

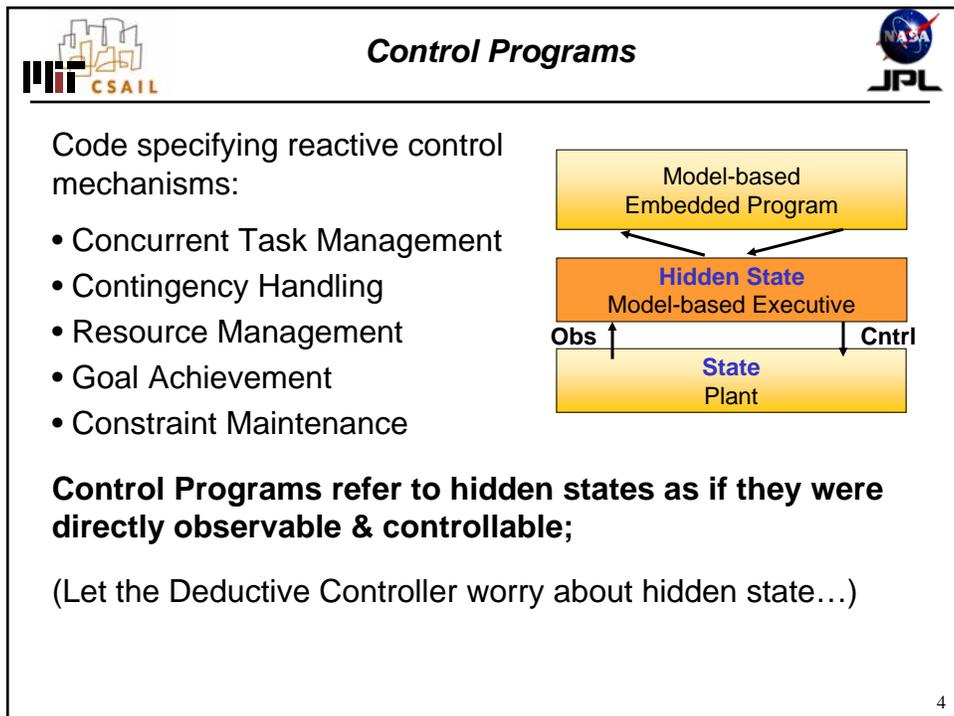
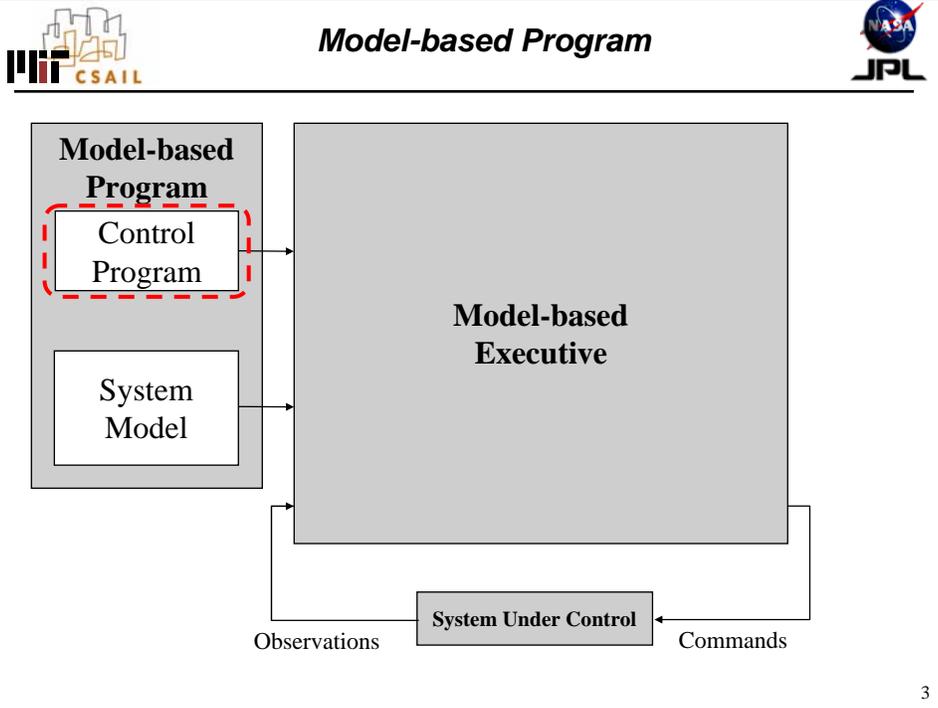
Model-based Programming

1

Outline

- Introduction & Overview
- **Model-based Programming**
 - Control Programs: RMPL & HCA
 - System Models: CCA
 - Model-based Program Semantics
- Execution of Model-based Programs
- Fundamentals of Model-based Reasoning
- Modeling via State Analysis
- Advanced Methods
- Conclusion

2



```

OrbitInsert():
(do-watching ( (EngineA = Firing) OR (EngineB = Firing) )
  (parallel
    (EngineA = Standby)
    (EngineB = Standby)
    (Camera = Off)
    (do-watching (EngineA = Failed)
      (when-donext ( (EngineA = Standby) AND
                    (Camera = Off) )
        (EngineA = Firing) ) )
    (when-donext ( (EngineA = Failed) AND
                  (EngineB = Standby) AND
                  (Camera = Off) )
      (EngineB = Firing) ) ) )
  
```

Directly monitors state

Issues goals on state

```

OrbitInsert():
(do-watching ( (EngineA = Firing) OR (EngineB = Firing) )
  (parallel
    (EngineA = Standby)
    (EngineB = Standby)
    (Camera = Off)
    (do-watching (EngineA = Failed)
      (when-donext ( (EngineA = Standby) AND
                    (Camera = Off) )
        (EngineA = Firing) ) )
    (when-donext ( (EngineA = Failed) AND
                  (EngineB = Standby) AND
                  (Camera = Off) )
      (EngineB = Firing) ) ) )
  
```

Allows for pre-emption...

Parallel execution...

Conditional execution...

And many other features...



Reactive Model-based Programming Language



RMPL Constructs (Reactive Combinators)		
Basic Constructs	constraint (goal) assertion	<code>g</code>
	maintenance constraint	<code>A maintaining c</code>
	conditional execution	<code>if c thennext A</code>
	guarded transition	<code>unless c thennext A</code>
	full concurrency	<code>A , B</code>
	sequential composition	<code>A ; B</code>
	iteration	<code>always A</code>
Derived Constructs	preemption	<code>do A watching c</code>
	delay	<code>next A</code>
	conditional execution with default behavior	<code>if c thennext A elsenext B</code>
	temporally extended conditional execution	<code>when c donext A</code>
	iterated conditional execution	<code>whenever c donext A</code>

7



RMPL – Alternative Syntax



RMPL Constructs (Reactive Combinators)		
Basic Constructs	constraint (goal) assertion	<code>(g)</code>
	maintenance constraint	<code>(do-maintaining c A)</code>
	conditional execution	<code>(if-thennext c A)</code>
	guarded transition	<code>(unless-thennext c A)</code>
	full concurrency	<code>(parallel A B)</code>
	sequential composition	<code>(sequence A B)</code>
	iteration	<code>(always A)</code>
Derived Constructs	preemption	<code>(do-watching c A)</code>
	delay	<code>(next A)</code>
	conditional execution with default behavior	<code>(if-thennext-elsenext c A B)</code>
	temporally extended conditional execution	<code>(when-donext c A)</code>
	iterated conditional execution	<code>(whenever-donext c A)</code>

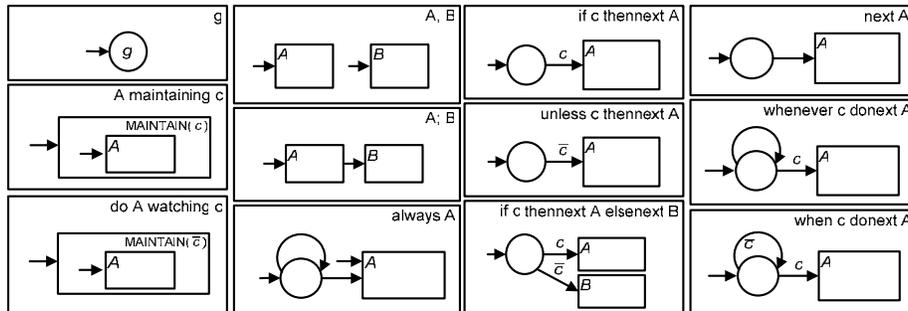
8



Compiling RMPL to HCA



- Hierarchical Constraint Automata (HCA): graphical specification language for control programs, in the spirit of StateCharts
- Writable, inspectable by systems engineers
- Directly executable by Control Sequencer



9



Compiling RMPL to HCA



OrbitInsert()::

**(do-watching ((EngineA = Firing) OR
(EngineB = Firing))**

(parallel

(EngineA = Standby)

(EngineB = Standby)

(Camera = Off)

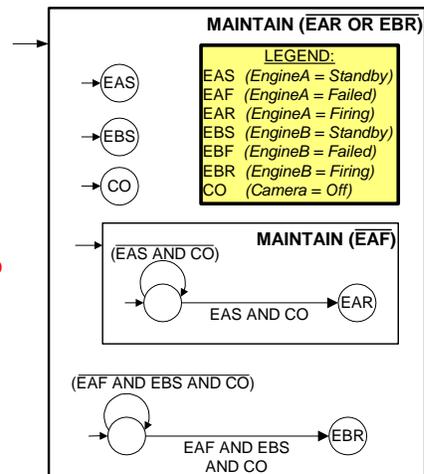
(do-watching (EngineA = Failed)

**(when-donext ((EngineA = Standby) AND
(Camera = Off))**

(EngineA = Firing)))

**(when-donext ((EngineA = Failed) AND
(EngineB = Standby) AND
(Camera = Off))**

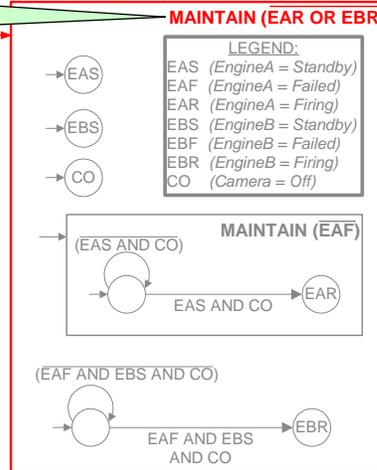
(EngineB = Firing)))



10

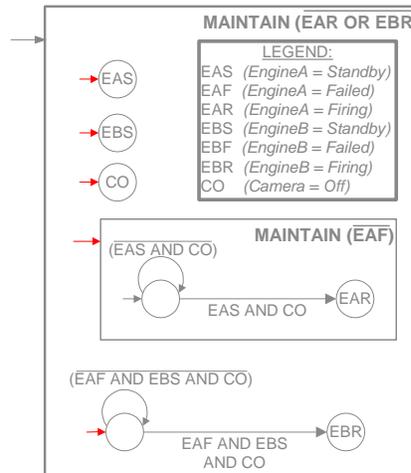
maintenance
constraint

```
OrbitInsert():
  (do-watching ((EngineA = Firing) OR
               (EngineB = Firing))
  (parallel
    (EngineA = Standby)
    (EngineB = Standby)
    (Camera = Off)
    (do-watching (EngineA = Failed)
      (when-donext ( (EngineA = Standby) AND
                    (Camera = Off) )
        (EngineA = Firing)))
    (when-donext ( (EngineA = Failed) AND
                  (EngineB = Standby) AND
                  (Camera = Off) )
      (EngineB = Firing))))
```



➤ *conditioned on state constraints*

```
OrbitInsert():
  (do-watching ((EngineA = Firing) OR
               (EngineB = Firing))
  (parallel
    (EngineA = Standby)
    (EngineB = Standby)
    (Camera = Off)
    (do-watching (EngineA = Failed)
      (when-donext ( (EngineA = Standby) AND
                    (Camera = Off) )
        (EngineA = Firing)))
    (when-donext ( (EngineA = Failed) AND
                  (EngineB = Standby) AND
                  (Camera = Off) )
      (EngineB = Firing))))
```



➤ *compact encoding: multiple locations
can be simultaneously marked*



Compiling RMPL to HCA



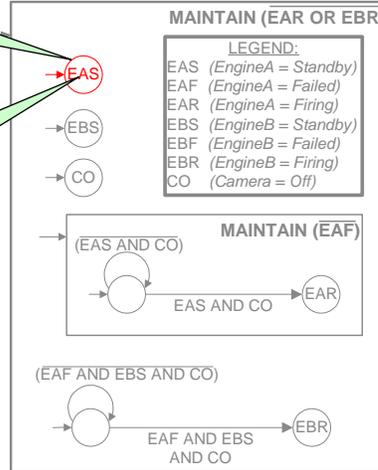
```

OrbitInsert():
(do-watching ((EngineA = Firing) OR
              (EngineB = Firing))
(parallel
  (EngineA = Standby)
  (EngineB = Standby)
  (Camera = Off)
  (do-watching (EngineA = Firing)
    (when-donext ( (EngineA = Standby) AND
                  (Camera = Off) )
                  (EngineA = Firing)))
  (when-donext ( (EngineA = Failed) AND
                (EngineB = Standby) AND
                (Camera = Off) )
                (EngineB = Firing))))

```

primitive location

goal constraint (hidden state)



➤ act on hidden state



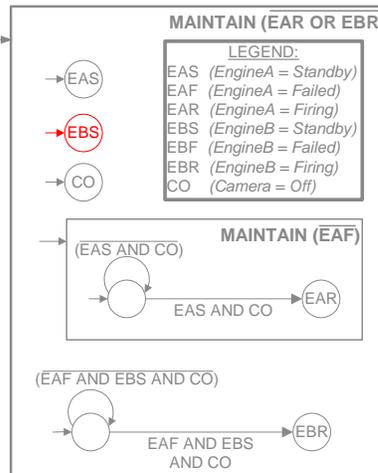
Compiling RMPL to HCA



```

OrbitInsert():
(do-watching ((EngineA = Firing) OR
              (EngineB = Firing))
(parallel
  (EngineA = Standby)
  (EngineB = Standby)
  (Camera = Off)
  (do-watching (EngineA = Failed)
    (when-donext ( (EngineA = Standby) AND
                  (Camera = Off) )
                  (EngineA = Firing)))
  (when-donext ( (EngineA = Failed) AND
                (EngineB = Standby) AND
                (Camera = Off) )
                (EngineB = Firing))))

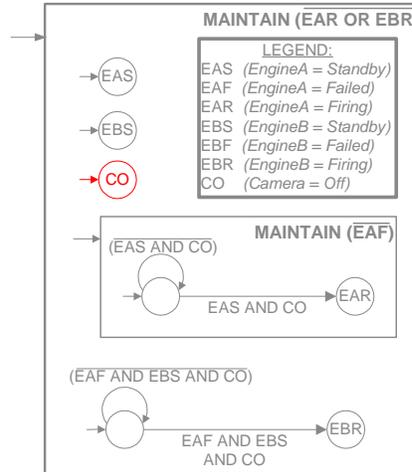
```



```

OrbitInsert():
(do-watching ((EngineA = Firing) OR
              (EngineB = Firing))
(parallel
 (EngineA = Standby)
 (EngineB = Standby)
 (Camera = Off)
(do-watching (EngineA = Failed)
 (when-donext ( (EngineA = Standby) AND
                (Camera = Off) )
              (EngineA = Firing)))
(when-donext ( (EngineA = Failed) AND
              (EngineB = Standby) AND
              (Camera = Off) )
              (EngineB = Firing))))

```

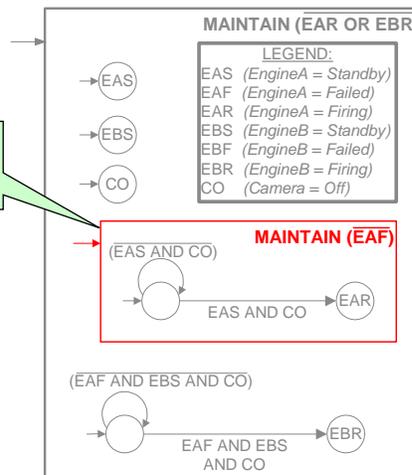


```

OrbitInsert():
(do-watching ((EngineA = Firing) OR
              (EngineB = Firing))
(parallel
 (EngineA = Standby)
 (EngineB = Standby)
 (Camera = Off)
 (do-watching (EngineA = Failed)
 (when-donext ( (EngineA = Standby) AND
                (Camera = Off) )
              (EngineA = Firing)))
(when-donext ( (EngineA = Failed) AND
              (EngineB = Standby) AND
              (Camera = Off) )
              (EngineB = Firing))))

```

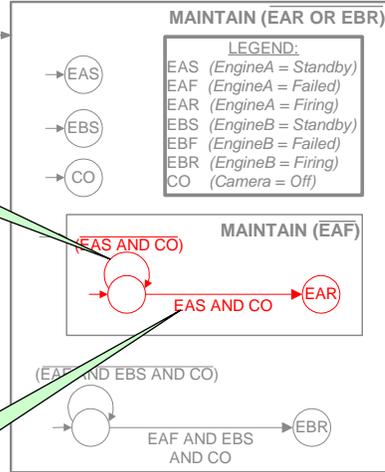
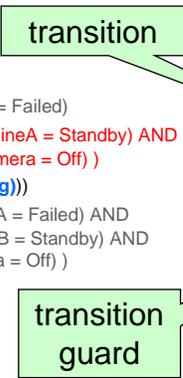
composite location



```

OrbitInsert():
(do-watching ((EngineA = Firing) OR
              (EngineB = Firing)))

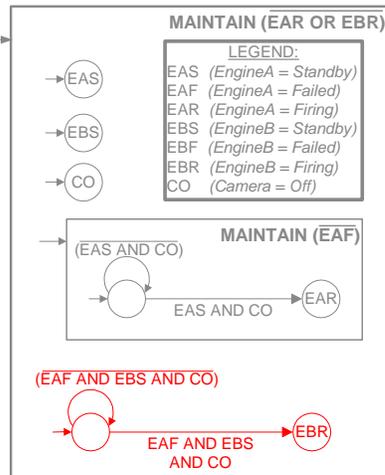
(parallel
  (EngineA = Standby)
  (EngineB = Standby)
  (Camera = Off)
  (do-watching (EngineA = Failed)
    (when-donext ( (EngineA = Standby) AND
                  (Camera = Off) )
      (EngineA = Firing)))
  (when-donext ( (EngineA = Failed) AND
                (EngineB = Standby) AND
                (Camera = Off) )
    (EngineB = Firing)))
  
```



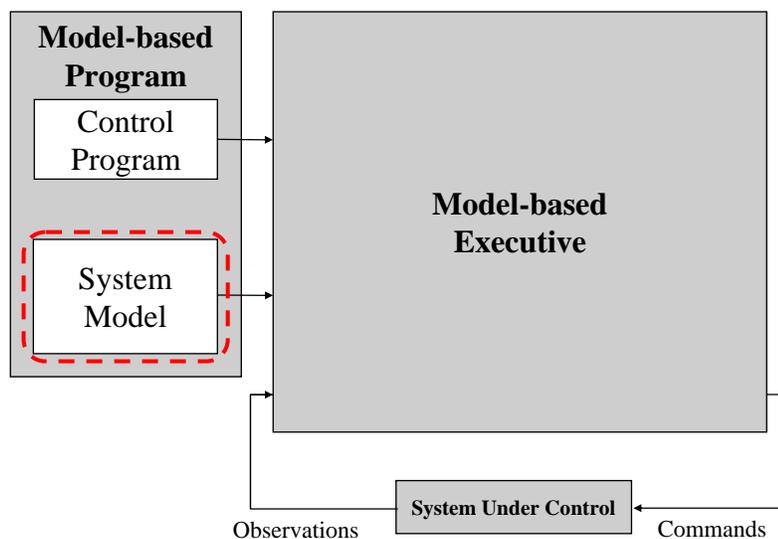
```

OrbitInsert():
(do-watching ((EngineA = Firing) OR
              (EngineB = Firing)))

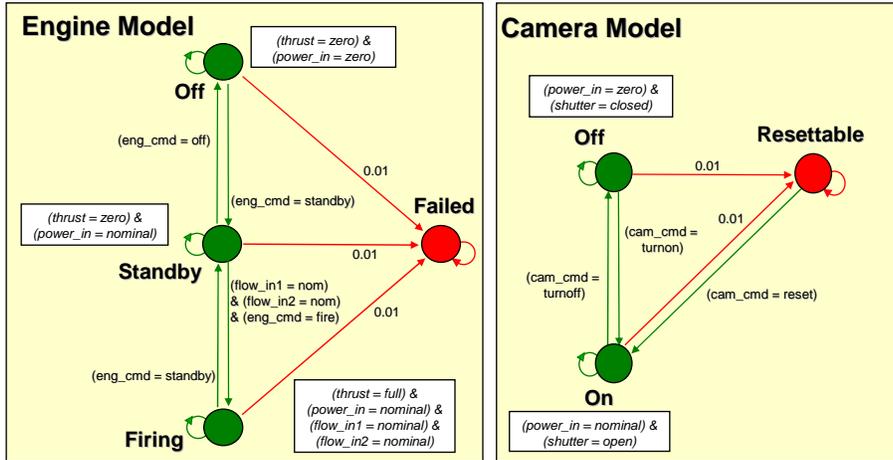
(parallel
  (EngineA = Standby)
  (EngineB = Standby)
  (Camera = Off)
  (do-watching (EngineA = Failed)
    (when-donext ( (EngineA = Standby) AND
                  (Camera = Off) )
      (EngineA = Firing)))
  (when-donext ( (EngineA = Failed) AND
                (EngineB = Standby) AND
                (Camera = Off) )
    (EngineB = Firing)))
  
```



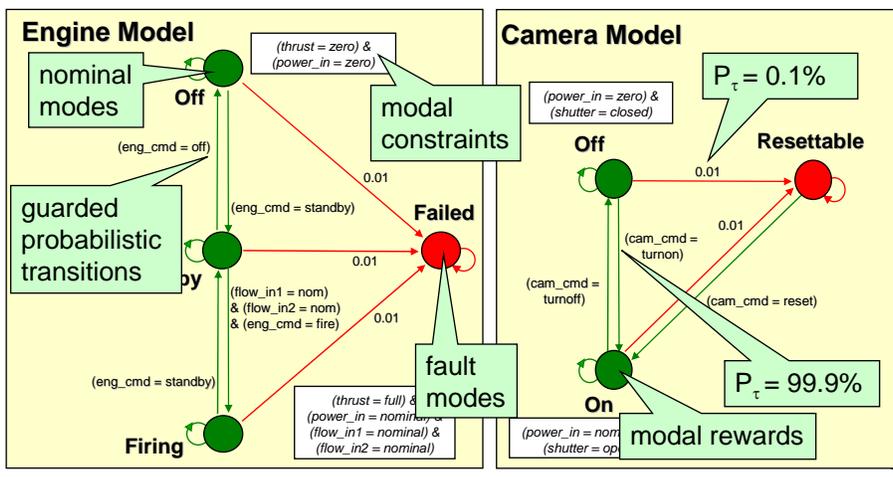
- Control programs can be viewed as *deterministic state transition* systems, acting on the plant by *asserting* and *checking* constraints in propositional state logic
- Propositions are *assignments of state variables* to values within their domains
- *Reactive combinators* allow flexibility in expression of complex system behavior and dynamic relations
- Similar to constructs in:
 - Concurrent Constraint languages (CC, TCC, PCCP, etc.),
 - Robotic execution languages (TDL, RAPs, ESL, etc.),
 - Synchronous programming languages (Esterel, Lustre, Signal, etc.)
 - Graphical specification representations (StateCharts, etc.)



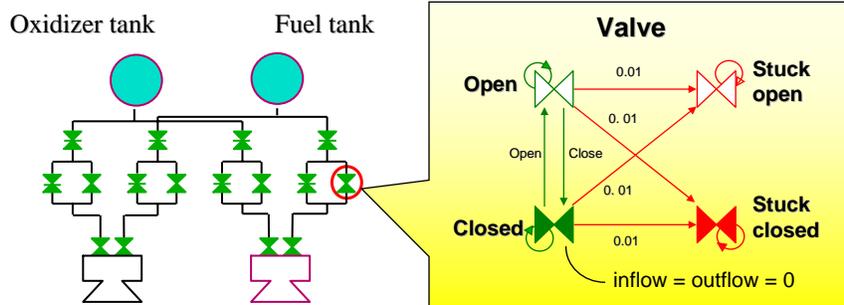
- Variant of *Factored POMDP* (component models, state not directly observable, next state probability distribution depends on current state and control actions)



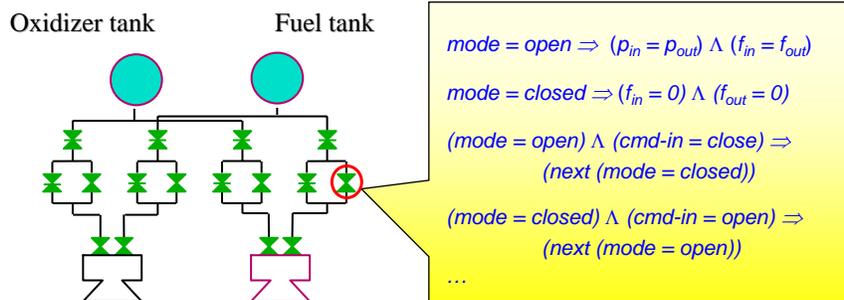
- Variant of *Factored POMDP* (component models, state not directly observable, next state probability distribution depends on current state and control actions)



- System Model captured as CCA

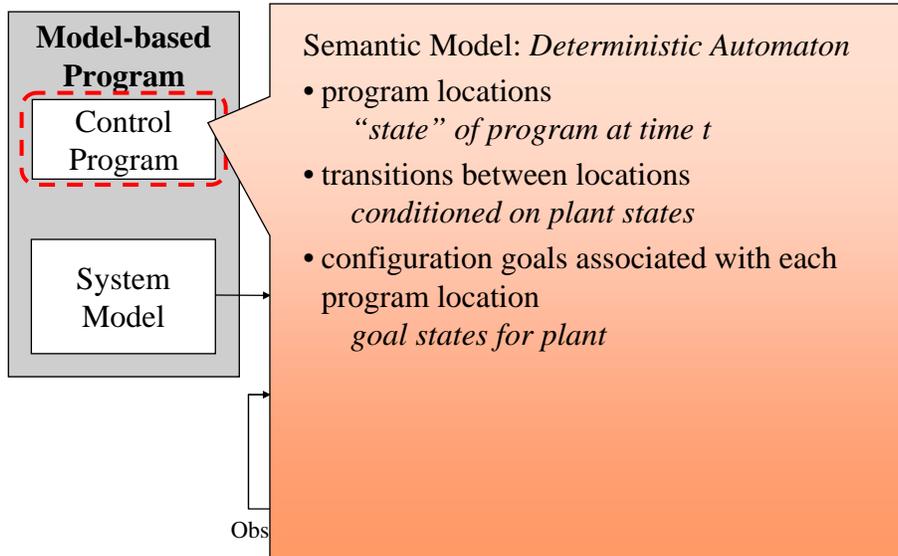


- System Model captured as CCA
- CCA representation translates directly to clauses in propositional logic
- Logical representation is used by reasoning algorithm in Deductive Controller

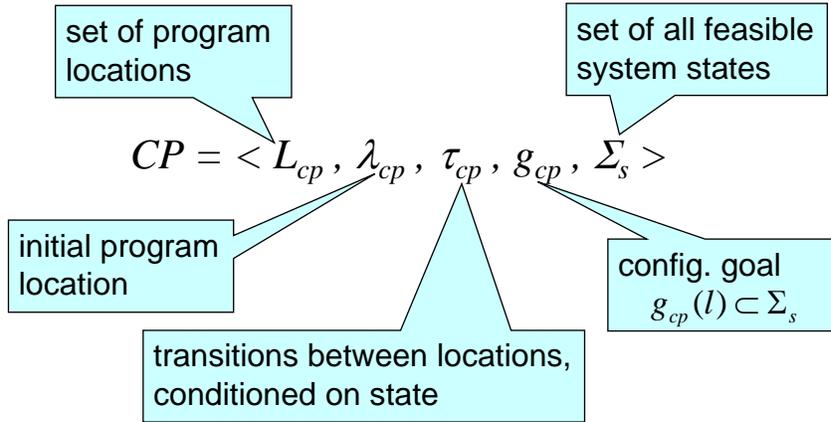


- The power of Model-based Programming lies in its rigorous underlying *semantics*
 - Defines the theoretical underpinnings of the approach
 - Allows us to derive useful properties of model-based programs
 - Allows us to make certain simplifying assumptions that enable tractable on-line deduction

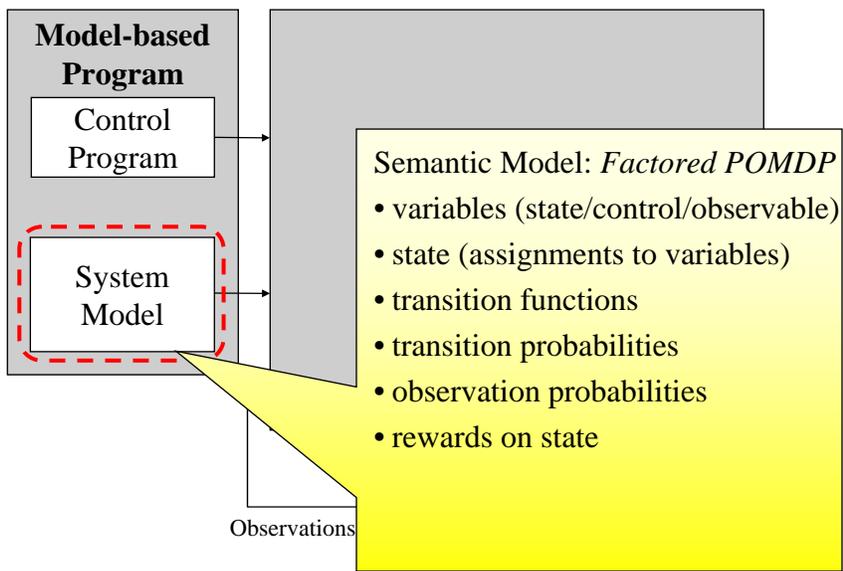
- Formal computational model has its roots in:
 - Automata Theory
 - Markov Decision Theory
 - Control Theory



- Control program represented as a *deterministic automaton*:



27



28

- Variables:

$$\Pi = \{ \Pi^s, \Pi^c, \Pi^o \}$$

\downarrow \downarrow \downarrow
 state control obs
 vars vars vars

Σ : full assignments σ over all vars in Π
 Σ_s : plant states s
 Σ_c : control actions μ
 Σ_o : observations o

- Factored POMDP:

$$SM = \langle \Sigma, T, P_\theta, P_T, P_O, R \rangle$$

transitions
 $\tau: \Sigma \rightarrow \Sigma_s$

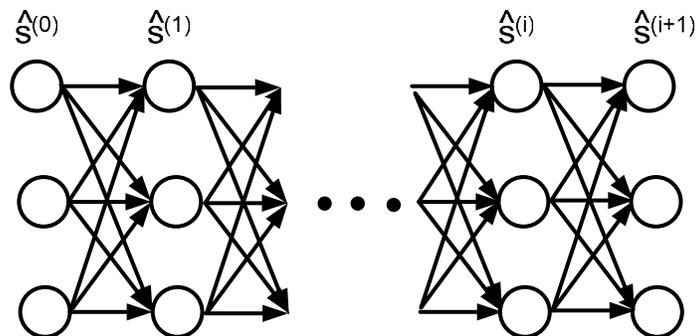
initial state
 prob $P_\theta(s_0)$

transition prob
 $P_T(s' | s, \mu)$

obs prob
 $P_O(o | s)$

state
 reward
 $R(s)$

- Can view all possible evolutions of system state, given a model-based program, in the form of a trellis diagram:



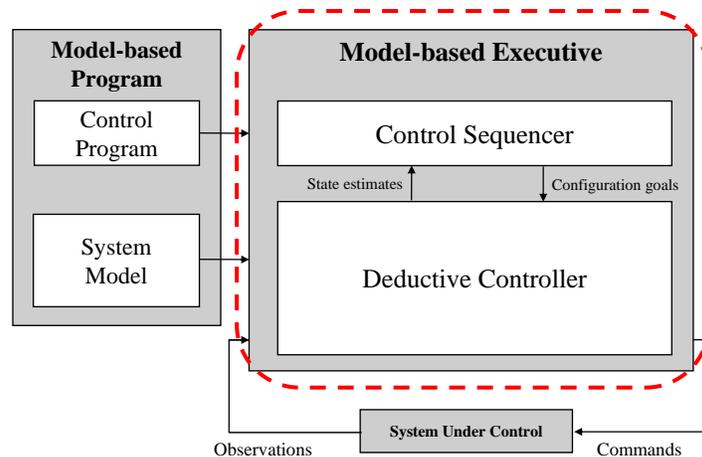
- Model-based program:
 - specification of state intent (Control Program)
 - specification of state behavior (System Model)

- Control Program:
 - Textual (procedural) and graphical representations
 - Hierarchical constructs provide flexibility & expressivity
 - Semantically represented as a deterministic automaton

- System Model:
 - Textual (logical) and graphical representations
 - Compositional description of system provides modularity
 - Semantically represented as a Factored POMDP

31

- Introduction to Model-based Execution:
 - Control Sequencer
 - Deductive Controller



32