

# Automatic Synthesis of New Behaviors from a Library of Available Behaviors

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## Behavior composition



**Environment**  
is similar to  
an action  
theory!

**Behaviors** are  
similar to robot  
programs;  
capture possible  
executions

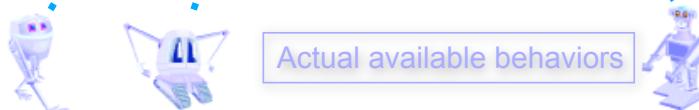
**Target behavior**  
description of the desired behavior  
expressed in terms of virtual actions

**Environment**  
description of (virtual) actions,  
precoditions and effects

**Available behaviors**  
descriptions of the behavior of available agents/devices  
expressed in terms virtual actions

### Key points

- *Actions are virtual*
- *Only available behaviors provide actual action execution*
- *Must realize target behavior using fragments of available behaviors*



Actual available behaviors

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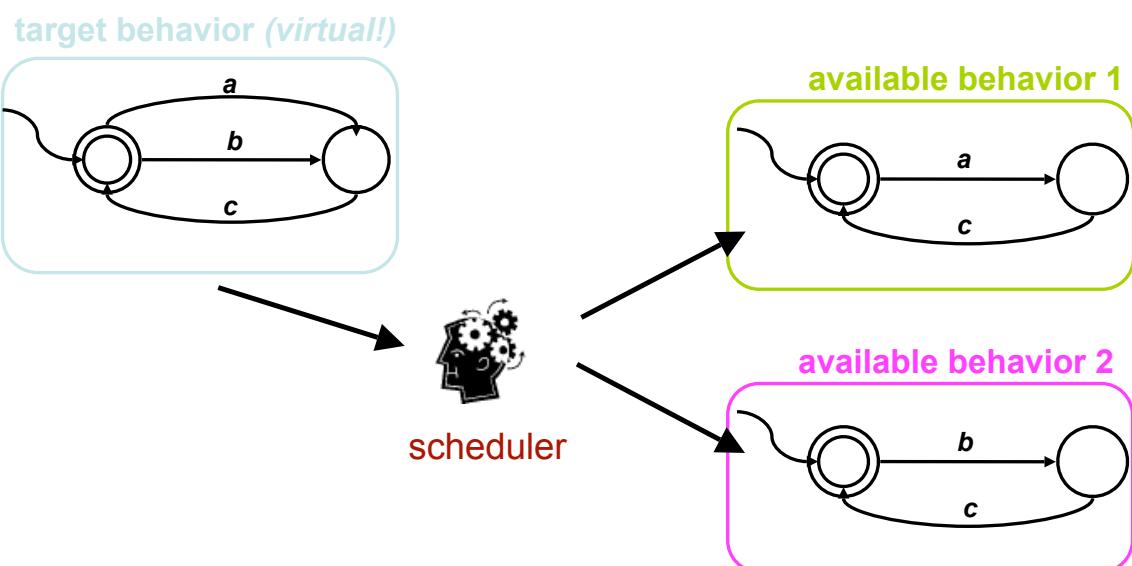
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# Behavior composition: the setting studied

- **Environment:**
  - Describe precondition and effect of actions (as an action theory)
  - **Finite state** (to get computability of the synthesis)
  - **Nondeterministic** (devilish/don't know nondeterminism)
  - Represented as a (finite) **transition system** (we are not concerned with representation in this work)
- **Available behaviors:**
  - Describe the capabilities of the agent/device
  - **Finite state** (to get computability of the synthesis)
  - **Nondeterministic** (devilish/don't know nondeterminism)
  - Can access the state of the **environment**
  - Can not access the state of the **other available behaviors**
  - Represented as (finite) **transition systems** (with **guards** to test the environment)
- **Target behavior:**
  - As available behavior but **deterministic**
    - it's a spec of a desired behavior: we know what we want!
- **Problem:** *synthesize a “scheduler” that realize the target behavior by suitably “composing” the available behaviors*

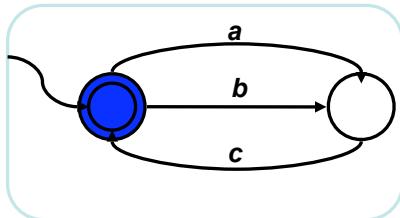
## Example



**Simplified case: available behaviors  
are deterministic finite transition systems**

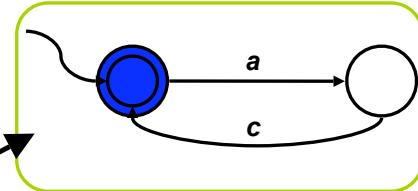
## Example

target behavior

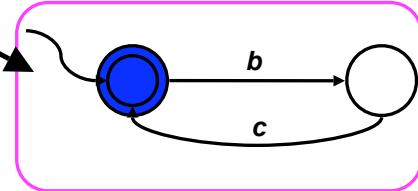


scheduler

available behavior 1



available behavior 2



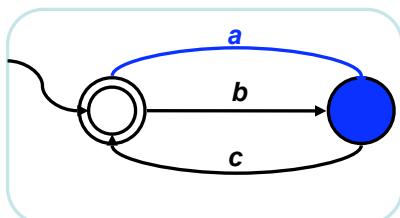
A sample run

action request:

scheduler response:

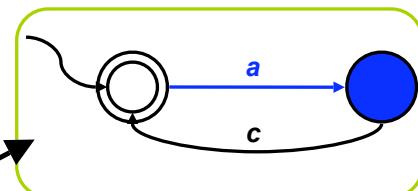
## Example

target behavior

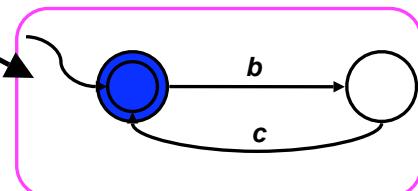


scheduler

available behavior 1



available behavior 2



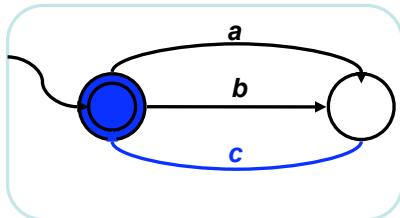
A sample run

action request: a

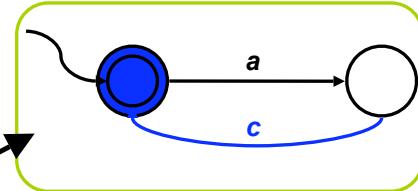
scheduler response: a,1

## Example

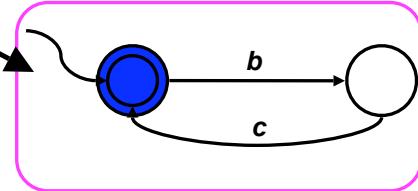
target behavior



available behavior 1



available behavior 2



A sample run

action request: **a**      **c**

scheduler response: **a,1**      **c,1**

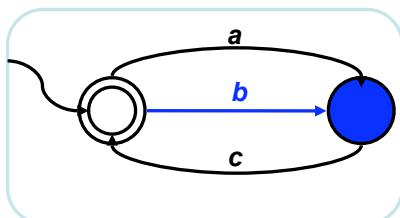
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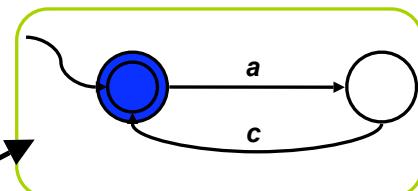
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## Example

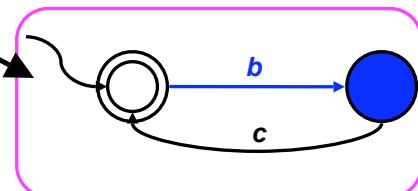
target behavior



available behavior 1



available behavior 2



A sample run

action request: **a**      **c**

scheduler response: **a,1**      **c,1**

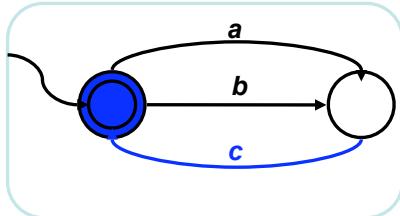
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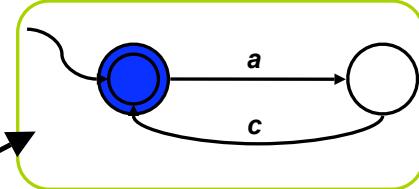
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## Example

target behavior

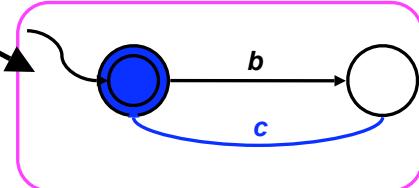


available behavior 1



scheduler

available behavior 2



A sample run

action request:      a      c      b      c      ...

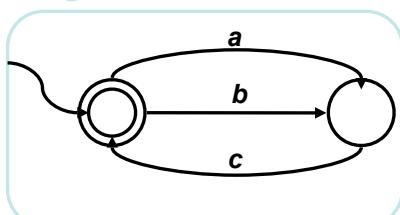
scheduler response:      a,1      c,1      b,2      c,2

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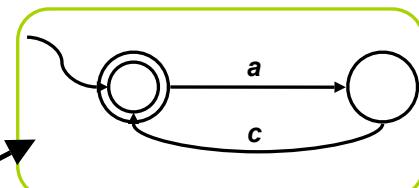
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## A scheduler program realizing the target behavior

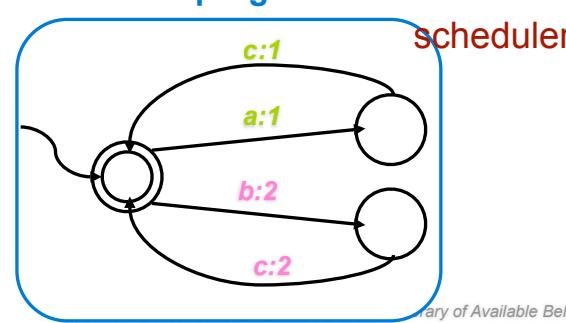
target behavior



available behavior 1

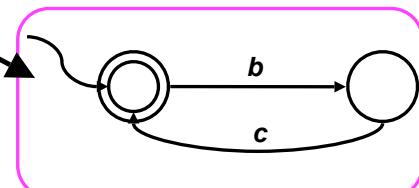


scheduler program



scheduler

available behavior 2



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# Nondeterminism

Devilish (don't know)!

- Nondeterministic environment
  - Incomplete information on effects of actions
  - Action outcome depends on external (not modeled) events
- Nondeterministic available behaviors
  - Incomplete information on the actual behavior
  - Mismatch between behavior description (which is in terms of the environment actions) and actual behavior of the agents/devices
- Deterministic target behavior
  - it's a spec of a desired behavior: (devilish) nondeterminism is banned

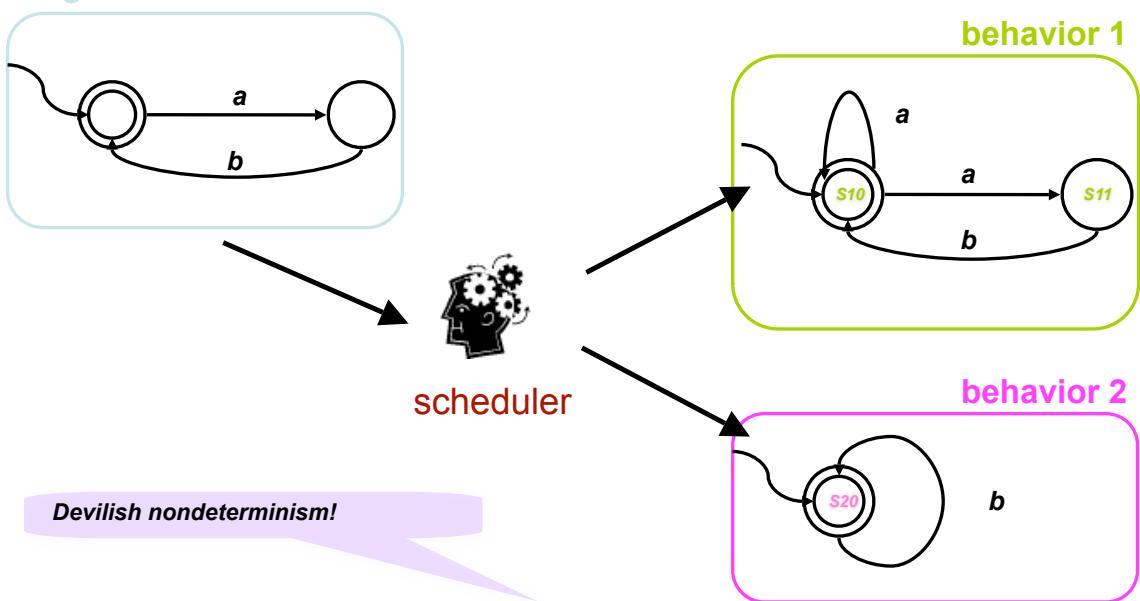
*In general, devilish nondeterminism difficult to cope with  
eg. nondeterminism moves AI Planning from PSPACE (classical planning) to EXPTIME  
(contingent planning with full observability [Rintanen04])*

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## Example nondeterministic behaviors

target behavior



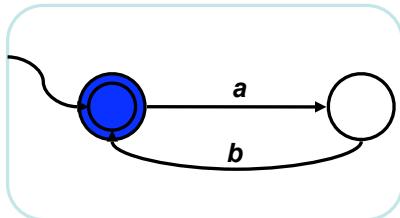
Available behaviors represented as nondeterministic transition systems

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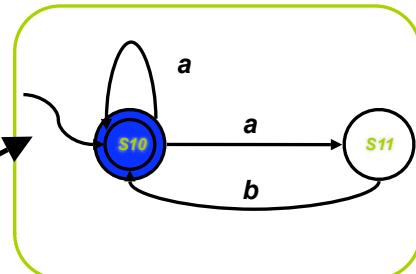
## Example nondeterministic behaviors

target behavior

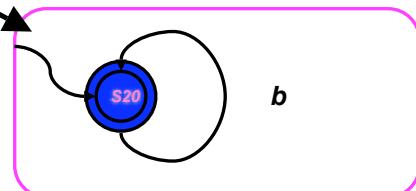


scheduler

behavior 1



behavior 2

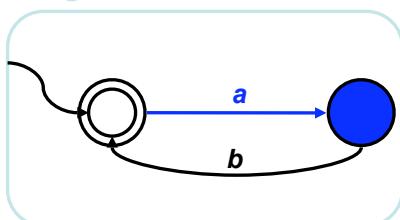


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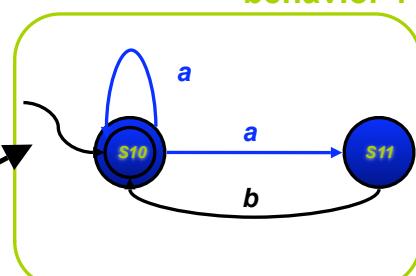
## Example nondeterministic behaviors

target behavior

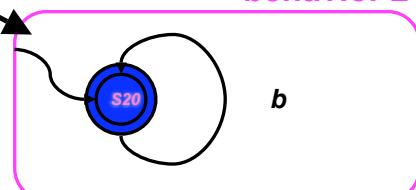


scheduler

behavior 1



behavior 2

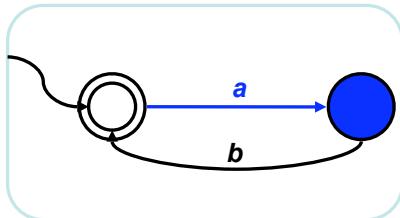


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## Example nondeterministic behaviors

target behavior

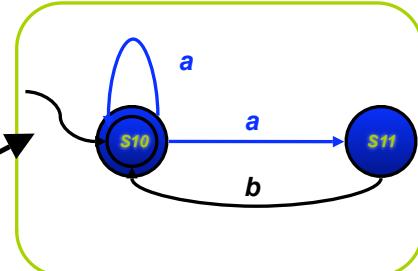


observe the  
actual state!

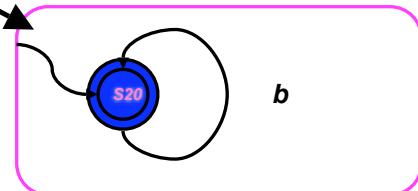


scheduler

behavior 1



behavior 2

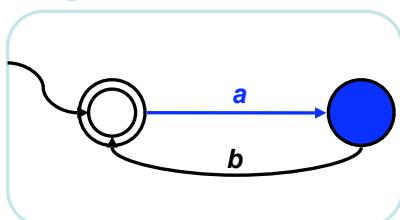


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## Example nondeterministic behaviors

target behavior

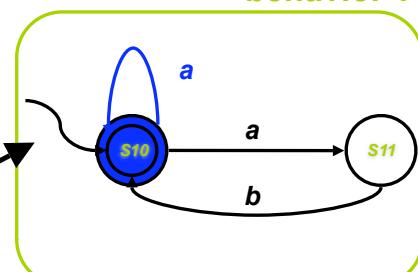


observe the  
actual state!

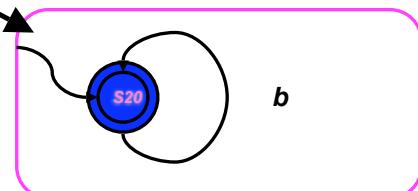


scheduler

behavior 1



behavior 2

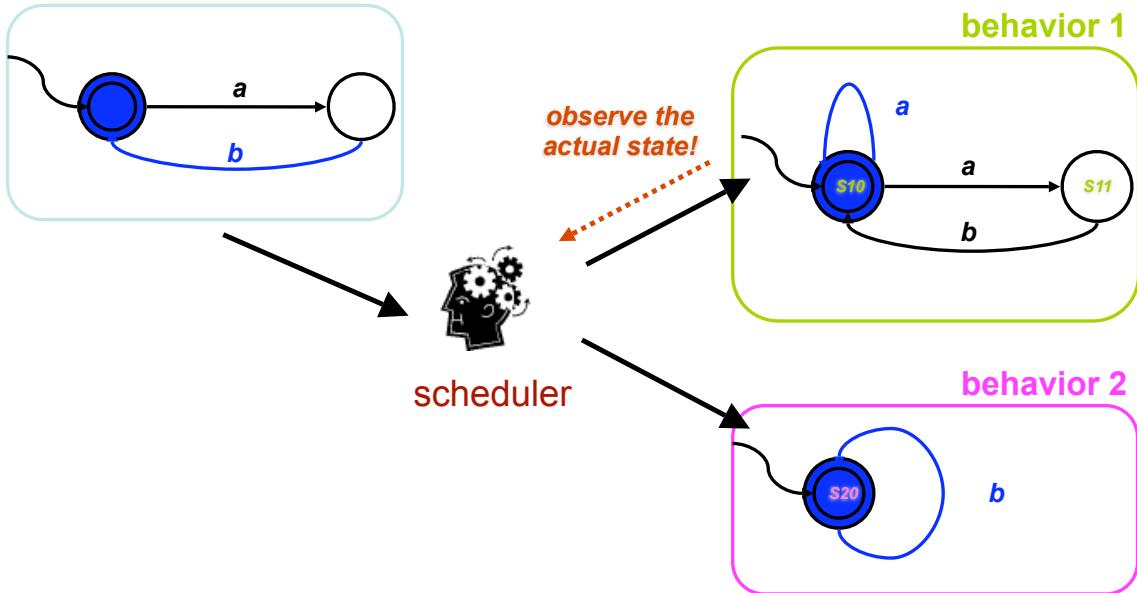


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## Example: nondeterministic behaviors

target behavior

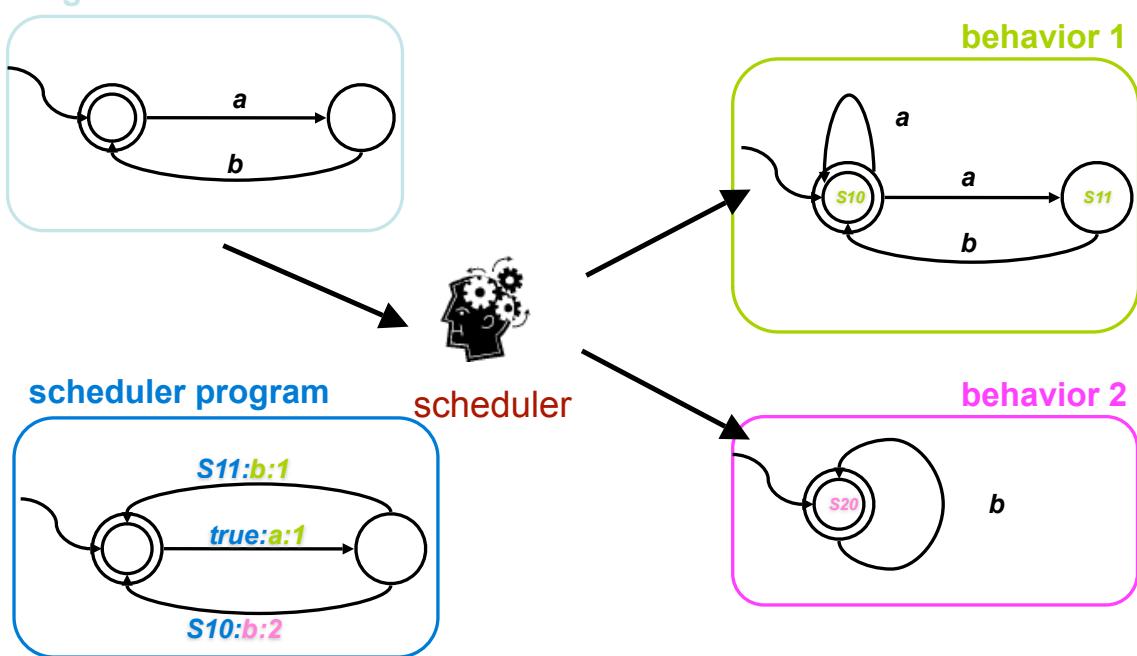


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## A scheduler program realizing the target behavior

target behavior



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# Scheduler programs

contains all the observable  
information up the current situation

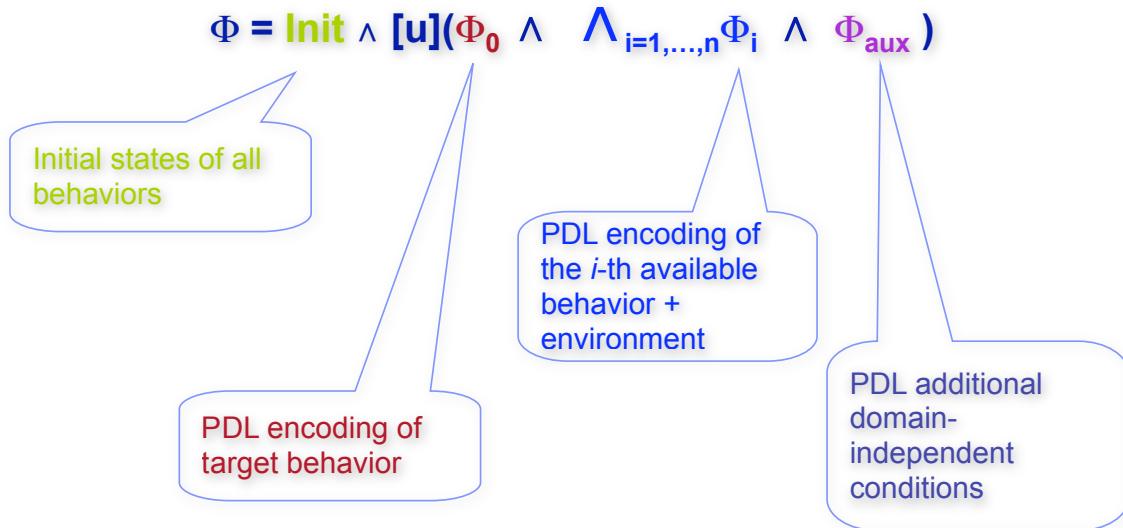
- **Scheduler program** is any function  $P(h, a) = i$  that takes a **history**  $h$  and an **action**  $a$  to execute and **delegates**  $a$  to the available behavior  $i$
- A **history** is a sequence of the form:  
$$(s_1^0, s_2^0, \dots, s_n^0, e^0) a_1 (s_1^1, s_2^1, \dots, s_n^1, e^1) \dots a_k (s_1^k, s_2^k, \dots, s_n^k, e^k)$$
- Observe that to take a decision  $P$  has **full access to the past**, but no access to the future
- *Problem: synthesize a scheduler program  $P$  that realizes the target behavior making use of the available behaviors*

## Technique: reduction to PDL

Basic idea:

- A scheduler program  $P$  realizes the target behavior  $T$  iff:
  - $\forall$  transition labeled  $a$  of the target behavior  $T$  ...
  - ...  $\exists$  an available behavior  $B_i$  (the one chosen by  $P$ ) which can make an  $a$ -transition ...
  - ... and  $\forall a$ -transition of  $B_i$  realizes the  $a$ -transition of  $T$
- Encoding in PDL:
  - $\forall$  transition labeled  $a$  ...  
use **branching**
  - $\exists$  an available behavior  $B_i$  ...  
use underspecified predicates **assigned through SAT**
  - $\forall a$ -transition of  $B_i$  ... :  
use **branching** again

## Structure of the PDL encoding



*PDL encoding is polynomial in the size of the target behavior, available behaviors, and environment*

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## Technical results: theoretical

**Thm** Checking the existence of scheduler program realizing the target behavior is **EXPTIME-complete**.

*EXPTIME-hardness due to Muscholl&Walukiewicz05  
for deterministic behaviors*

**Thm** If a scheduler program exists there exists one that is **finite state**.

*Exploits the finite model property of PDL*

## Technical results: practical

Reduction to PDL provides also a practical sound and complete technique to compute the scheduler program

eg, PELLET @ Univ. Maryland

- Use state-of-the-art tableaux systems for OWL-DL for checking SAT of PDL formula  $F$ 
  - exponential in the size of the behaviors*
- If SAT, the tableau returns a finite model of  $F$
- Project away irrelevant predicates from such model, and possibly minimize
  - polynomial in the size of the model*
- The resulting structure is a finite scheduler program that realizes the target behavior

## Conclusion

- Nondeterministic target behavior?
  - loose specification in client request
  - angelic (don't care) vs devilish (don't know) nondeterminism
  - see ICSOC'04 for ideas
- Distribute the scheduler?
  - Often a centralized scheduler is unrealistic: eg. Robot Ecologies
    - too tight coordination
    - too much communication
    - scheduler cannot be embodied anywhere
  - drop centralized scheduler in favor of **independent controllers** on single available behaviors (exchanging messages)
  - we are actively working on it
- Infinite states behaviors?
  - Important for dealing with **data/parameters**
  - this is the single most difficult issue to tackle
    - first results: actions as DB updates, see VLDB'05
    - literature on Abstraction in Verification

## PDL encoding: target behavior

For target behavior  $B_0$ :  $\Phi_0$  is the conjunction of

- $s \wedge e \rightarrow \langle a \rangle \text{ true} \wedge [a]s'$  for each  $(s, g, a, s') \in \delta_0$  with  $g(e) = \text{true}$   
*target behavior can do an a-transition going to state s'*
- $s \wedge e \rightarrow [a] \text{ undef}$  if there exists no  $(s, g, a, s') \in \delta_0$  with  $g(e) = \text{true}$   
*target behavior does not do an a-transition*
- $s \rightarrow \neg s'$  for all pairs of distinct states of the behaviors  
*behavior states are pair-wise disjoint*
- $F_0 \equiv \bigvee_{s \in F_0} s$  denotes behavior final states

## PDL encoding: available behaviors

For available behavior  $B_i$ :  $\Phi_i$  is the conjunction of

- $s \wedge e \wedge \text{EXEC}_{ia} \rightarrow \bigwedge_{(s', e') \in \Delta} \langle a \rangle (s' \wedge e') \wedge [a]_{(s', e') \in \Delta} (s' \wedge e')$   
*where  $\Delta = \{(s' \wedge e') \mid (s, g, a, s') \in \delta_i, g(e) = \text{true}\}$  (If behavior is selected to be executed ( $\text{EXEC}_i$  is true) then for each action that has nonempty transitions, it moves in all possible way)*
- $s \wedge e \wedge \text{EXEC}_{ia} \rightarrow [a] \text{ false}$  if  $\Delta = \emptyset$   
*if behavior is selected to be executed and it cannot do a, then there is no a-transition*
- $s \wedge \neg \text{EXEC}_i \rightarrow [a]s$   
*if behavior is not selected to be executed then it remains in its state*
- $s \rightarrow \neg s'$  for all pairs of distinct states of the behaviors  
*behavior states are pair-wise disjoint*
- $F_i \equiv \bigvee_{s \in F_i} s$  denotes behavior final states

## PDL encoding: additional conditions

Finally:  $\Phi_{aux}$  is the conjunction of

- $undef \rightarrow [a] undef$   
successors of undef states are undef themselves
- $\neg undef \wedge \langle a \rangle true \rightarrow \bigvee_{1, \dots, n} EXEC_{ia}$   
at least one of the available behaviors must be selected for execution at each step
- $EXEC_{ia} \rightarrow \neg EXEC_{ja}$   
only one available behavior can execute at each step
- $F_0 \rightarrow \bigwedge_{i=1, \dots, n} F_i$   
when target behavior is final all available behaviors are final

and **Init** is

- $Init = s_0^0 \wedge \bigwedge_{i=1, \dots, n} s_i^0$