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# **Supervisory Control: Advanced Theory and Applications**

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# Course Grading Scheme and References

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- Two Assignments (10% each)
- Final Exam (80%)
- Major reference books
  - W. M. Wonham. Supervisory Control of Discrete-Event Systems}. Systems Control Group, Dept. of ECE, University of Toronto. URL: [www.control.utoronto.ca/DES](http://www.control.utoronto.ca/DES).
  - John E. Hopcroft and Jeffrey D. Ullman. Introduction to Automata Theory, Languages, and Computation, Addison-Wesley Publishing, Reading Massachusetts, 1979. ISBN 0-201-02988-X. Chapter 2: Finite Automata and Regular Expressions.

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# **Introduction to Supervisory Control Theory**

# Outline

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- Introduction to Supervisory Control
- Ramadge-Wonham Supervisory Control Theory
- Example – A Pusher-Lift System
- Primary Goals of EE6226

# The Concept of Discrete Event Systems (DES)

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- A DES is a structure with ‘states’ having duration in time, ‘events’ happening *instantaneously* and *asynchronously*.
  - States: e.g. machine is idle, is operating, is broken down, is under repair
  - Events: e.g. machine starts work, breaks down, completes work or repair
- State space **discrete** in time and space.
- State **transitions** ‘labeled’ by events.

# The Motivation of Developing Supervisory Control Theory (SCT) for DES (till 1980)

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- Control problems *implicit* in the literature (enforcement of resource constraints, synchronization, ...)

*But*

- Emphasis on modeling, simulation, verification
- Little formalization of control **synthesis**
- Absence of control-theoretic ideas
- No standard model or approach to control

# Related Areas

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- Programming languages for modeling & simulation
- Queues, Markov chains
- Petri nets
- Boolean models
- Formal languages
- Process algebras (CSP, CCS)

# “Great” Expectations for SCT

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- System model
  - Discrete in time and (usually) space
  - Asynchronous (event-driven)
  - Nondeterministic
    - support transitional choices
- Amenable to formal control synthesis
  - exploit control concepts
- Applicable: manufacturing, traffic, logistic,...



# Relationship with Systems Control Concepts

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- State space framework well-established:
  - Controllability
  - Observability
  - Optimality (Quadratic,  $H_\infty$ )
- Use of geometric constructs and partial order
  - Controllability subspaces
    - Supremal subspaces!

# Ramadge-Wonham SCT (1982)

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- Automaton representation
  - state descriptions for concrete modeling and computation
- Language representation
  - i/o descriptions for implementation-independent concept formulation
- Simple control “technology”

# Outline

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- Introduction to Supervisory Control
- Ramadge-Wonham Supervisory Control Theory
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RW paradigm is based on *languages*, but implemented on *finite-state automata*

# Basic Concepts of Languages

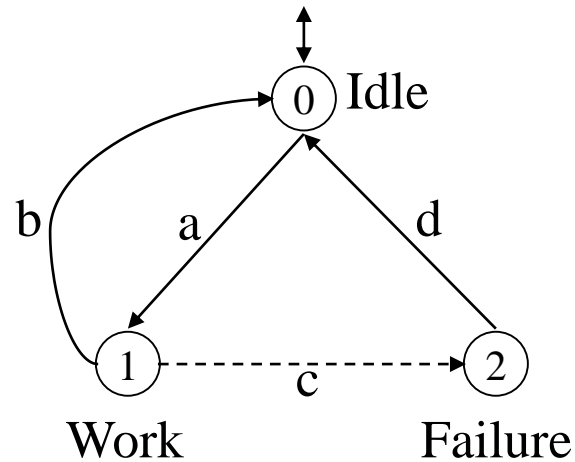
- Given an alphabet  $\Sigma$  (e.g.  $\Sigma = \{ a , b , c , d \}$ )
  - A string is a finite sequence of events from  $\Sigma$ , e.g.  $s = ababa$
  - $\Sigma^+ := \{ \text{all strings generated from } \Sigma \}$ ,  $\Sigma^* := \Sigma^+ \cup \{ \varepsilon \}$ 
    - $\varepsilon$  is called the *empty* string:  $s\varepsilon = \varepsilon s = s$
  - Given  $s_1, s_2 \in \Sigma^*$ ,  $s_1$  is a *prefix* substring of  $s_2$ , if  $(\exists t \in \Sigma^*) s_1 t = s_2$ 
    - We use  $s_1 \leq s_2$  to denote that  $s_1$  is a prefix substring of  $s_2$
  - A language  $W \subseteq \Sigma^*$  : most time we require  $W$  to be *regular*
  - The *prefix closure* of a language  $W$  is :  $\overline{W} := \{ s \in \Sigma^* \mid (\exists s' \in W) s \leq s' \}$ 
    - $W$  is *prefix closed* if  $W = \overline{W}$

# Finite-State Automaton (FSA)

- A finite-state automaton is a 5-tuple  $G = (X, \Sigma, \xi, x_0, X_m)$ , where
  - $X$  : the state set
  - $\Sigma$  : the alphabet
  - $x_0$  : the initial state
  - $X_m$  : the marker state set (or the final state set)
  - $\xi : X \times \Sigma \rightarrow X$  : the transition map
    - $\xi$  is called a *partial* map, if it is not defined at some pair  $(x, \sigma) \in X \times \Sigma$ .
    - Otherwise, it is called a *total* map.
    - Extension of the transition map:  $\xi : X \times \Sigma^* \rightarrow X : (x, s\sigma) \mapsto \xi(x, s\sigma) := \xi(\xi(x, s), \sigma)$

# The Famous “Small Machine” Model

- $G = (X, \Sigma, \xi, x_0, X_m)$ 
  - $X = \{0, 1, 2\}$
  - $\Sigma = \{a, b, c, d\}$
  - $x_0 = 0$
  - $X_m = \{0\}$



a : starts work  
b : finishes work  
c : machine fails  
d : machine is repaired

# Connection between Language and FSA

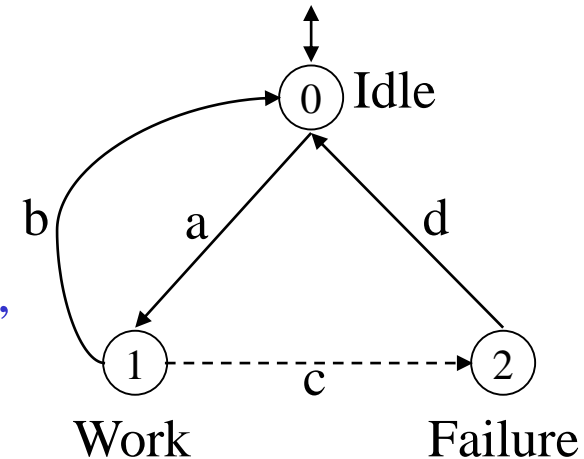
- Give a FSA  $G = (X, \Sigma, \xi, x_0, X_m)$ ,

- *closed* behavior of  $G$ :

$$L(G) := \{s \in \Sigma^* \mid \xi(x_0, s) \text{ is defined}\}$$

- *marked* behavior of  $G$ , i.e. the language *recognized* by  $G$ ,

$$L_m(G) := \{s \in L(G) \mid \xi(x_0, s) \in X_m\}$$



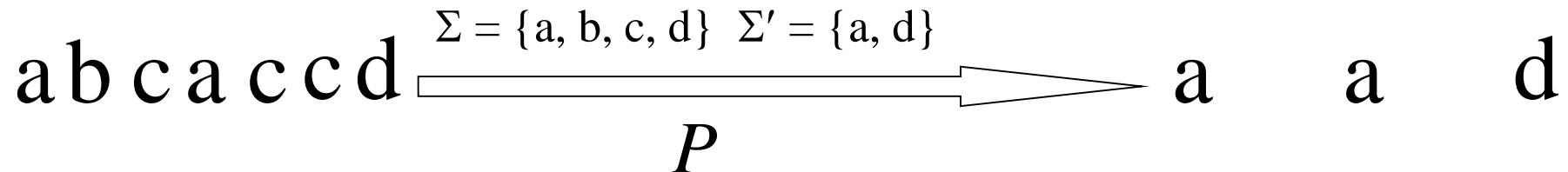
- $G$  is *nonblocking*, if  $\overline{L_m(G)} = L(G)$ .
- A language is *regular*, if it is recognizable by a FSA.
  - We can use Arden's rule to derive a language from a FSA.



# Natural Projection over Languages

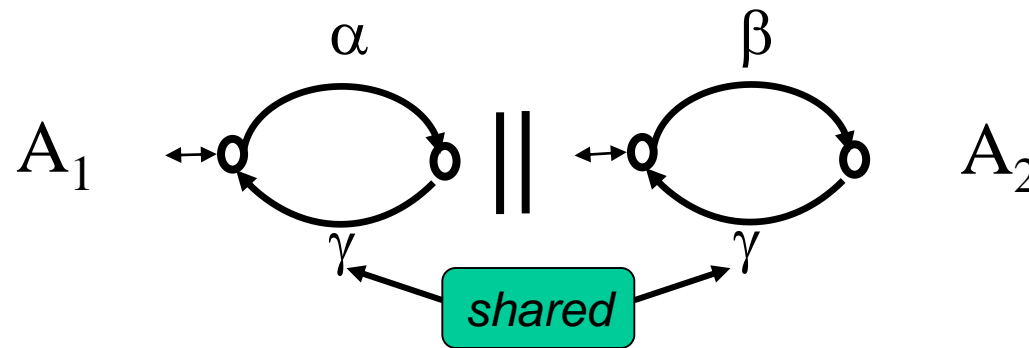
- Given  $\Sigma$  and  $\Sigma' \subseteq \Sigma$ ,  $P: \Sigma^* \rightarrow \Sigma'^*$  is a *natural projection* if
  - $P(\varepsilon) = \varepsilon$
  - $(\forall \sigma \in \Sigma) P(\sigma) = \begin{cases} \sigma & \text{if } \sigma \in \Sigma' \\ \varepsilon & \text{if } \sigma \notin \Sigma' \end{cases}$
  - $(\forall s \sigma \in \Sigma^*) P(s \sigma) = P(s)P(\sigma)$
- The inverse image map of  $P$  is  $P^{-1} : \text{pwr}(\Sigma'^*) \rightarrow \text{pwr}(\Sigma^*)$  with

$$(\forall A \subseteq \Sigma'^*) P^{-1}(A) := \{s \in \Sigma^* \mid P(s) \in A\}$$



# Synchronous Product over Languages

- Builds a more complex automaton



- with more complex language

$L_m(A_1) \parallel L_m(A_2) = P_1^{-1}(L_m(A_1)) \cap P_2^{-1}(L_m(A_2))$   
expressed by **natural projections**

$$P_i: (\Sigma_1 \cup \Sigma_2)^* \rightarrow \Sigma_i^* \quad (i = 1, 2)$$

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The synchronous product is *commutative* and *associative* !

# Implement Synchronous Product by Automaton Operation

- Let  $G_1 = (X_1, \Sigma_1, \xi_1, x_{0,1}, X_{m,1})$  and  $G_2 = (X_2, \Sigma_2, \xi_2, x_{0,2}, X_{m,2})$ ,

- Let

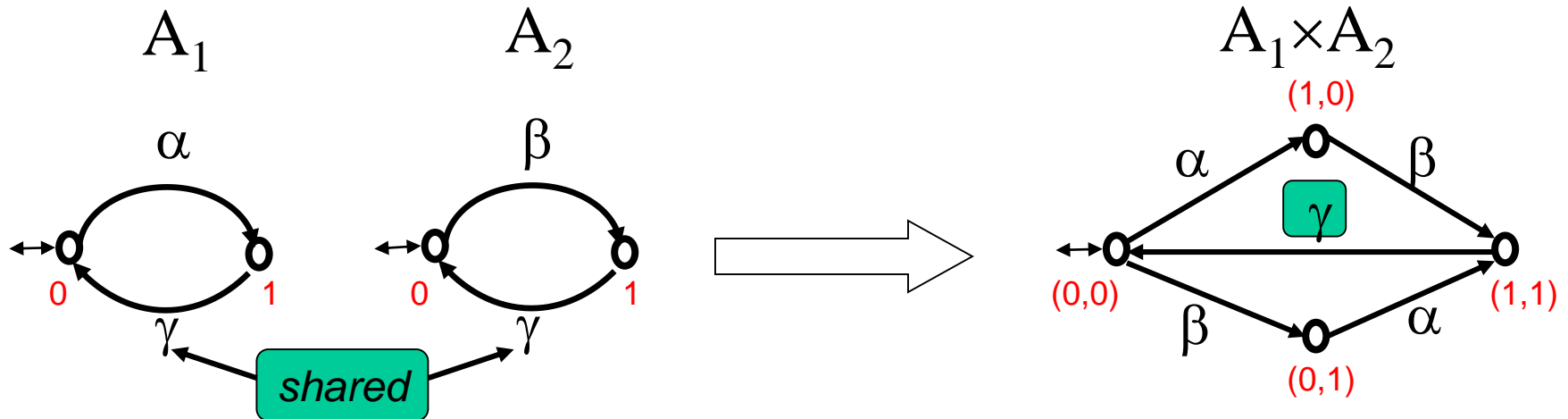
$$G_1 \times G_2 = (X_1 \times X_2, \Sigma_1 \cup \Sigma_2, \xi_1 \times \xi_2, (x_{0,1}, x_{0,2}), X_{m,1} \times X_{m,2})$$

where

$$\xi_1 \times \xi_2((x_1, x_2), \sigma) := \begin{cases} (\xi_1(x_1, \sigma), x_2) & \text{if } \sigma \in \Sigma_1 - \Sigma_2 \\ (x_1, \xi_2(x_2, \sigma)) & \text{if } \sigma \in \Sigma_2 - \Sigma_1 \\ (\xi_1(x_1, \sigma), \xi_2(x_2, \sigma)) & \text{if } \sigma \in \Sigma_1 \cap \Sigma_2 \end{cases}$$

- Result:
  - $L(G_1) \parallel L(G_2) = L(G_1 \times G_2)$
  - $L_m(G_1) \parallel L_m(G_2) = L_m(G_1 \times G_2)$

# For Example



Automaton product implements synchronous product!

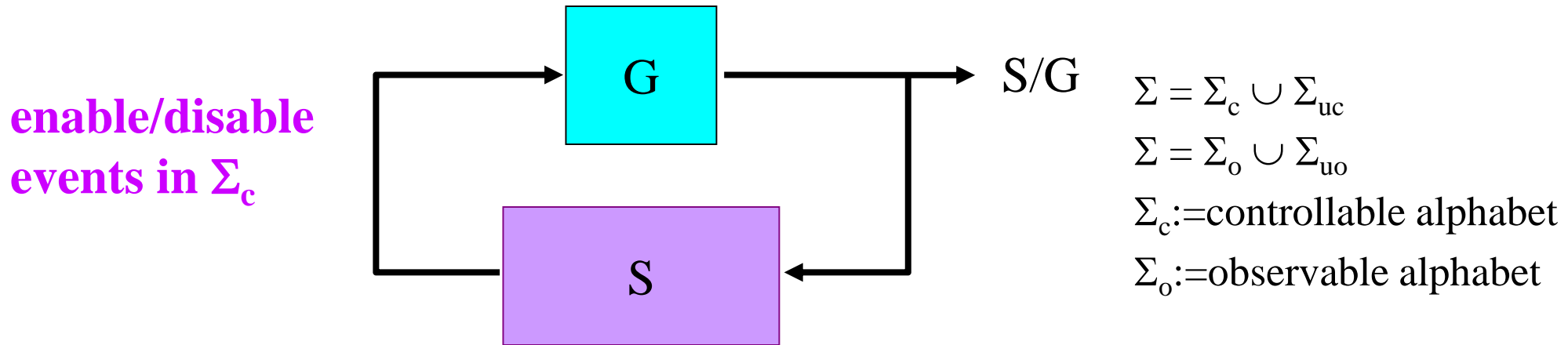
# Properties of Projection and Synchronous Product

- **[Chain Rule]** Given  $\Sigma_1, \Sigma_2$  and  $\Sigma_3$ , suppose  $\Sigma_3 \subseteq \Sigma_2 \subseteq \Sigma_1$ .
  - Let  $P_{12}:\Sigma_1^* \rightarrow \Sigma_2^*$ ,  $P_{23}:\Sigma_2^* \rightarrow \Sigma_3^*$  and  $P_{13}:\Sigma_1^* \rightarrow \Sigma_3^*$  be natural projections
  - Then  $P_{13} = P_{23}P_{12}$
- **[Distribution Rule]** Given  $L_1 \subseteq \Sigma_1^*$  and  $L_2 \subseteq \Sigma_2^*$ , let  $\Sigma' \subseteq \Sigma_1 \cup \Sigma_2$ .
  - Let  $P:(\Sigma_1 \cup \Sigma_2)^* \rightarrow \Sigma'^*$  be the natural projection. Then
    - $P(L_1 \parallel L_2) \subseteq P(L_1) \parallel P(L_2)$
    - $\Sigma_1 \cap \Sigma_2 \subseteq \Sigma' \Rightarrow P(L_1 \parallel L_2) = P(L_1) \parallel P(L_2)$

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**We now talk about control ...**

# The Control Architecture



- Given a plant  $G$  and a requirement SPEC, compute a supervisor  $S$ 
  - $L_m(S/G) := L_m(S) \parallel L_m(G) \subseteq L_m(G) \parallel L_m(\text{SPEC})$
  - $S$  should not disable the occurrence of any uncontrollable event
  - $S$  should make a move only based on observable outputs of  $G$
  - $S/G$  is nonblocking



# General Control Issues

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Q1 : Is there a control that enforces both **safety**, and **liveness (nonblocking)**, and which is **maximally permissive** ?

Q2 : If so, can its design be **automated** ?

Q3 : If so, with **acceptable computing effort** ?

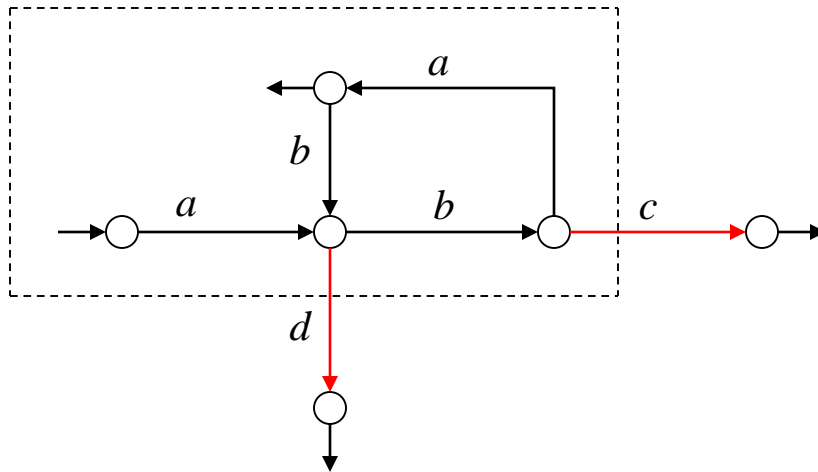
# Solution to Question 1

- Fundamental **definition**

A sublanguage  $K \subseteq L_m(G)$  is *controllable* (w.r.t.  $G$ ) if

$$\overline{K}\Sigma_{uc} \cap L(G) \subseteq \overline{K}$$

– “Once in  $\overline{K}$ , you can’t skid out on an uncontrollable event.”



$$\Sigma = \{a, b, c, d\}$$

$$\Sigma_c = \{a, c, d\}$$

$$\Sigma_{uc} = \{b\}$$

# Supremal Controllable Sublanguage

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- Given a plant  $G$  and a specification  $SPEC$  (both over  $\Sigma$ ), let
$$\mathcal{C}(G, SPEC) := \{ K \subseteq L_m(G) \cap L_m(SPEC) \mid K \text{ is controllable w.r.t. } G \}$$
- $\mathcal{C}(G, SPEC)$  is a poset under set inclusion and closed under arbitrary union
  - The largest element is called the *supremal* controllable sublanguage,

# Fundamental Result

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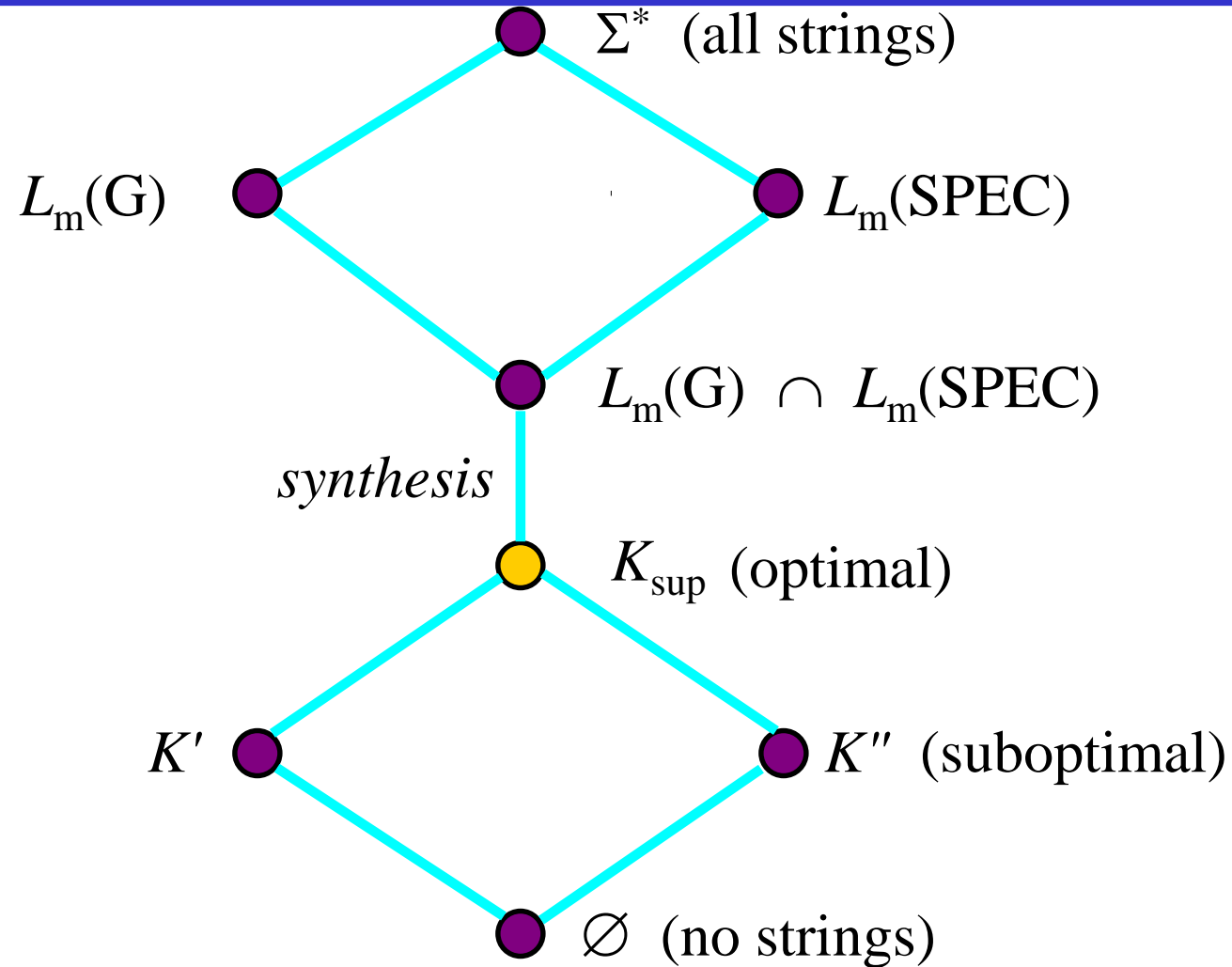
- There exists a (unique) *supremal* controllable sublanguage

$$K_{\text{sup}} \subseteq L_{\text{m}}(\text{G}) \cap L_{\text{m}}(\text{SPEC})$$

- SPEC is an automaton model of a specification

- Furthermore  $K_{\text{sup}}$  can be effectively computed.

# Lattice View of Solution to Question 1



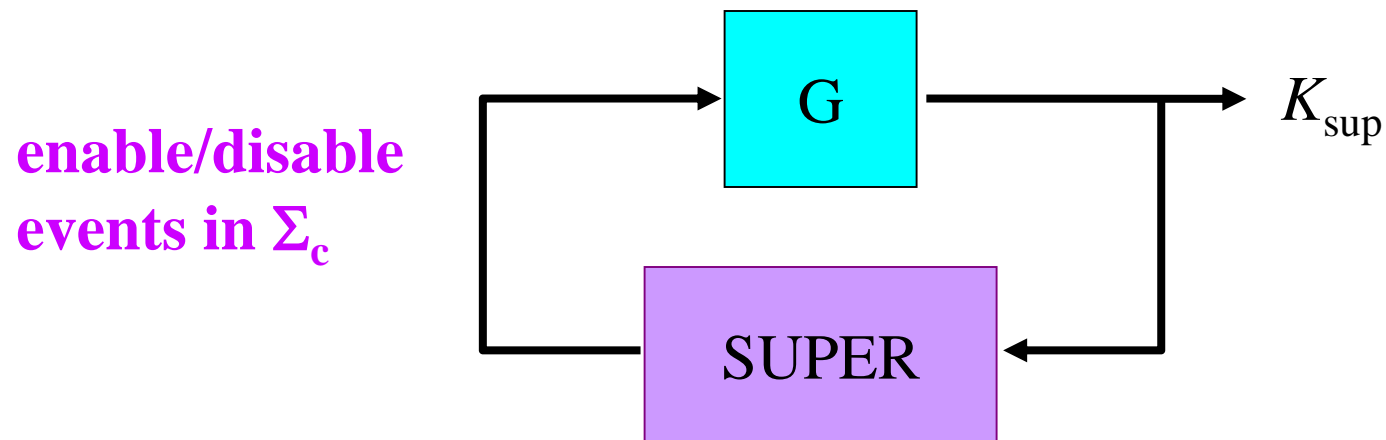
## Solution to Question 2

- Given  $G$  and SPEC, compute  $K_{\text{sup}}$

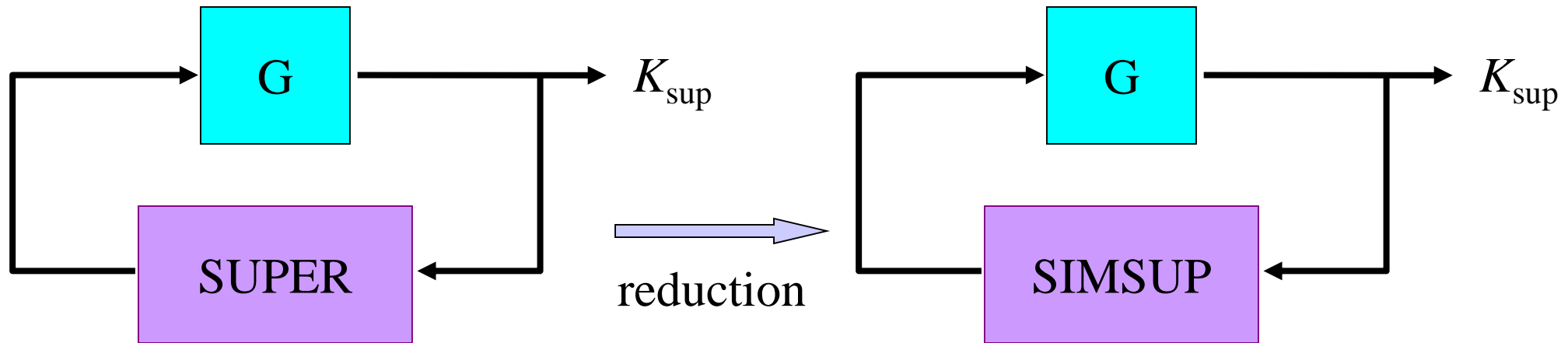
$$K_{\text{sup}} = L_{\text{m}}(\text{SUPER})$$

$$\text{SUPER} = \mathbf{Supcon} (G, \text{SPEC})$$

- Given SUPER, implement  $K_{\text{sup}}$



# Supervisor Reduction



$SUPER$  and  $SIMSUP$  is *control equivalent* if

- $L(G) \cap L(SUPER) = L(G) \cap L(SIMSUP)$
- $L_m(G) \cap L_m(SUPER) = L_m(G) \cap L_m(SIMSUP)$

# Supervisor Reduction

- Controlled behavior has *state size*

$$\|L_m(\text{SUPER})\| \leq \|L_m(G)\| \times \|L_m(\text{SPEC})\|$$

- Compute *reduced, control-equivalent* SIMSUP, often with

$$\|L_m(\text{SIMSUP})\| \ll \|L_m(\text{SUPER})\|$$

- In TCT:
  - $\text{CONSUPER} = \text{Condat}(G, \text{SUPER})$
  - $\text{SIMSUP} = \text{Supreduce}(G, \text{SUPER}, \text{CONSUPER})$



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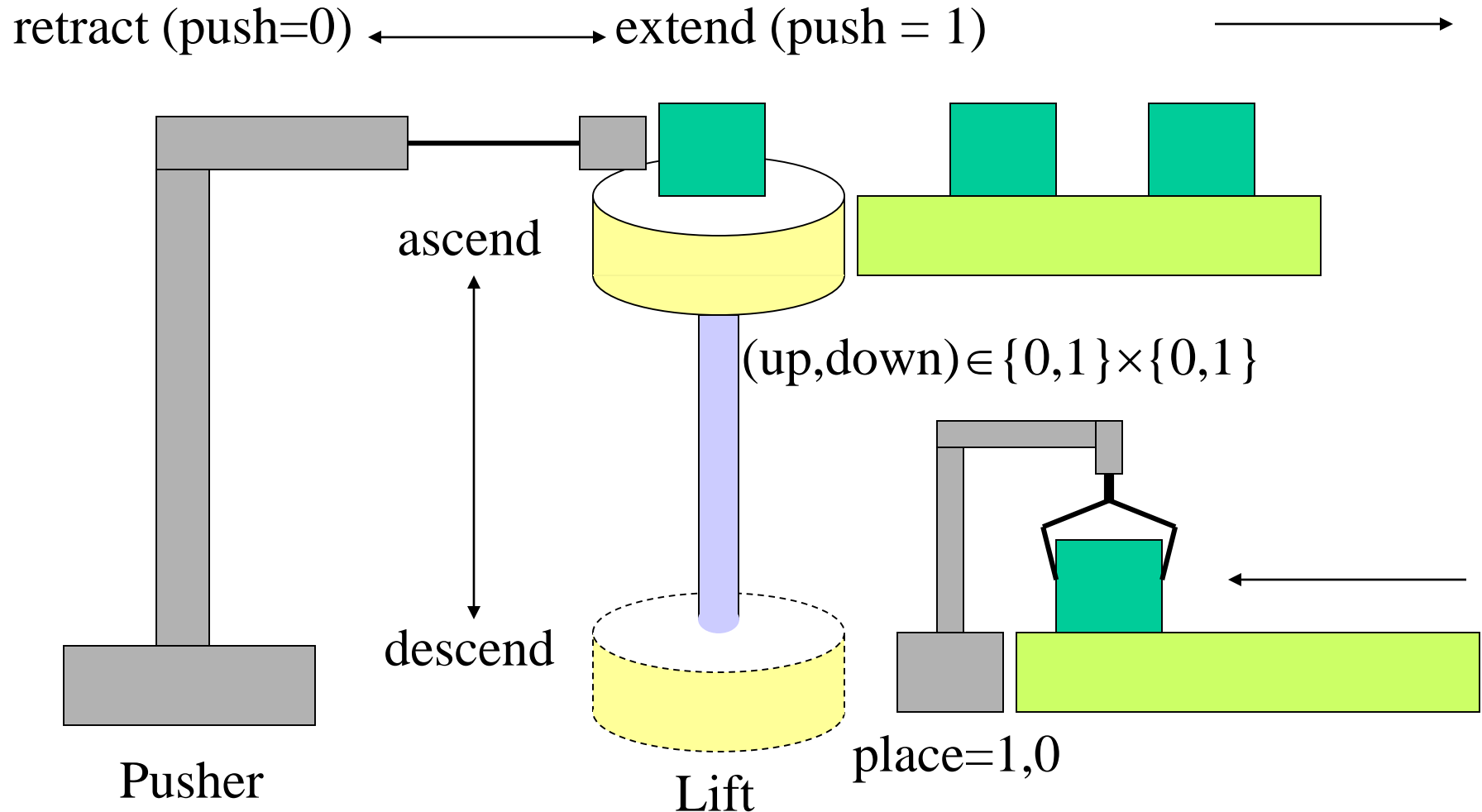
A solution to Question 3 is *modular/distributed/hierarchical* control

# Outline

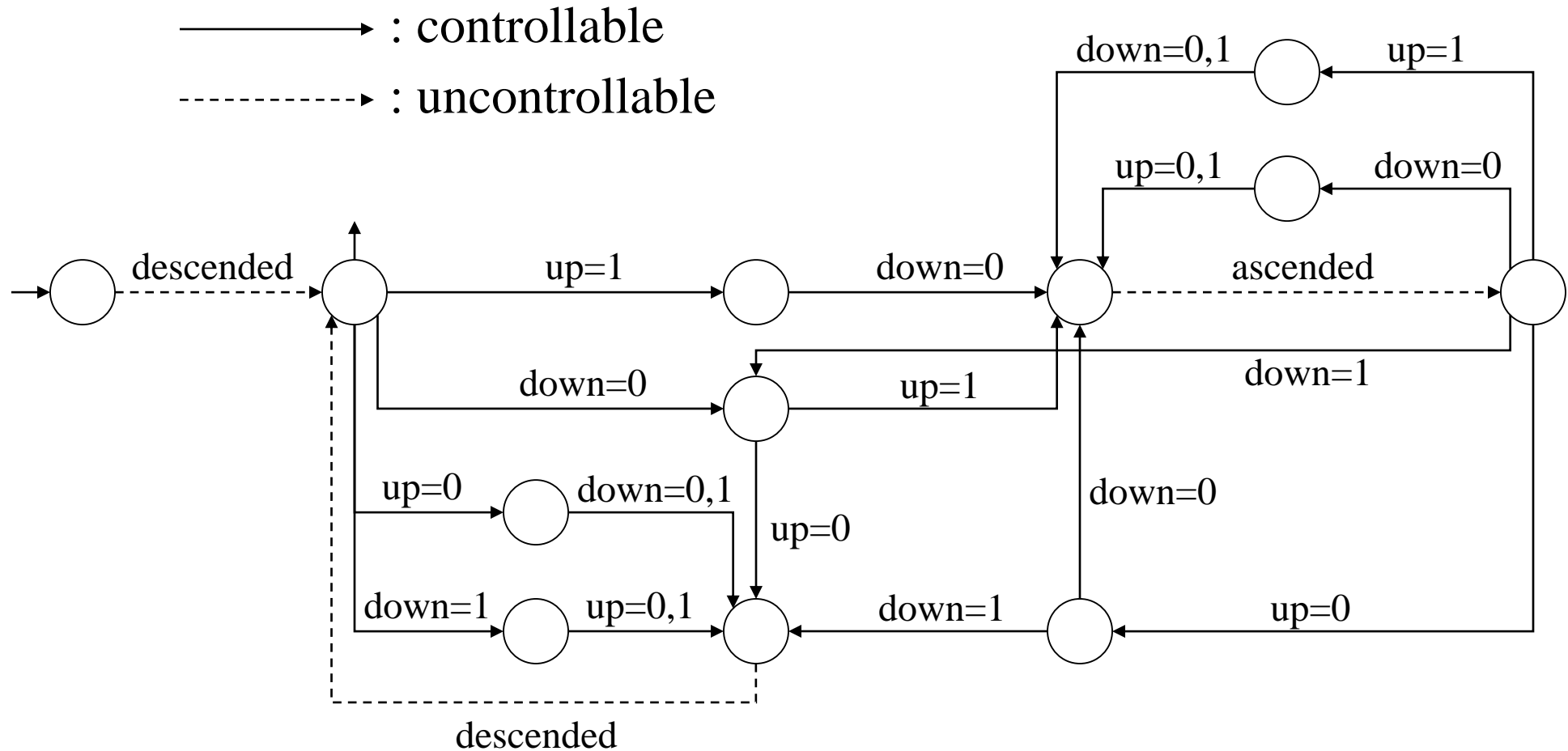
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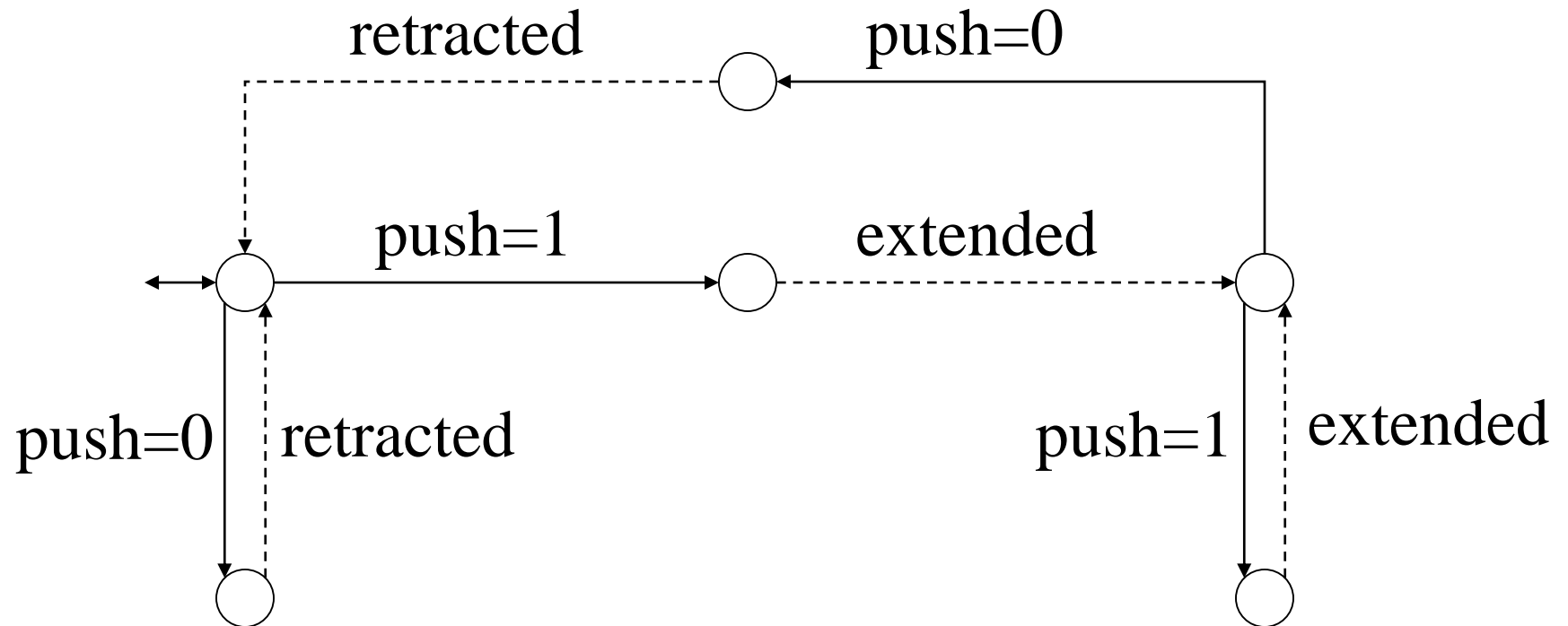
# A Pusher-Lift System



# Lift Model $G_{\text{lift}}$

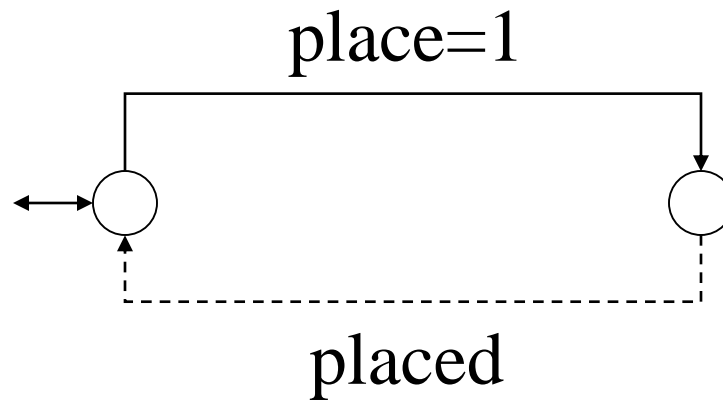


# Pusher Model $G_{pu}$

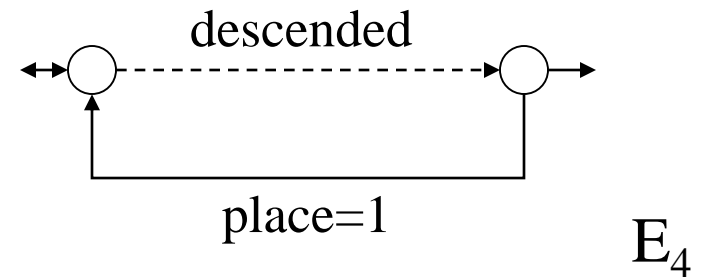
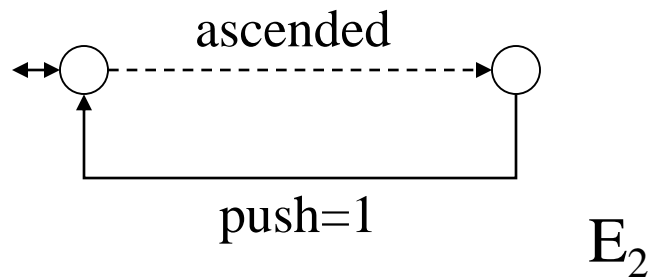
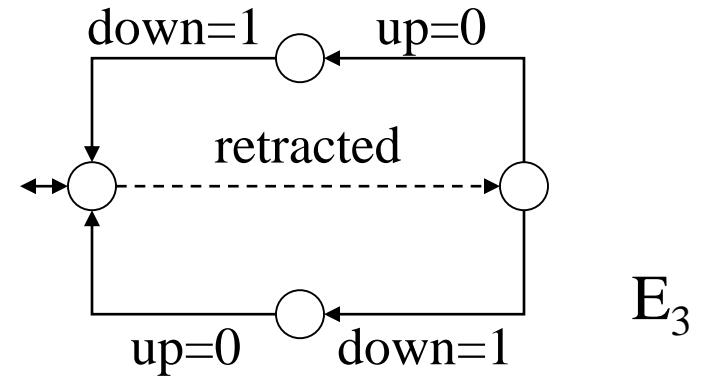
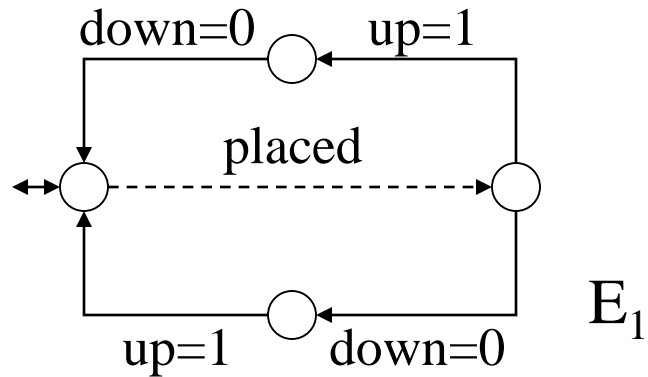


# Product Model $G_{\text{pro}}$

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# Specifications



# Monolithic Method – Supervisor Synthesis

- Plant:  $G = G_{\text{lift,lo}} \times G_{\text{pu}} \times G_{\text{pro}}$  (use Sync in TCT (240 , 956))
- Specification:
  - $E = E_1 \times E_2 \times E_3 \times E_4$  (64 , 288)
  - $E = \text{Selfloop}(E_1 \times E_2 \times E_3 \times E_4, \Sigma - (\Sigma_1 \cup \Sigma_2 \cup \Sigma_3 \cup \Sigma_4))$
- $\text{SUPER} = \text{Supcon}(G, E)$  (636 , 1369)
- $\text{SUPER} = \text{Condat}(G, \text{SUPER})$  : controllable
- $\text{SIMSUPER} = \text{Supreduce}(G, \text{SUPER}, \text{SUPER})$  (99 , 476 ; slb=51)



# Some Remarks

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- Advantages of RW SCT
  - It is conceptually simple
  - Many real systems can be modeled in this framework
- Disadvantages of RW SCT
  - The computational complexity is very high for large systems
  - The implementation issues are not explicitly addressed
    - A procedure of signals→events (supervisory control)→signals is needed.
  - *Performance issues* are not well addressed
    - “Bad” behaviors are forbidden, but no specific “good” behavior is enforced.

# Outline

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- Introduction to Supervisory Control
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# Goals of EE6226

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- To introduce several techniques that are aimed to handle the complexity issue involved in supervisor synthesis.
  - Modular control
  - Distributed control
  - Hierarchical control
  - State-feedback control
- To deal with supervisory control under partial observations.
- To address a certain type of performance.

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# **Basic Functions of Supervisor Synthesis Package**

**Developed by R. Su**  
**Nanyang Technological University**

# Create Automata

Automaton: B1.cfg

[automaton]

states = 0, 1, 2, 3, 4

alphabet = tau, R1-drop-B1, R1-pick-B1, R2-drop-B1, R2-pick-B1

controllable = R1-drop-B1, R1-pick-B1, R2-drop-B1, R2-pick-B1

observable = R1-drop-B1, R1-pick-B1, R2-drop-B1, R2-pick-B1

transitions = (0, 1, tau), (1, 2, R1-drop-B1), (2, 1, R2-pick-B1),  
                  (1, 3, R2-drop-B1), (3, 1, R1-pick-B1), (1, 4, R2-pick-B1),  
                  (1, 4, R1-pick-B1), (2, 4, R1-drop-B1), (3, 4, R2-drop-B1)

marker-states = 1

initial-state = 0

# Check Size of Automaton

---

make\_get\_size.py

[user@host ~] \$ make\_get\_size

Please input model (.cfg): B1.cfg

Number of states: 5

Number of transitions: 9

# Automaton Product

make\_product.py

```
[user@host ~]$ make_product
```

```
Please input list of your input automata (comma-seperated list of automata): B1.cfg, B2.cfg
```

```
Please input product automaton (.cfg): B1-B2.cfg
```

```
Mon Mar 16 10:33:51 2009: Must do 1 product computations. (memory=9052160 bytes)
```

```
Mon Mar 16 10:33:51 2009: Product #1 done: 17 states, 65 transitions (memory=9052160 bytes)
```

```
Mon Mar 16 10:33:51 2009: Computed product (memory=9052160 bytes)
```

```
    Number of states: 17
```

```
    Number of transitions: 65
```

```
Mon Mar 16 10:33:51 2009: Product is saved in B1-B2.cfg (memory=9076736 bytes)
```

# Automaton Abstraction

---

make\_abstraction.py

```
[user@host ~]$ make_abstraction
```

```
Please input source automaton (.cfg): B1-B2.cfg
```

```
Please input list of preserved events (comma-seperated list of event names): tau, R1-drop-B1
```

```
Please input name of the abstraction (.cfg): B1-B2-abstraction.cfg
```

```
Mon Mar 16 10:40:54 2009: Computed abstraction    (memory=8364032 bytes)
```

```
    Number of states: 5
```

```
    Number of transitions: 14
```

```
Mon Mar 16 10:40:54 2009: Abstraction is saved in B1-B2-abstraction.cfg  
    (memory=8409088 bytes)
```



# Sequential Automaton Abstraction

make\_sequential\_abstraction.py

```
[user@host ~]$ make_sequential_abstraction
```

```
Please input list of your input automata (comma-separated list of automata): B1.cfg, B2.cfg
```

```
Please input list of preserved events (comma-separated list of event names): tau, R1-drop-B1
```

```
Please input abstraction (.cfg): B1-B2-sequential-abstraction.cfg
```

```
Mon Mar 16 13:01:23 2009: Started      (memory=8249344 bytes)
```

```
Mon Mar 16 13:01:23 2009: #states after adding 1 automata: 5      (memory=8257536 bytes)
```

```
Mon Mar 16 13:01:23 2009: #states and #transitions after abstraction: 4, 9(memory=8265728 bytes)
```

```
Mon Mar 16 13:01:23 2009: #states of 2 automata: 5; #states and #transitions of product: 13 51  
                        (memory=8278016 bytes)
```

```
Mon Mar 16 13:01:23 2009: #states and #transitions after abstraction: 5, 14(memory=8294400 bytes)
```

```
Mon Mar 16 13:01:23 2009: Abstraction is saved in B1-B2-sequential-abstraction.cfg  
                        (memory=8327168 bytes)
```

# Natural Projection

---

make\_natural\_projection.py

```
[user@host ~]$ make_natural_projection
```

```
Please input source automaton (.cfg): B1-B2.cfg
```

```
Please input list of preserved events (comma-seperated list of event names): tau, R1-drop-B1
```

```
Please input name of the abstraction (.cfg): B1-B2-natural-projection.cfg
```

```
Mon Mar 16 10:46:04 2009: Computed projection      (memory=8376320 bytes)
```

```
        Number of states: 3
```

```
        Number of transitions: 3
```

```
Mon Mar 16 10:46:04 2009: Projected automaton is saved in B1-B2-natural-projection.cfg  
        (memory=8417280 bytes)
```

# Check Language Equivalence

---

Make\_language\_equivalence\_test.py

[user@host ~]\$ make\_language\_equivalence\_test

Please input first model (.cfg): B1-B2-abstraction.cfg

Please input second model (.cfg): B1-B2-natural-projection.cfg

Language equivalence HOLDS

# Supervisor Synthesis

---

make\_supervisor.py

[user@host ~]\$ make\_supervisor

Please input plant model (.cfg): plant.cfg

Please input specification model (.cfg): spec.cfg

Please input supervisor (.cfg): supervisor.cfg

Mon Mar 16 12:49:59 2009: Computed supervisor (memory=14548992 bytes)

Number of states: 140

Number of transitions: 288

Mon Mar 16 12:49:59 2009: Supervisor saved in supervisor.cfg (memory=14536704 bytes)

# Nonconflict Check

make\_nonconflicting\_check.py

```
[user@host ~]$ make_nonconflicting_check
```

```
Please input list of your input automata (comma-seperated list of automata): plant.cfg, supervisor.cfg
```

```
Mon Mar 16 12:56:21 2009: Started      (memory=14954496 bytes)
```

```
Mon Mar 16 12:56:21 2009: #states after adding 1 automata: 926      (memory=14954496 bytes)
```

```
Mon Mar 16 12:56:24 2009: #states and #transitions after abstraction: 926, 3919  
      (memory=15073280 bytes)
```

```
Mon Mar 16 12:56:24 2009: #states of 2 automata: 139; #states and #transitions of product: 166 380  
      (memory=15073280 bytes)
```

```
Mon Mar 16 12:56:24 2009: #states and #transitions after abstraction: 3, 6(memory=15036416 bytes)  
ok
```

# Check Controllability

make\_controllability\_check.py

```
[user@host ~]$ make_controllability_check
```

```
Please input plant model (.cfg): plant.cfg
```

```
Please input supervisor model (.cfg): supervisor.cfg
```

```
States with disabled controllable events:
```

```
(1, 1): {R2-pick-B2, R3-pick-B2}
```

```
(4, 2): {R2-drop-B2}
```

```
(5, 3): {R3-drop-B2, R2-pick-B2, R3-drop-P33, R3-drop-B3}
```

```
(10, 4): {R3-drop-B3, R2-drop-B2, R3-drop-P33}
```

```
.....
```

```
(799, 121): {R2-pick-B2, R3-pick-B2}
```

```
Supervisor is correct (no disabled uncontrollable events)
```

# Compute Feasible Supervisor

`make_feasible_supervisor.py`

```
[user@host ~]$ make_feasible_supervisor
```

```
Please input plant model (.cfg): plant.cfg
```

```
Please input supervisor model (.cfg): supervisor.cfg
```

```
Please input feasible supervisor filename (.cfg): feasible_supervisor.cfg
```

```
Mon Mar 16 13:09:43 2009: Computed supervisor    (memory=10522624 bytes)
```

```
    Number of states: 82
```

```
    Number of transitions: 196
```

```
Mon Mar 16 13:09:43 2009: Supervisor saved in feasible_supervisor.cfg  
    (memory=10547200 bytes)
```

# Batch Operation

Batch\_Operation.py

```
*****  
#!/usr/bin/env python  
from automata import frontend  
  
#Compute product  
frontend.make_product('B1.cfg', 'B2.cfg', 'B1-B2.cfg')  
  
#Compute automaton abstraction  
frontend.make_abstraction('B1-B2.cfg', 'tau,R1-drop-B1', 'B1-B2-abstraction.cfg')  
  
#Compute supervisor  
frontend.make_supervisor('plant.cfg', 'spec.cfg', 'supervisor.cfg')  
  
#Check controllability  
frontend.make_controllability_check('plant.cfg', 'supervisor.cfg')
```