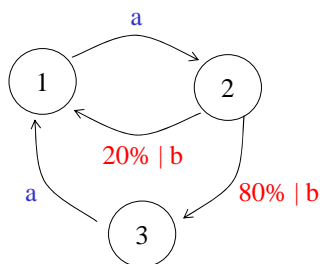
1.  $x$  is piecewise differentiable &  $q$  is piecewise constant

2. on any interval  $(t_1, t_2)$  on which  $q$  is constant and  $x$  continuous

$$x(t) = x(t_1) + \int_{t_1}^t f(q(t_1), x(\tau)) d\tau \quad \forall t \in [t_1, t_2) \quad \text{continuous evolution}$$

3.  $(q(t), x(t)) \in \Phi(q^-(t), x^-(t)) \quad \forall t \geq 0$       discrete transition & resets & domain

## Stochastic finite automaton: controlled Markov chain



controlled Markov chain  $M$

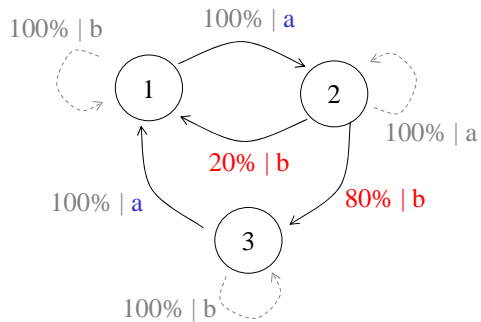
$\mathcal{Q} := \{q_1, q_2, \dots, q_n\}$        $\equiv$  finite set of states  
 $\Sigma := \{a, b, c, \dots\}$        $\equiv$  finite set of input symbols  
 $\Phi : \mathcal{Q} \times \mathcal{Q} \times \Sigma \rightarrow [0, 1]$        $\equiv$  transition probability function

$\Phi(q_1, q_2, s) \equiv$  probability of transitioning to state  $q_2$ , when in state  $q_1$  and symbol  $s$  is selected

By convention, typically

- edges drawn without probabilities correspond to transitions that occur with probability 1
- self-loops may be omitted

## Stochastic finite automaton: controlled Markov chain



- By convention, typically
- edges drawn without probabilities correspond to transitions that occur with probability 1
  - self loops may be omitted

$$Q := \{1, 2, 3\} \quad \Sigma := \{a, b\}$$

$\Phi(q_1, q_2, s) \equiv$  probability of transitioning to state  $q_2$ , when in state  $q_1$  and symbol  $s$  is selected

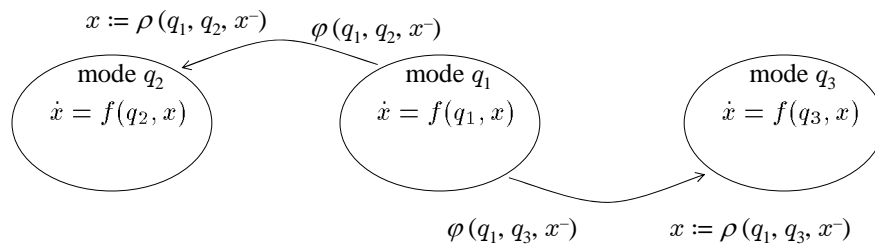
$$\sum_{q_2 \in Q} \Phi(q_1, q_2, s) = 1 \quad \forall q_1 \in Q, s \in \Sigma$$

## Stochastic Hybrid Automaton

$Q$   $\equiv$  set of discrete states  
 $\mathbb{R}^n$   $\equiv$  continuous state-space  
 $f: Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  vector field  
 $\varphi: Q \times Q \times \mathbb{R}^n \rightarrow [0, \infty]$   $\equiv$  discrete transition probability  
 $\rho: Q \times Q \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  reset map (deterministic)

$$\varphi(q_1, q_2, x) = \lim_{dt \downarrow 0} \frac{P(q(t+dt) = q_2 \mid q^-(t) = q_1, x^-(t) = x)}{dt}$$

(Poisson-like model)

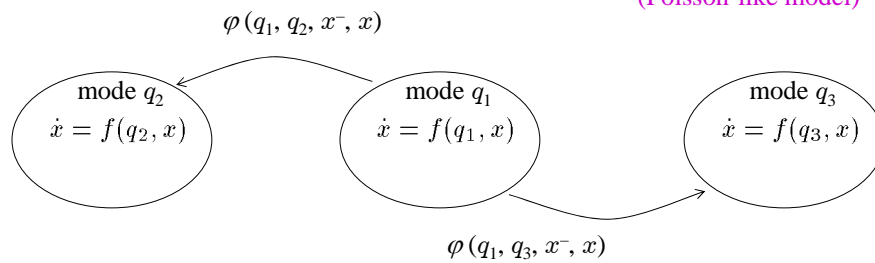


## Stochastic Hybrid Automaton

$\mathcal{Q}$   $\equiv$  set of discrete states  
 $\mathbb{R}^n$   $\equiv$  continuous state-space  
 $f: \mathcal{Q} \times \mathbb{R}^n \rightarrow \mathbb{R}^n$   $\equiv$  vector field  
 $\Phi: \mathcal{Q} \times \mathcal{Q} \times \mathbb{R}^n \times \mathbb{R}^n \rightarrow [0, \infty]$   $\equiv$  discrete transition probability & reset

$$\Phi(q_1, q_2, x_1, x_2) = \lim_{dt \downarrow 0} \frac{P(q(t+dt) = q_2, x(t+dt) = x_2) \mid q^-(t) = q_1, x^-(t) = x_1}{dt}$$

(Poisson-like model)



*More as special topic later...*

## Next class...

1. Trajectories of hybrid systems:
  - Solution to a hybrid system
  - Execution of a hybrid system
2. Degeneracies
  - Finite escape time
  - Chattering
  - Zeno trajectories
  - Non-continuous dependency on initial conditions