

# Controller Synthesis for Data Center



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 FL12-11-1  
 22<sup>th</sup>, Oct, 2012



## Background

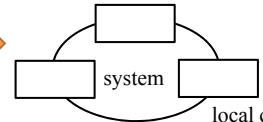
### Control Systems

- aerospace
  - automotive industry
  - advanced robotic systems
- } control objective

stabilization  
 output regulation



regulate global behavior



formally specify the desired system behavior

### Specifications

- coordination and synchronization of individual modules
- sequencing of tasks
- reconfigurability and adaptability of components



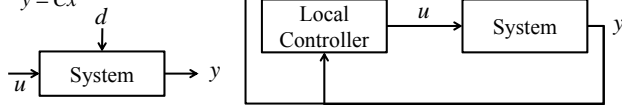
## Background

### Hierarchical Approach

System

$$\dot{x} = Ax + Bu + Ed$$

$$y = Cx$$



Discrete Planner: generates control signals to the system to ensure that the system satisfies specifications

### Synthesis

synthesizing a discrete planner that computes a discrete plan satisfying the specification based on the abstract, finite-state model of the system



## Introduction

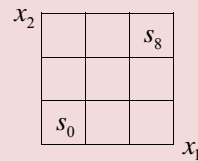
### Control with Temporal Logic

#### System Model

- State(discrete, continuous)
- dynamics

#### Proposition

Proposition  $s_i$  on partition



#### Specification

Initial State, Stability  
 Convergence, Safety  
 Sequence, Coverage

Linear Temporal Logic

Proposition  
 State(discrete)

Operator  $\neg, \wedge, \vee, \rightarrow,$

$\square, \diamond, next, until$

TuLiP[5] • Check Realizability  
 • Compute Strategy



## Problem

### System Model(Linear Time Invariant System)

$$x(k+1) = Ax(k) + Bu(k) + Ed(k) \quad \text{Initial } x(0) \in X$$

Input  $u(k) \in U$

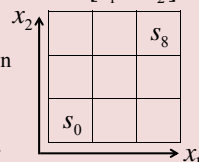
ex.  $x := [x_1 \ x_2]^T$

Disturbance  $d(k) \in D$

Proposition • continuous state  
 • discrete state

$\Rightarrow s_i(k) \in \text{boolean}$

$$s(k) := s_0(k)s_1(k)s_2(k)\dots$$



### Specification

Initial State  
 Desired Behavior  
 Assumption

Specification(LTL)

$\Phi$

Proposition  $s$

Operator

$(\neg, \wedge, \vee, \rightarrow,$   
 $\square, \diamond, next, until)$

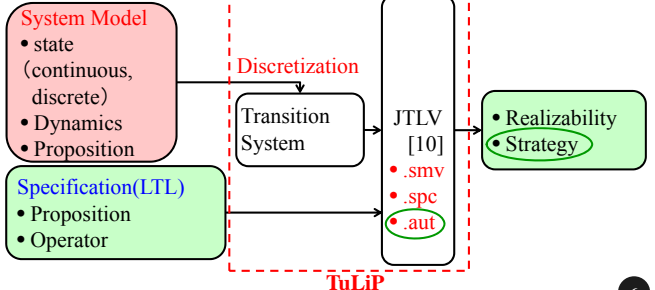


## TuLiP

### Temporal Logic Planning (TuLiP) Toolbox

collection of Python-based code for automatic synthesis of correct-by-construction embedded control software

### Synthesis Procedure





- Control(No Disturbance)
- Control(Disturbance)



### Example

#### System Model

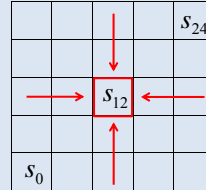
$$x(k+1) = \begin{bmatrix} 1.0 & 0 \\ 0 & 1.0 \end{bmatrix} x(k) + \begin{bmatrix} 1.0 & 0 \\ 0 & 1.0 \end{bmatrix} u(k)$$

$$x = \begin{bmatrix} x_1 & x_2 \end{bmatrix}^T$$

$$\begin{aligned} -5 < x_1(k) < 5 \\ -5 < x_2(k) < 5 \end{aligned}$$

Input  $-0.4 < u(k) < 0.4$  Disturbance  $d(k) = 0$

#### Specification

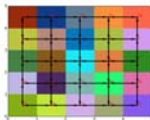


move and stay in  $s_{12} \diamond \square s_{12}$



### Transition System

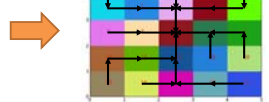
Transition System  
Transition System from System Dynamics



#### Strategy



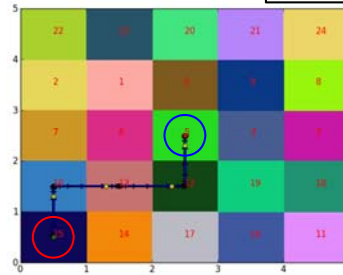
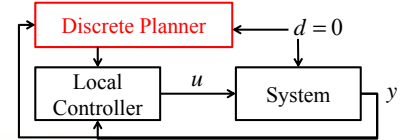
Strategy compute next state based on current state



### Simulation

#### Simulation

Initial State: 15, Goal : 5



Strategy calculate next state

Input feedback control input from current state to next state

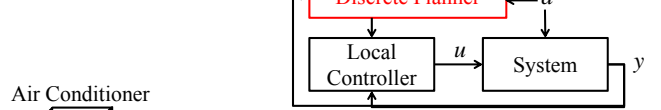


- Control(No Disturbance)
- Control(Disturbance)

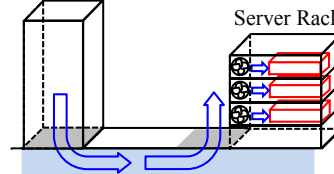


### Data Center Cooling

#### Data Center



#### Air Conditioner



$u$ : Air Conditioner temperature  
 $y$ : Rack Temperature  
 $d$ : CPU heat in Rack

#### Temperature Control Dynamics[11][12]

$$u \longrightarrow \frac{K}{Ts + 1} \longrightarrow y$$



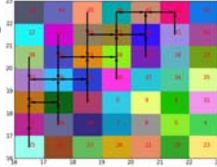
### Problem(Disturbance)

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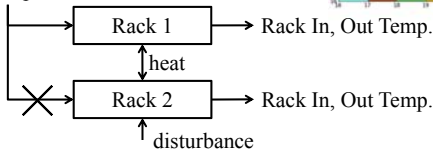
#### Discretization under Disturbance

$$\begin{bmatrix} \dot{x}_1 \\ \dot{x}_2 \end{bmatrix} = \begin{bmatrix} -0.005 & 0.001 \\ 0.01 & -0.01 \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} + \begin{bmatrix} 0.004 \\ 0 \end{bmatrix} u + \begin{bmatrix} 0 \\ 1 \end{bmatrix} d \quad d = 0, 0.005, 0.01$$

discretize(sampling time 250s)



CRAC Temperature



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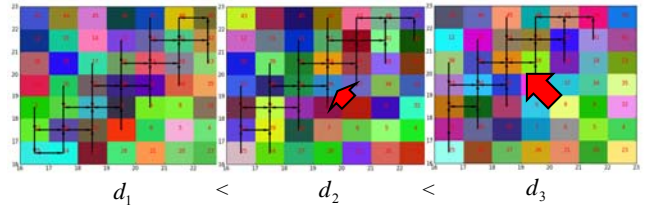
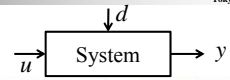
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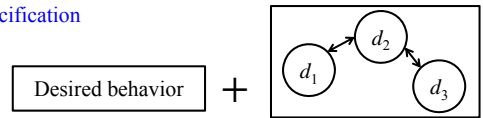
### Problem(Disturbance)

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#### Discretization under Disturbance



Specification



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### Two Rack System

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#### Two Rack System

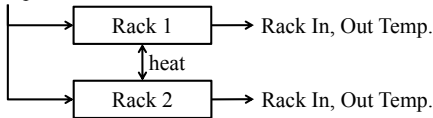
$$\begin{bmatrix} \dot{x}_1 \\ \dot{x}_2 \end{bmatrix} = \begin{bmatrix} -\frac{1}{1210} & 0.001 \\ 0.001 & -\frac{1}{690} \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \end{bmatrix} + \begin{bmatrix} 5.7 \\ 5.86 \\ 690 \end{bmatrix} u \quad \begin{matrix} 0 < x < 7 \\ -3 < u < 10 \end{matrix}$$

$$\begin{matrix} 3 < x_1 < 4 \\ 3 < x_2 < 4 \end{matrix}$$

discretize(sampling time 250s)

$$\begin{bmatrix} x_1(k+1) \\ x_2(k+1) \end{bmatrix} = \begin{bmatrix} 0.8376 & 0.1903 \\ 0.1903 & 0.7191 \end{bmatrix} \begin{bmatrix} x_1(k) \\ x_2(k) \end{bmatrix} + \begin{bmatrix} 1.295 \\ 1.921 \end{bmatrix} u$$

CRAC Temperature



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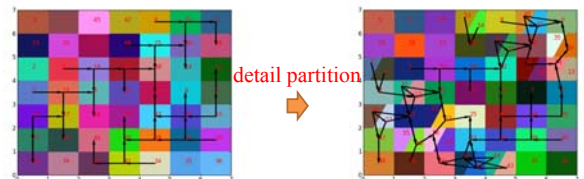
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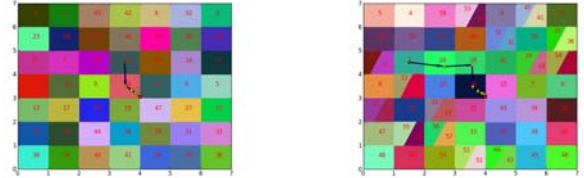
### Two Rack System

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#### Transition System(Two Rack System) 1step(k→k+1)



Simulation



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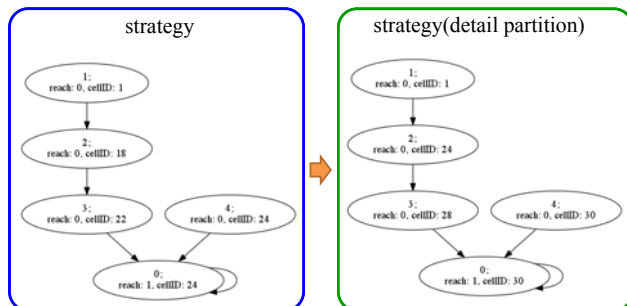
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### Two Rack System

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#### Control Strategy 1step(k→k+1)



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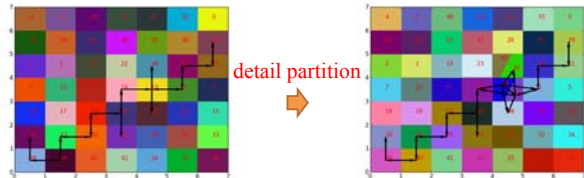
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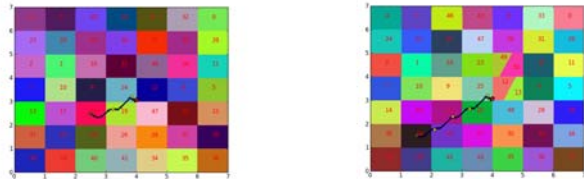
### Two Rack System

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#### Transition System(Two Rack System) 5step(k→k+5)



Simulation



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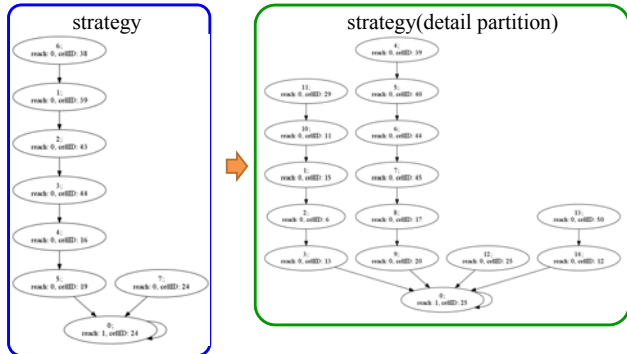
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## Two Rack System

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Control Strategy 5step( $k \rightarrow k+5$ )



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## Summary

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### Summary

- Test TuLiP function
- Data Center Model
- Controller Synthesis Problem(under disturbance model)

### Future Work

- Survey Discretization
- Data Center Controller Synthesis Problem

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