



# Switching Protocols for Formal Composition of Low-level Dynamics in Cyber-Physical Systems

Necmiye Ozay
Control and Dynamical Systems, Caltech

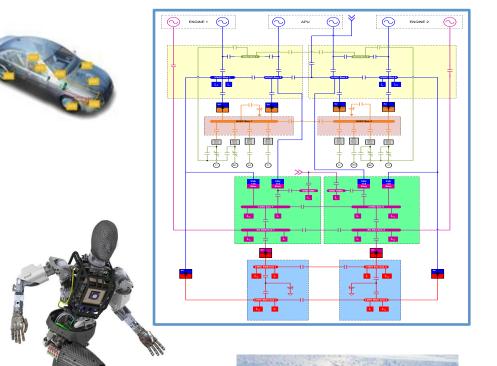
LCCC Workshop on Formal Verification of Embedded
Control Systems
18 April, 2013

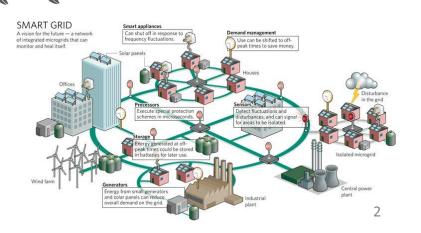
Joint work with: Jun Liu (Sheffield), Ufuk Topcu (UPenn), Pavithra Prabhakar (IMDEA), Richard M. Murray (Caltech), and iCyPhy team.

# Motivation and Applications

- Large-scale, complex, distributed sensing, actuation and control systems:
  - Smart grid, Smart buildings, Aircraft systems, Automotive, Robotics, Manufacturing & Automation, Security & Surveillance
- Designing controllers for complex heterogeneous sensing and control systems is challenging!

Scalable tools for modular control design and verification (theory and software) are lagging!!!





### An Industry Scale Problem: Aircraft Electric Power Systems

### WHAT ARE THE CONTROL/LOGIC SYNTHESIS PROBLEMS?

**Generation:** Continuous controller to regulate the output voltage around a nominal value.

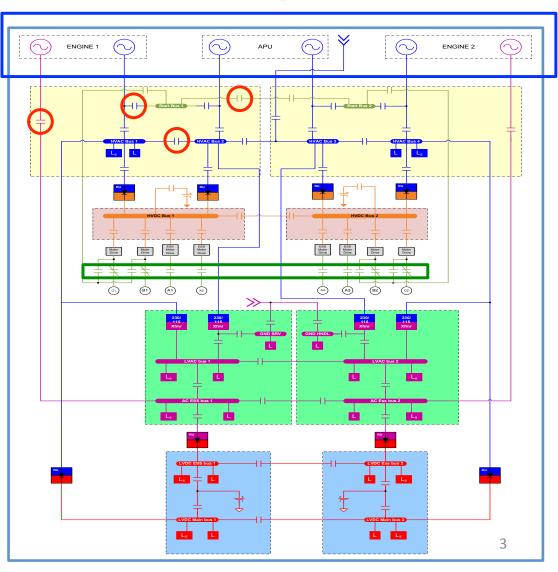
**Distribution:** Logic to reroute the power according to flight phases or fault conditions (Ufuk's talk yesterday).

**Load management:** Logic to shed unimportant loads when failures in generation.

**Fault detection:** Logic to detect faults based on sensor measurements.

Cockpit interaction: Logic to coordinate controllers to accommodate pilot requests.

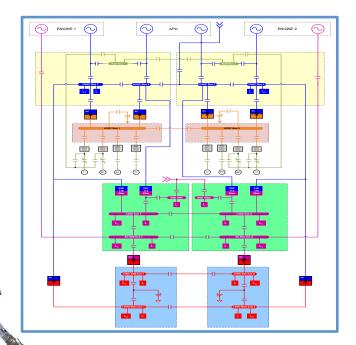
Figure courtesy of Rich Poisson, UTAS. Adapted from Honeywell Patent US 7,439,634 B2



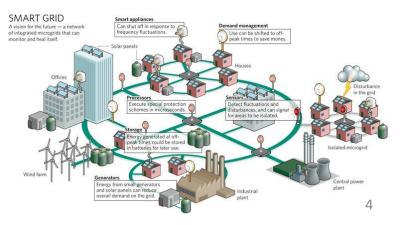
### Motivation

- Current control design process for cyber-physical systems:
  - Given some spec (plain English) use **art of design** (engineering intuition, experience) and extensive testing/fine-tuning to come up with a single solution
  - little or no formal guarantees on correctness
  - no formal insight as to internal mechanisms

**Better alternative:** model-based approach, formal methods for specification, modular design, correct-by-construction embedded controller synthesis







### **Synthesis of Control Protocols**

#### Given

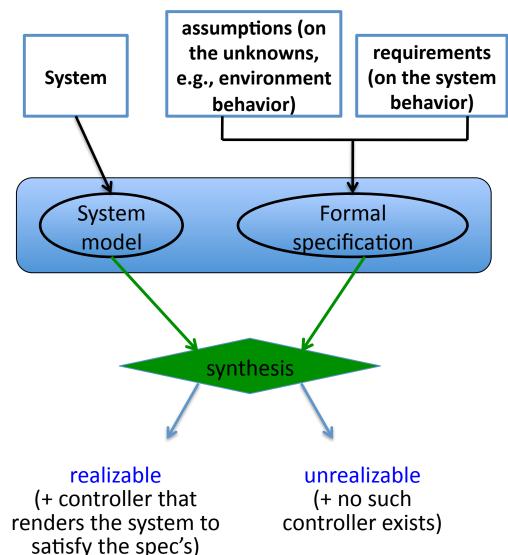
- models for the system and its environment
- specifications for the desired behavior

### how to automatically design control protocols that

- manage the behavior of the system
- respond to changes in
  - internal system state
  - external environment

#### with

"correctness" guarantees?



### **Synthesis of Control Protocols**

#### Given

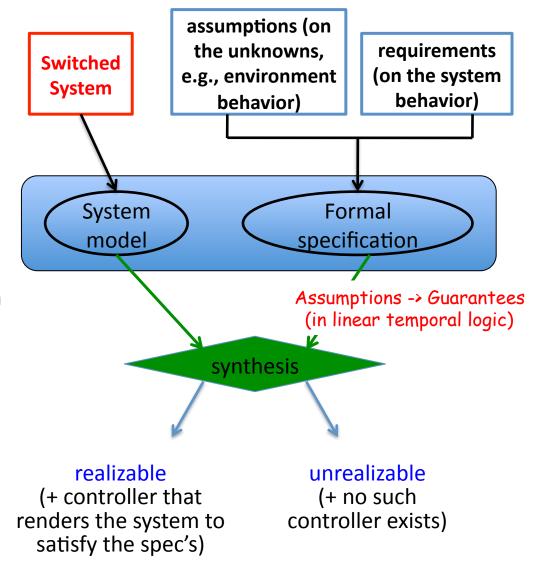
- models for the system and its environment
- specifications for the desired behavior

### how to automatically design control protocols that

- manage the behavior of the system
- respond to changes in
  - internal system state
  - external environment

#### with

``correctness" guarantees?



### An Industry Scale Problem: Aircraft Electric Power Systems

### WHAT ARE THE CONTROL SYNTHESIS PROBLEMS?

**Generation:** Continuous controller to regulate the output voltage around a nominal value.

**Distribution:** Logic to reroute the power according to flight phases or fault conditions.

**Fault detection:** Logic to detect faults based on sensor measurements.

Cockpit interaction: Logic to coordinate controllers to accommodate pilot requests.

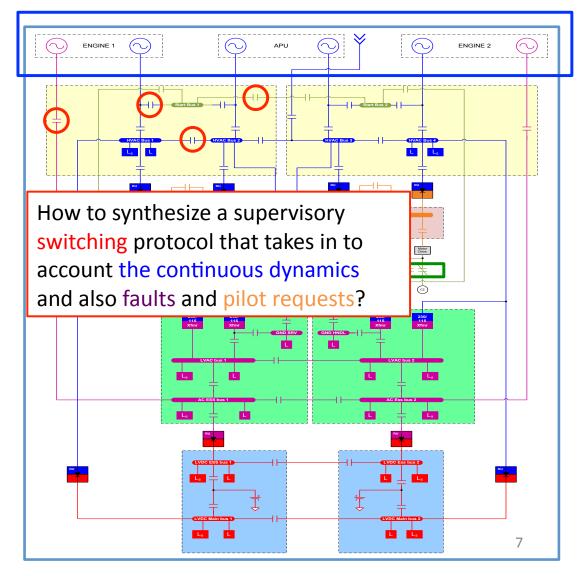


Figure courtesy of Rich Poisson, UTAS. Adapted from Honeywell Patent US 7,439,634 B2

### **Systems of Interest**

#### Switched systems:

$$\dot{x}(t) = f_{\sigma(t)}(x(t), d(t))$$

$$x(t) \in X \subseteq \mathbb{R}^n, \ \forall t$$

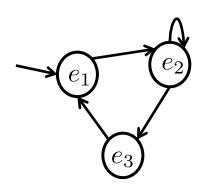
$$x(0) \in X_0 \subseteq X$$

$$d(t) \in D \subseteq \mathbb{R}^n, \ \forall t$$

$$\sigma(t) \in \{1, 2, \dots, N\}, \ \forall t$$

#### **Environment:**

$$e(t) \in \{e_1, e_2, \dots, e_N\}; \forall t$$



Continuous-time discrete-valued signal (with finite variability)

#### WHY SWITCHED SYSTEMS?

- Naturally arise from
- modular design principles (motion primitives; a set of pre-designed feedback controllers, each with different performance criteria) or
- physical components (different configurations of a system due to physical switches or valves)
- Good fit for discrete (logic-based) tools in hand. Also, not easy to deal with using standard cont. control tools.

### **Problem Definition**

#### Switched systems:

$$\dot{x}(t) = f_{\sigma(t)}(x(t), d(t))$$

$$x(t) \in X \subseteq \mathbb{R}^n, \ \forall t$$

$$x(0) \in X_0 \subseteq X$$

$$d(t) \in D \subseteq \mathbb{R}^n, \ \forall t$$

$$\sigma(t) \in \{1, 2, \dots, N\}, \ \forall t$$

### Propositions & observations:

$$\Pi \doteq \{\pi_{init}, \pi_1, \dots, \pi_{n_p}\}$$
 
$$h: X \to 2^{\Pi}$$
 
$$\vdots$$
 Environment: 
$$e(t) \in \{e_1, e_2, \dots, e_N\}; \forall t$$

**Problem Definition:** Given a switched system,

$$S = (X, X_0, \{f_a\}_{a \in A}, \Pi, h)$$

an environment description and some LTL specification ( $\Phi$ ), design a mode signal  $\sigma(x(t),e(t))$  such that the trajectories of the system satisfies the spec for all initial conditions x(0) in a given set and for all disturbances d.

### **Problem Definition**

#### Switched systems:

$$\dot{x}(t) = f_{\sigma(t)}(x(t), d(t))$$

$$x(t) \in X \subseteq \mathbb{R}^n, \ \forall t$$

$$x(0) \in X_0 \subseteq X$$

$$d(t) \in D \subseteq \mathbb{R}^n, \ \forall t$$

$$\sigma(t) \in \{1, 2, \dots, N\}, \ \forall t$$

#### Propositions & observations:

$$\Pi \doteq \{\pi_{init}, \pi_1, \dots, \pi_{n_p}\}$$
 
$$h: X \to 2^{\Pi}$$
 
$$\vdots$$
 
$$Environment: \\ e(t) \in \{e_1, e_2, \dots, e_N\}; \forall t$$
 
$$e$$
 
$$P$$
 
$$A \text{ hybrid game between the mode signal and continuous and discrete adversaries (disturbance and environment, respectively).}$$

**Problem Definition:** Given a switched system,

$$S = (X, X_0, \{f_a\}_{a \in A}, \Pi, h)$$

an environment description and some LTL specification ( $\Phi$ ), design a mode signal  $\sigma(x(t),e(t))$  such that the trajectories of the system satisfies the spec for all initial conditions x(0) in a given set and for all disturbances d.

### **Problem Definition**

#### Switched systems:

$$\dot{x}(t) = f_{\sigma(t)}(x(t), d(t))$$

$$x(t) \in X \subseteq \mathbb{R}^n, \ \forall t$$

$$x(0) \in X_0 \subseteq X$$

$$d(t) \in D \subseteq \mathbb{R}^n, \ \forall t$$

$$\sigma(t) \in \{1, 2, \dots, N\}, \ \forall t$$

#### Propositions & observations:

 $\Pi \doteq \{\pi_{init}, \pi_1, \dots, \pi_{n_p}\}$   $h: X \to 2^{\Pi}$   $e(t) \in \{e_1, e_2, \dots, e_N\}; \forall t$  e P Verification is a special case of this problem when <math>|A|=1.

**Problem Definition:** Given a switched system,

$$S = (X, X_0, \{f_a\}_{a \in A}, \Pi, h)$$

an environment description and some LTL specification ( $\Phi$ ), design a mode signal  $\sigma(x(t),e(t))$  such that the trajectories of the system satisfies the spec for all initial conditions x(0) in a given set and for all disturbances d.

### **Related Work**

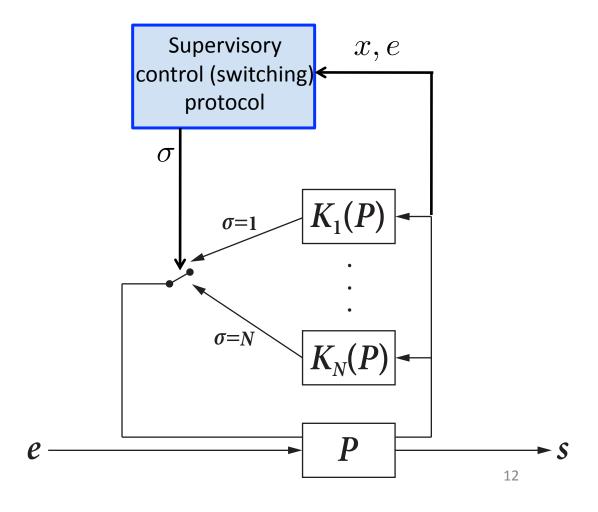
Many references in literature for mostly special cases (different specs, open/close systems, rectangular/linear/nonlinear dynamics, disturbances, etc.)...

#### Direct methods:

Asarin et al. 2000, Ding and Tomlin 2010, Moor and Davoren 2001, Lygeros et al. 2000, Henzinger et al. 1999, Alur et al. 2012...

#### Abstraction based methods:

• Camara et al. 2011, Yordonav et al. 2012, Gol et al. 2012, ...

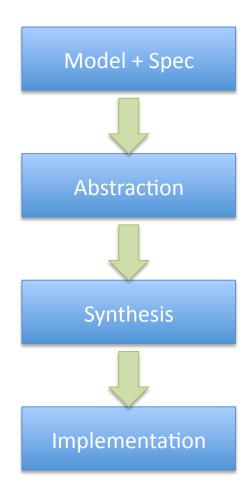


### **Overview of Solution Strategy**

Given

$$\dot{x} = f_{\sigma}(x, d), \ \sigma \in \mathcal{A}, \ \text{and} \ \varphi = \varphi_e \to \varphi_s$$

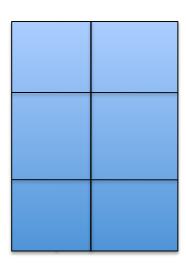
- Compute finite-state proposition preserving approximations
- ullet Solve a discrete synthesis problem and obtain a discrete switching strategy  $\sigma$
- Implement the switching strategy  $\sigma$  continuously to ensure that the all trajectories of the system satisfy  $\varphi$



For now, assume no environment -> it will be easy to incorporate

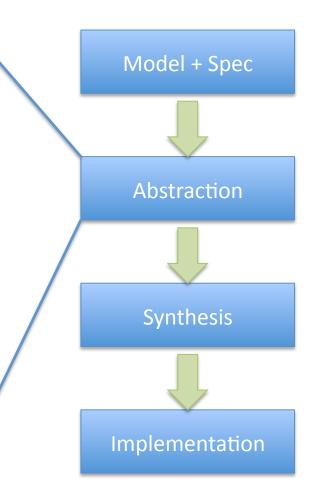
### **Abstraction**

Find a finite transition system that approximates the continuous dynamics

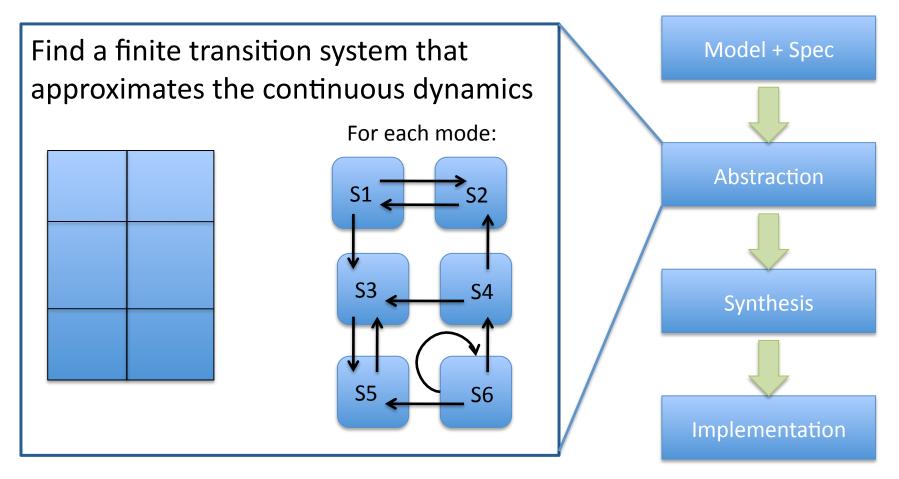


 $T = (Q, Q_0, \mathcal{A}, \rightarrow_T, \Pi, L)$  Q, finite set of states  $Q_0 \subseteq Q$ , set of initial states  $\mathcal{A}$ , finite set of actions  $\rightarrow_T \subseteq Q \times \mathcal{A} \times Q$ , transition relation  $\Pi$ , finite set of propositions

 $L: Q \to 2^{\Pi}$ , labeling function



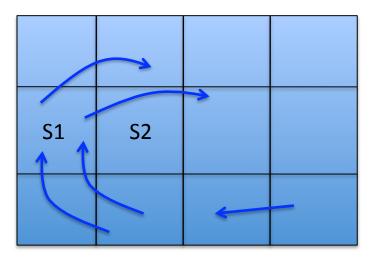
### **Abstraction**

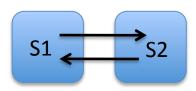


A nondeterministic transition system T that "simulates" the original system

## What is missing in transition systems and simulations?

#### Flow on one mode:





A spurious cycle!

T cannot make any progress!

- Simulation -> matching the transitions (short-term behavior)
- Cannot capture long-term behaviors (e.g. liveness)
- If we want to synthesize controllers for LTL (beyond safety properties), a natural extension is to augment the transition system with liveness properties

$$T = (Q, Q_0, \mathcal{A}, \rightarrow_T, \Pi, L)$$
  
 $Q$ , finite set of states  
 $Q_0 \subseteq Q$ , set of initial states  
 $\mathcal{A}$ , finite set of actions  
 $\rightarrow_T \subseteq Q \times \mathcal{A} \times Q$ , transition  
relation

 $\Pi$ , finite set of propositions  $L: Q \to 2^{\Pi}$ , labeling function

### **Abstraction**

#### Main idea:

#### **Augmented** finite transition systems

$$T_{aug} = (Q, Q_0, \mathcal{A}, \rightarrow_T, \Pi, L, \mathcal{G})$$

Q, finite set of states

 $Q_0 \subseteq Q$ , set of initial states

 $\mathcal{A}$ , finite set of actions

 $\rightarrow_T \subseteq Q \times \mathcal{A} \times Q$ , transition relation

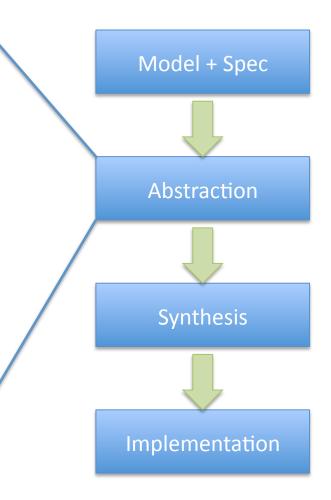
 $\Pi$ , finite set of propositions

 $L: Q \to 2^{\Pi}$ , labeling function

 $\mathcal{G}: \mathcal{A} \to 2^{2^Q}$ , progress group map

Simple extension of just transition systems by Kesten and Pnueli 2000.

- augment the transition systems with justice/weak fairness assumptions



### **Augmented Finite Transition Systems**

#### Main tool:

Augmented finite transition Systems (FTS):

$$T_{aug} = (Q, Q_0, \mathcal{A}, \rightarrow_T, \Pi, L, \mathcal{G})$$

Q, finite set of states

 $Q_0 \subseteq Q$ , set of initial states

 $\mathcal{A}$ , finite set of actions

 $\rightarrow_T \subseteq Q \times \mathcal{A} \times Q$ , transition relation

 $\Pi$ , finite set of propositions

 $L: Q \to 2^{\Pi}$ , labeling function

 $\mathcal{G}: \mathcal{A} \to 2^{2^Q}$ , progress group map

#### What is progress group map?

Given  $a \in \mathcal{A}$ , if a set  $G \subseteq Q$  is such that  $G \in \mathcal{G}(a)$ , then the system cannot remain within G indefinitely using just a. Or, in LTL,  $\mathcal{G}$  imposes:

$$\varphi_g \doteq \bigwedge_{a \in \mathcal{A}} \bigwedge_{G \in \mathcal{G}(a)} \neg \diamond \Box ((\vee_{q \in G} q) \land a)$$

We can define a simulation-like preorder between augmented finite transition systems:

DEFINITION:  $\hat{T}_{aug} \succeq_{\text{A.S.}} T_{aug}$ , if there exists a function  $\beta: Q \to \hat{Q}$  that defines

simulation and for all actions, for all  $\hat{G} \in \hat{\mathcal{G}}(a)$ , there exists  $G \in \mathcal{G}(a)$  such that for all  $\hat{q} \in \hat{G}$ , we have  $\beta^{-1}(\hat{q}) \subset G$ .

### **Augmented Finite Transition Systems**

We can define a simulation-like preorder between augmented finite transition systems:

DEFINITION:  $\hat{T}_{aug} \succeq_{A.S.} T_{aug}$ , if there exists a function  $\beta: Q \to \hat{Q}$  that defines simulation and for all actions, for all  $\hat{G} \in \hat{\mathcal{G}}(a)$ , there exists  $G \in \mathcal{G}(a)$  such that for all  $\hat{q} \in \hat{G}$ , we have  $\beta^{-1}(\hat{q}) \subset G$ .

- $\hat{T}_{aug}$  has more behaviors (due to adversarial uncertainty)
- $T_{aug}$  has more achievable behaviors (enforced by control)

### **Augmented Finite Transition Systems**

#### Main tool:

Augmented finite transition Systems (FTS):

$$T_{aug} = (Q, Q_0, \mathcal{A}, \rightarrow_T, \Pi, L, \mathcal{G})$$

Q, finite set of states

 $Q_0 \subseteq Q$ , set of initial states

 $\mathcal{A}$ , finite set of actions

 $\rightarrow_T \subseteq Q \times \mathcal{A} \times Q$ , transition relation

 $\Pi$ , finite set of propositions

 $L: Q \to 2^{\Pi}$ , labeling function

 $\mathcal{G}: \mathcal{A} \to 2^{2^{Q}}$ , progress group map

#### What is progress group map?

Given  $a \in \mathcal{A}$ , if a set  $G \subseteq Q$  is such that  $G \in \mathcal{G}(a)$ , then the system cannot remain within G indefinitely using just a. Or, in LTL,  $\mathcal{G}$  imposes:

$$\varphi_g \doteq \bigwedge_{a \in \mathcal{A}} \bigwedge_{G \in \mathcal{G}(a)} \neg \diamond \Box ((\vee_{q \in G} q) \land a)$$

Progress group map can capture long-term behaviors of underlying dynamics:

If a set K of the state space is *transient* (i.e., does not contain any invariant sets), then all the discrete states corresponding to a concrete subset of K form a progress group map.

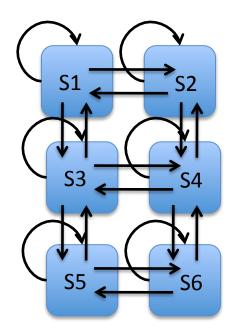
#### Algorithm 1 Abstraction Procedure

```
Input: switched system S = (X, X_0, A, \{f_a\}_{a \in A}, \Pi, h), propo-
       sition preserving partition P = \{\mathcal{P}_i\}_{i=1}^N
Output: augmented finite transition system \mathcal{T} = (Q, Q_0, \mathcal{A}, \rightarrow_{\mathcal{T}})
       \Pi, L, \mathcal{G} such that \mathcal{T} \succeq \mathcal{S}
  1: Let \alpha be the proposition preserving map
  2: Set Q = \{1, ..., N+1\}, Q_0 = \{i : \mathcal{P}_i \subseteq X_0\}, L = h \circ \alpha^{-1}

 Initialize →<sub>T</sub> = (Q \ {N + 1}) × A × Q

  4: for a \in \mathcal{A} do
            \mathcal{G}(a) = \emptyset
  5:
            \rightarrow_T = \rightarrow_T \cup \{(N+1, a, N+1)\}
  6:
            for i \in \{1, ..., N\} do
  7:
                  for j = \{1, ..., N+1\} \setminus \{i\} do
  8:
                        if isBlocked(\alpha^{-1}(i), \alpha^{-1}(j), f_a) then \rightarrow_{\mathcal{T}} = \rightarrow_{\mathcal{T}} \setminus \{(i, a, j)\}
  9:
 10:
                  if isTransient(\alpha^{-1}(i), f_a) then
 11:
                        \mathcal{G}(a) = \mathcal{G}(a) \cup \{\{i\}\}\
 12:
13: return \mathcal{T} = (Q, Q_0, \mathcal{A}, \rightarrow_{\mathcal{T}}, \Pi, L, \mathcal{G})
```

IDEA: start with a "complete" graph: transitions to all neighbors



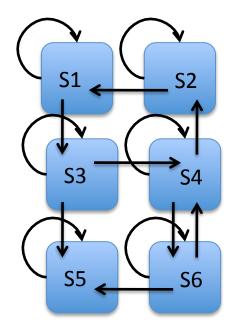
#### Algorithm 1 Abstraction Procedure

```
Input: switched system S = (X, X_0, A, \{f_a\}_{a \in A}, \Pi, h), propo-
       sition preserving partition P = \{\mathcal{P}_i\}_{i=1}^N
Output: augmented finite transition system \mathcal{T} = (Q, Q_0, \mathcal{A}, \rightarrow_{\mathcal{T}}
       \Pi, L, \mathcal{G} such that \mathcal{T} \succeq \mathcal{S}
  1: Let \alpha be the proposition preserving map
  2: Set Q = \{1, ..., N+1\}, Q_0 = \{i : \mathcal{P}_i \subseteq X_0\}, L = h \circ \alpha^{-1}

 Initialize →<sub>T</sub> = (Q \ {N + 1}) × A × Q

  4: for a \in \mathcal{A} do
            \mathcal{G}(a) = \emptyset
  5:
            \rightarrow_T = \rightarrow_T \cup \{(N+1, a, N+1)\}
  6:
            for i \in \{1, ..., N\} do
  7:
                  for j = \{1, ..., N+1\} \setminus \{i\} do
  8:
                        if isBlocked(\alpha^{-1}(i), \alpha^{-1}(j), f_a) then \rightarrow_{\mathcal{T}} = \rightarrow_{\mathcal{T}} \setminus \{(i, a, j)\}
  9:
 10:
                  if isTransient(\alpha^{-1}(i), f_a) then
 11:
                        \mathcal{G}(a) = \mathcal{G}(a) \cup \{\{i\}\}\
 12:
13: return \mathcal{T} = (Q, Q_0, \mathcal{A}, \rightarrow_{\mathcal{T}}, \Pi, L, \mathcal{G})
```

isBlocked: Yes, if we can verify that there exists no flow from one cell to the other.



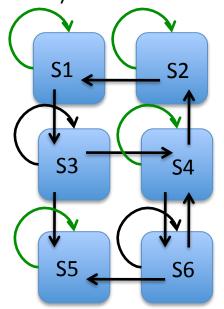
#### Algorithm 1 Abstraction Procedure

```
Input: switched system S = (X, X_0, A, \{f_a\}_{a \in A}, \Pi, h), propo-
       sition preserving partition P = \{\mathcal{P}_i\}_{i=1}^N
Output: augmented finite transition system T = (Q, Q_0, A, \rightarrow_T)
       \Pi, L, \mathcal{G} such that \mathcal{T} \succeq \mathcal{S}
  1: Let \alpha be the proposition preserving map
  2: Set Q = \{1, ..., N+1\}, Q_0 = \{i : \mathcal{P}_i \subseteq X_0\}, L = h \circ \alpha^{-1}

 Initialize →<sub>T</sub> = (Q \ {N + 1}) × A × Q

  4: for a \in \mathcal{A} do
            \mathcal{G}(a) = \emptyset
  5:
            \rightarrow_T = \rightarrow_T \cup \{(N+1, a, N+1)\}
  6:
            for i \in \{1, ..., N\} do
  7:
                  for j = \{1, ..., N+1\} \setminus \{i\} do
  8:
                       if isBlocked(\alpha^{-1}(i), \alpha^{-1}(j), f_a) then \rightarrow_{\mathcal{T}} = \rightarrow_{\mathcal{T}} \setminus \{(i, a, j)\}
  9:
 10:
                  if isTransient(\alpha^{-1}(i), f_a) then
 11:
                       \mathcal{G}(a) = \mathcal{G}(a) \cup \{\{i\}\}\
 12:
13: return \mathcal{T} = (Q, Q_0, \mathcal{A}, \rightarrow_{\mathcal{T}}, \Pi, L, \mathcal{G})
```

isTransient: Yes, if we can verify that a cell contains no invariant sets (i.e., all trajectories eventually leave).



#### isTransient: Yes, if we can Algorithm 1 Abstraction Procedure verify that a cell contains **Input:** switched system $S = (X, X_0, A, \{f_a\}_{a \in A}, \Pi, h)$ , proposition preserving partition $P = \{P_i\}_{i=1}^N$ no invariant sets (i.e., all trajectories eventually **Output:** augmented finite transition system $T = (Q, Q_0, A, \rightarrow_T$ leave). $,\Pi,L,\mathcal{G})$ such that $\mathcal{T}\succeq\mathcal{S}$ 1: Let $\alpha$ be the proposition preserving map 2: Set $Q = \{A \text{ set } Y \text{ is transient on a mode } a \text{ of a switched system } S, \}$ 2: Set Q =**S2** if there exists a $\mathcal{C}^1$ function $B:\mathbb{R}^n\to\mathbb{R}$ such that Initialize 4: for $a \in \mathcal{A}$ $\dot{B}(\xi) = \frac{\partial B(\xi)}{\partial \xi} f_a(\xi) \le -\varepsilon, \quad \forall \xi \in Y$ $\mathcal{G}(a)$ 5: 6: 7: for $i \in$ for some $\varepsilon > 0$ . 8: for if $isBlocked(\alpha^{-1}(i), \alpha^{-1}(j), f_a)$ then 9: $\rightarrow_T = \rightarrow_T \setminus \{(i, a, j)\}$ 10: if $isTransient(\alpha^{-1}(i), f_a)$ then 11: $\mathcal{G}(a) = \mathcal{G}(a) \cup \{\{i\}\}\$ 12: 13: **return** $\mathcal{T} = (Q, Q_0, \mathcal{A}, \rightarrow_{\mathcal{T}}, \Pi, L, \mathcal{G})$

#### Algorithm 1 Abstraction Procedure

```
Input: switched system S = (X, X_0, A, \{f_a\}_{a \in A}, \Pi, h), proposition preserving partition P = \{P_i\}_{i=1}^N
Output: augmented finite transition system T = (Q, Q_0, A, \rightarrow_T)
        ,\Pi,L,\mathcal{G}) such that \mathcal{T}\succeq\mathcal{S}
  1: Let \alpha be the proposition preserving map
  2: Set Q = \{1, ..., N+1\}, Q_0 = \{i : \mathcal{P}_i \subseteq X_0\}, L = h \circ \alpha^{-1}
  3: Initialize \rightarrow_{\mathcal{T}} = (Q \setminus \{N+1\}) \times \mathcal{A} \times Q
  4: for a \in \mathcal{A} do
             \mathcal{G}(a) = \emptyset
  5:
             \rightarrow_T = \rightarrow_T \cup \{(N+1, a, N+1)\}
  6:
             for i \in \{1, ..., N\} do
  7:
                    for j = \{1, ..., N+1\} \setminus \{i\} do
  8:
                          if isBlocked(\alpha^{-1}(i), \alpha^{-1}(j), f_a) then \rightarrow_{\mathcal{T}} = \rightarrow_{\mathcal{T}} \setminus \{(i, a, j)\}
  9:
 10:
                    if isTransient(\alpha^{-1}(i), f_a) then
 11:
                          \mathcal{G}(a) = \mathcal{G}(a) \cup \{\{i\}\}\
 12:
 13: return \mathcal{T} = (Q, Q_0, \mathcal{A}, \rightarrow_{\mathcal{T}}, \Pi, L, \mathcal{G})
```

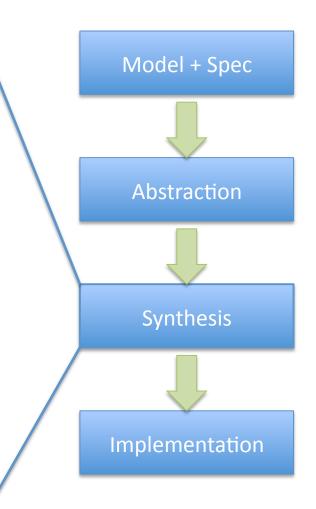
- isBlocked and isTransient can be efficiently computed for linear dynamics
- Computable via polynomial algebra and quantifier elimination for polynomial dynamics
- "Efficiently"
  computable for
  polynomial dynamics by
  using convex relaxations
  and semidefinite
  programming

### **Synthesis**

Two player discrete game between the abstract states of the low level dynamic modes and the switching controller (Pnueli, Ramadge & Wonham).

#### Output:

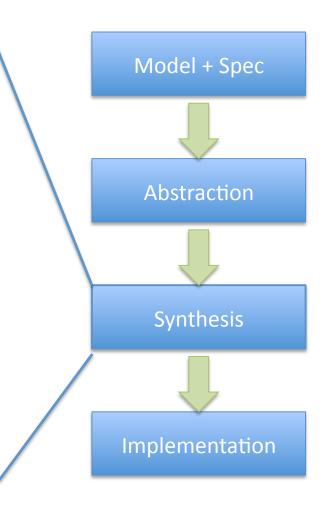
- If realizable -> control automaton
- If not
  - partial controller and suggestion for refinement
  - impossibility certificate



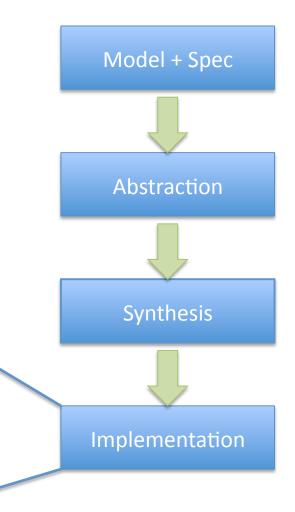
### Synthesis (runtime reactiveness)

Two player discrete game between the abstract states of the abstracted nondeterministic dynamics and external environment (just define an asynchronous products of T and E) and the switching controller Output:

- Output.
- If realizable -> control automaton
- If not
  - partial controller and suggestion for refinement
  - impossibility certificate



### **Implementation**

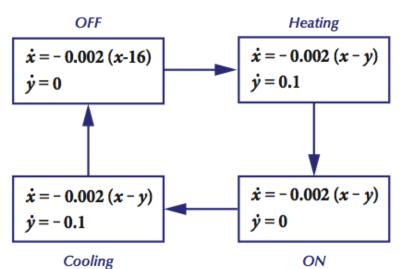


Given the automaton, make sure they can be implemented:

- Need to be careful about Zenoness

### **Example: Heater**

#### A four-mode thermostat:



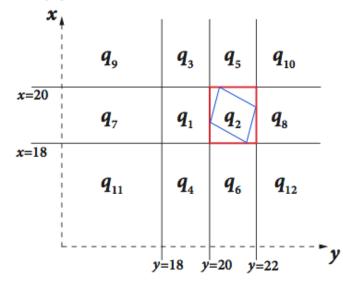
x: room temperature
y: heater temperature
mode: {off, on, heating, cooling}

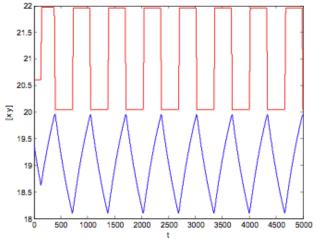
#### Specification

Design a switching sequence such that

PI 
$$\diamondsuit$$
(18  $\leq x \leq$  20  $\land$  20  $\leq y \leq$  22)

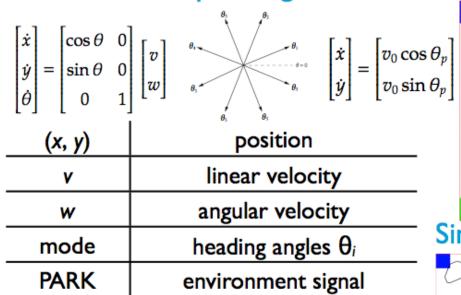
#### Over-approximation





### **Example: Motion Planning**

#### 2d robot motion planning:



#### Specification

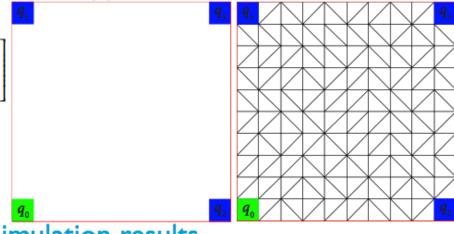
Design a switching sequence such that

PI 
$$\Box \Diamond q_1 \land \Box \Diamond q_2 \land \Box \Diamond q_3$$

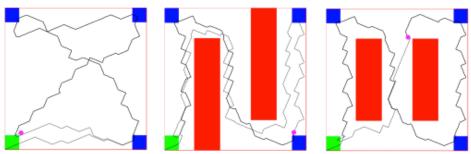
P2 
$$\Box$$
 (PARK  $\rightarrow \Diamond q_0$ )

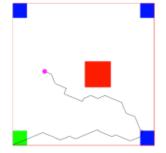
while avoiding static and moving obstacles.

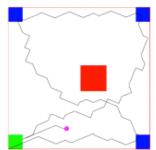
#### Over-approximation

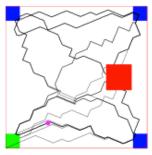


#### Simulation results



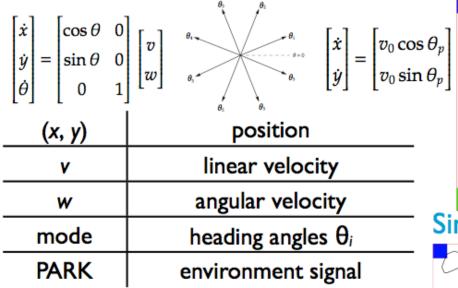






### **Example: Motion Planning**

#### 2d robot motion planning:



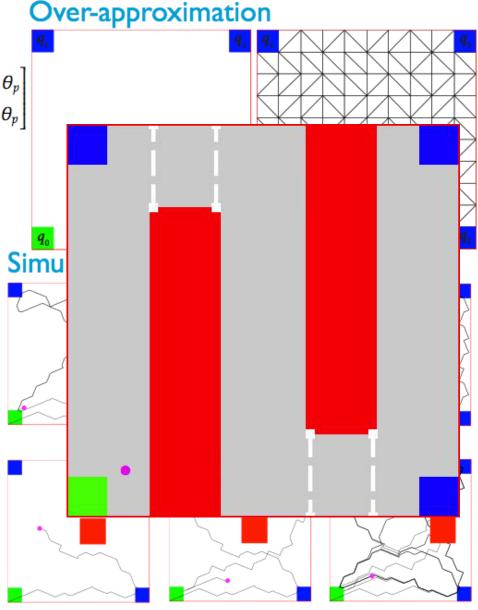
#### Specification

Design a switching sequence such that

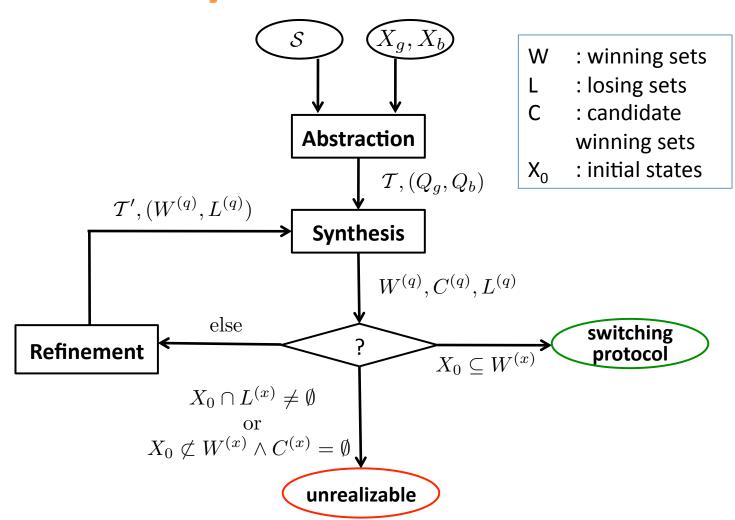
PI 
$$\Box \Diamond q_1 \land \Box \Diamond q_2 \land \Box \Diamond q_3$$

P2  $\Box$  (PARK  $\rightarrow \Diamond q_0$ )

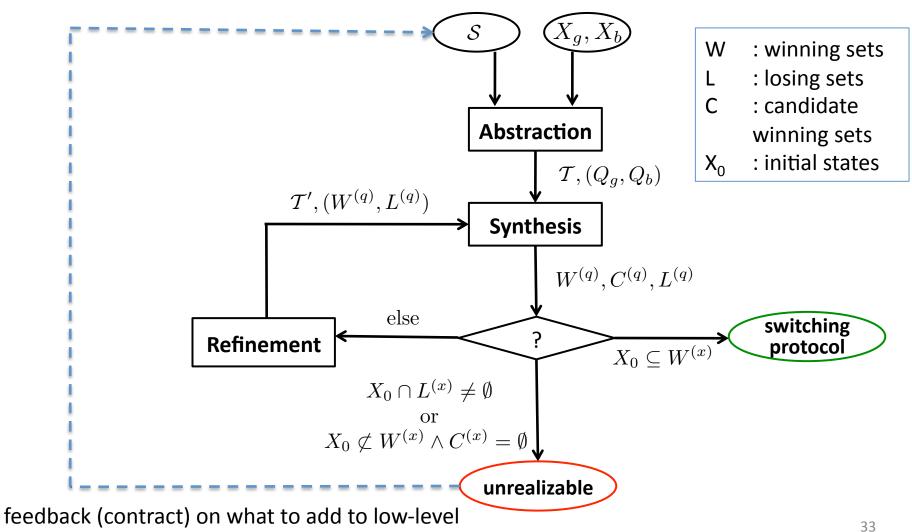
while avoiding static and moving obstacles and pedestrians.



# Ongoing work: Extended CEGAR for Synthesis



### **Ongoing work: Extended CEGAR for Synthesis**



### Summary

- Switching protocol synthesis:
  - A novel abstract model by augmented finite transition systems (more achievable behavior with same sized abstractions)
  - Efficient computation of abstraction and refinements
- Current & Future work:
  - CEGAR (initial results -> abstractions driven by specs -> for scalability)
  - Send feedback to the low-level control designers in case of impossibility
  - Incorporate implementation uncertainties, allow digital implementations
  - Beyond LTL? Hard-time constraints.
  - Feedback on spec's -> analyzing potential reasons of unrealizability (e.g. Bloem et al.)

### Questions?

- Thanks to:
  - Organizers
  - Collaborators: Jun Liu (Sheffield), Richard M.
     Murray (Caltech), Ufuk Topcu (Penn), Pavithra
     Prabhakar (IMDEA)
  - Funding: IBM and UTC through iCyPhy consortium
  - Audience ☺