

# Cyber-Physical Systems Research Challenges



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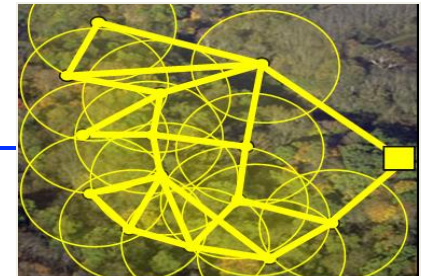


# NSF CPS AEB Membership

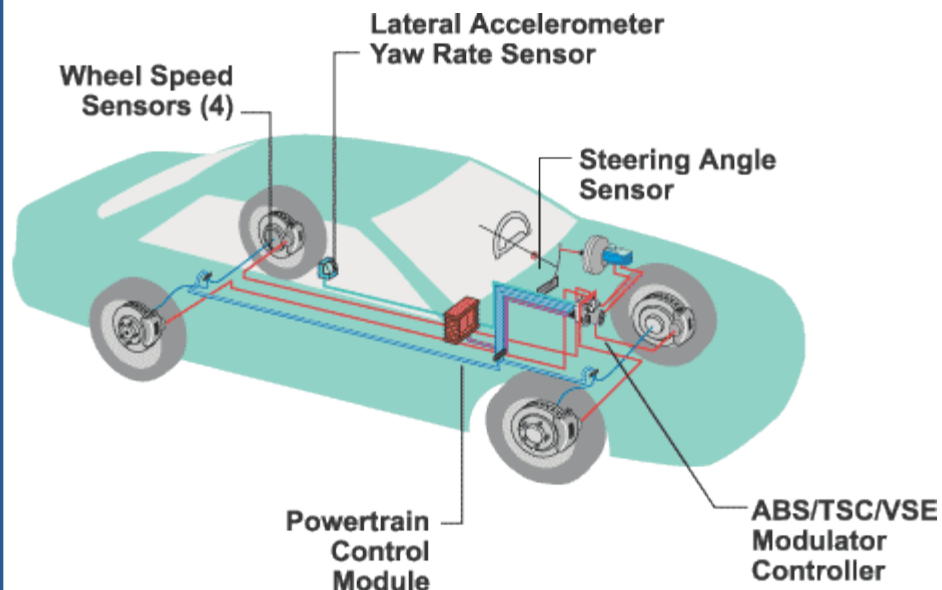


<input type="checkbox"/> George Pappas, U Penn	control
<input type="checkbox"/> Janos Sztipanovits, Vanderbilt	embedded software
<input type="checkbox"/> Edward Lee, UC Berkeley	education
<input type="checkbox"/> Eric Feron, Georgia Tech	avionics
<input type="checkbox"/> Jack Stankovic, Virginia	health monitoring/CCC
<input type="checkbox"/> Karl Hedrick, UC Berkeley	automotive
<input type="checkbox"/> Wei Zhao, Macau	real-time
<input type="checkbox"/> PR Kumar, UIUC	control, sensor nets
<input type="checkbox"/> John Baras, Maryland	systems engineering
<input type="checkbox"/> Vijay Kumar, U Penn	robotics
<input type="checkbox"/> John Mitchell, Stanford	security
<input type="checkbox"/> Anjan Bose, Washington State	smart grid
<input type="checkbox"/> Dimitri Mavris, Ga Tech	manufacturing
<input type="checkbox"/> Insup Lee, U Penn	real-time systems
<input type="checkbox"/> Bruce Krogh, CMU	control
<input type="checkbox"/> Nancy Lynch, MIT	distributed computing
<input type="checkbox"/> Claire Tomlin, UC Berkeley	hybrid systems
<input type="checkbox"/> Raj Rajkumar, CMU	real-time systems
<input type="checkbox"/> Daniela Rus, MIT	robotics

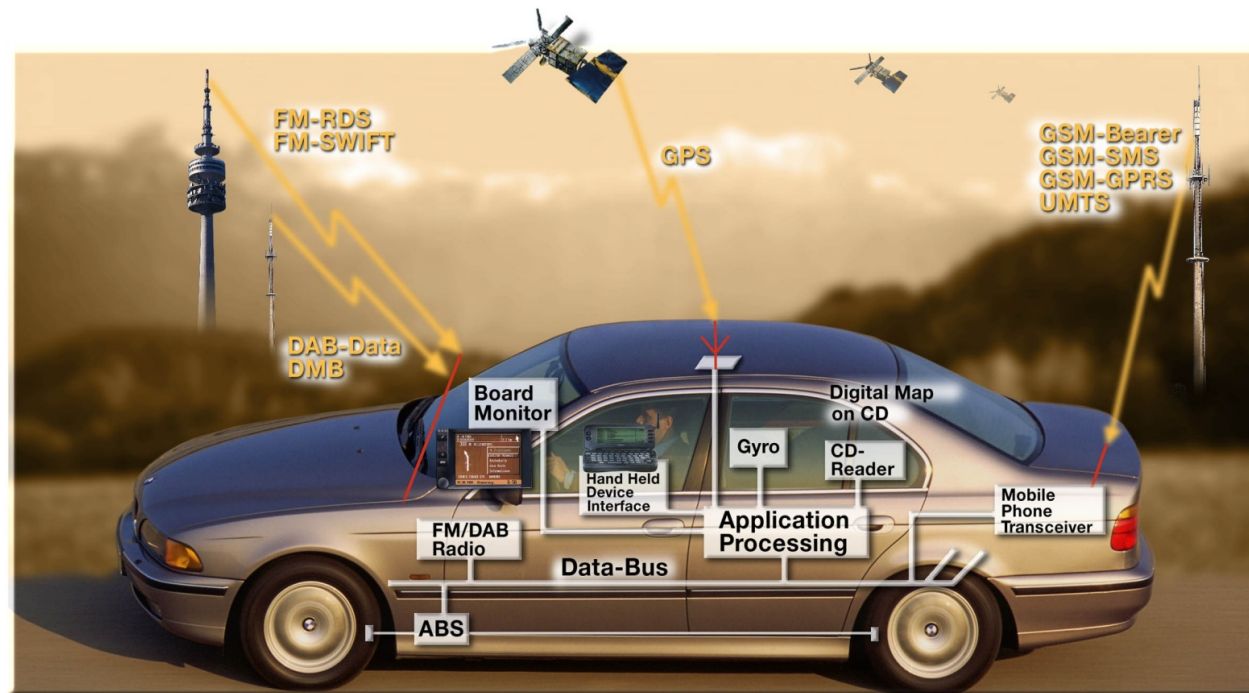
# Cyber-physical systems\*



\*Information systems interacting with physical systems, broadly



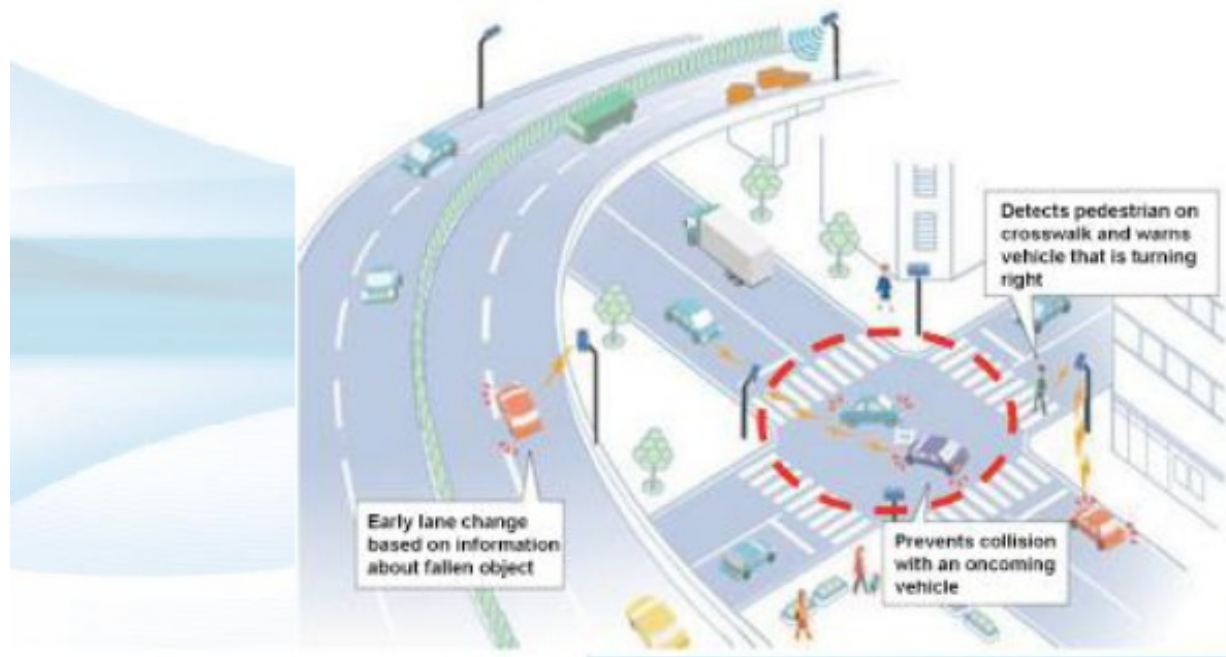
- Longitudinal dynamics : ABS (anti-lock brake system) and ASC (automatic stability control)
- Lateral dynamics : EDRC (engine drag reduction control) and CBC (corner braking control)
- DSC (dynamic stability control) is using all the above
- Also:
  - Automatic gearboxes
  - Anti-theft systems
  - Multimedia systems
  - Navigation systems
  - etc



- 270 user interactive functions
- 67 embedded platforms / (5 data buses?)
- 65 MB of binary code.
- Next generation (2010):
  - ~ 1 GB of software, IP is being studied

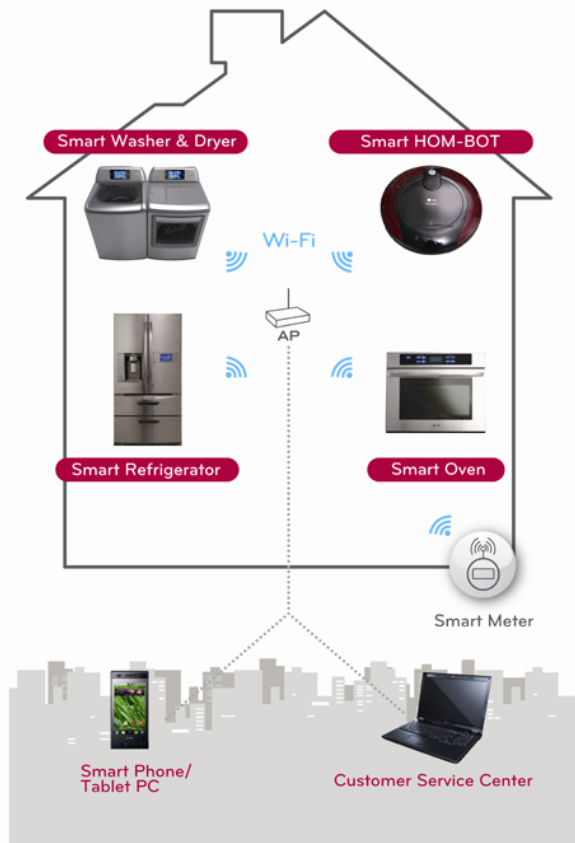
## Methods Gap - Cyber-physical systems (e.g. collision avoidance)

- Heterogeneous modeling – hybrid dynamics, wireless networking, dynamic agent scenarios
- Abstractions and refinements for synthesis and analysis – hierarchical systems structures
- Component composability and consistency – systems integration, rapid development
- Verification (within and across) design and implementation

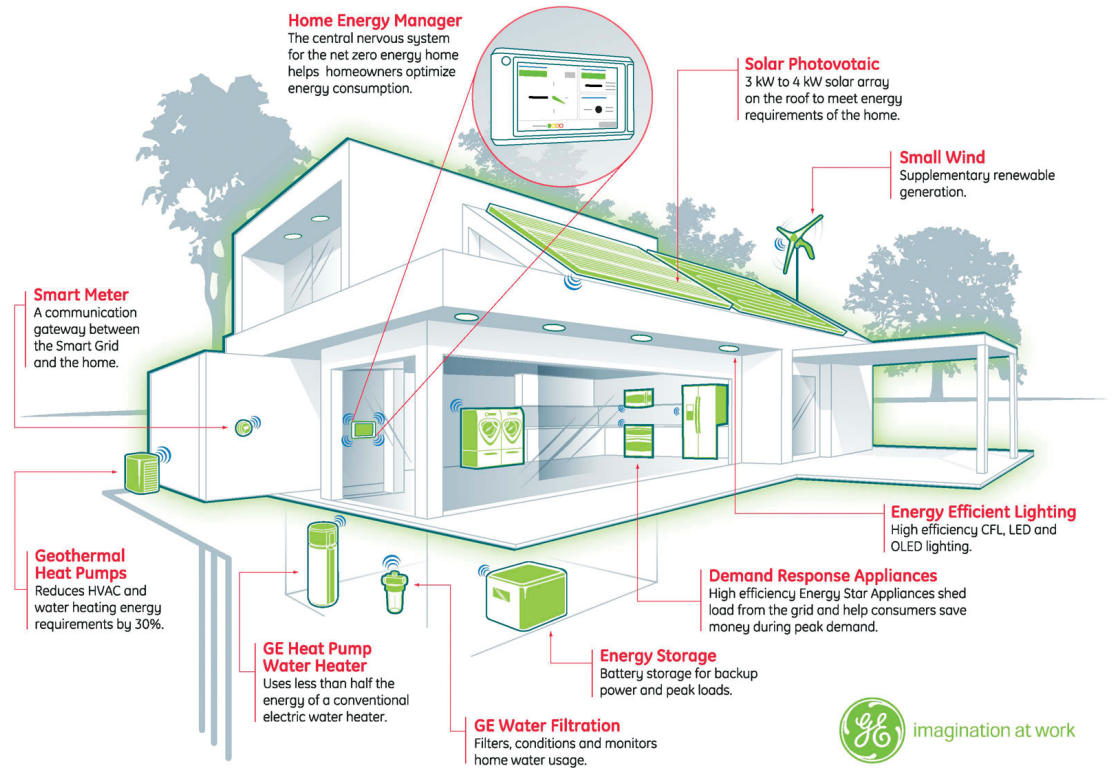


# Embedded in : Home appliances

## LG Smart Appliance with THINQ™ Technology



## GE Targets Net Zero Energy Homes by 2015

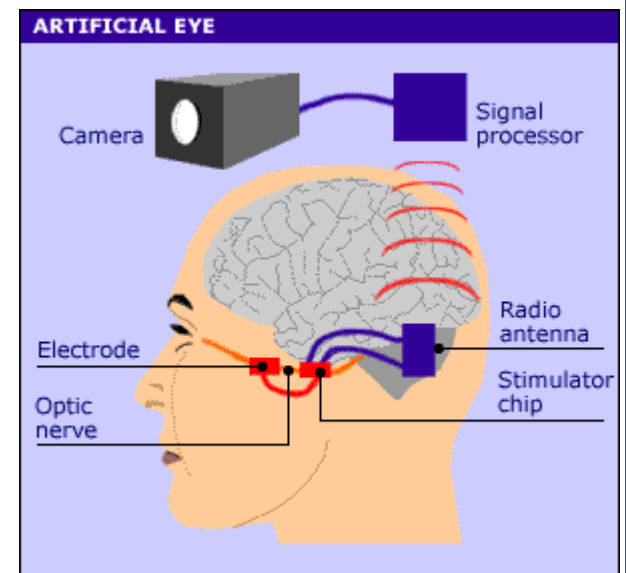


Vision : Doctor-on-a-chip, artificial eye

Operating room of the future & Digital hospital

Remote monitoring of elderly (body area networks)

Medical implants (artificial eyes, ears etc)



BBC news



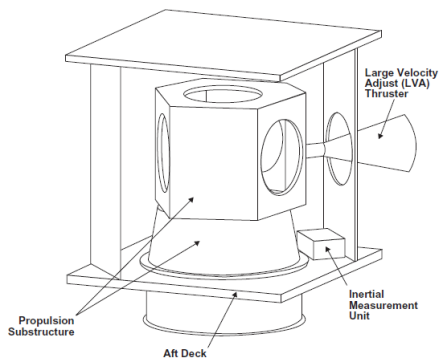
CPS is impacting numerous critical sectors of society

- Energy (SmartGrid, Microgrids, Green Buildings)
- Health (Medical devices)
- Automotive/Transportation (Mobile Millennium)
- Aerospace/Air traffic control (NextGen)
- Infrastructure monitoring (bridges, lakes )
- DoD (META)
- Robotics (medical robotics, mobile sensor networks)
- Next generation flexible manufacturing?

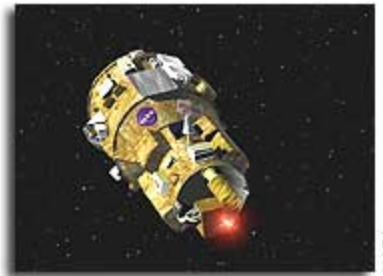
Tremendous potential for broad impact

# CPS problems due to software-system interactions

1998: Near Earth Asteroid Rendezvous (NEAR)



2005: Demonstration of Autonomous Rendezvous Technology (DART)



1996: Ariane 5



1991: Patriot Missile Software Failure



Caltech's 2005 DARPA Grand Challenge Entry, Alice



1997: Korean Air 747 in Guam



# Northeast Blackout

August 14, 2003

A programming error has been identified as the cause of the Northeast power blackout. The failure occurred when **multiple computer systems trying to access the same information at once** got the equivalent of busy signals.

[Associated Press]

Price tag: \$ 6-10 billion

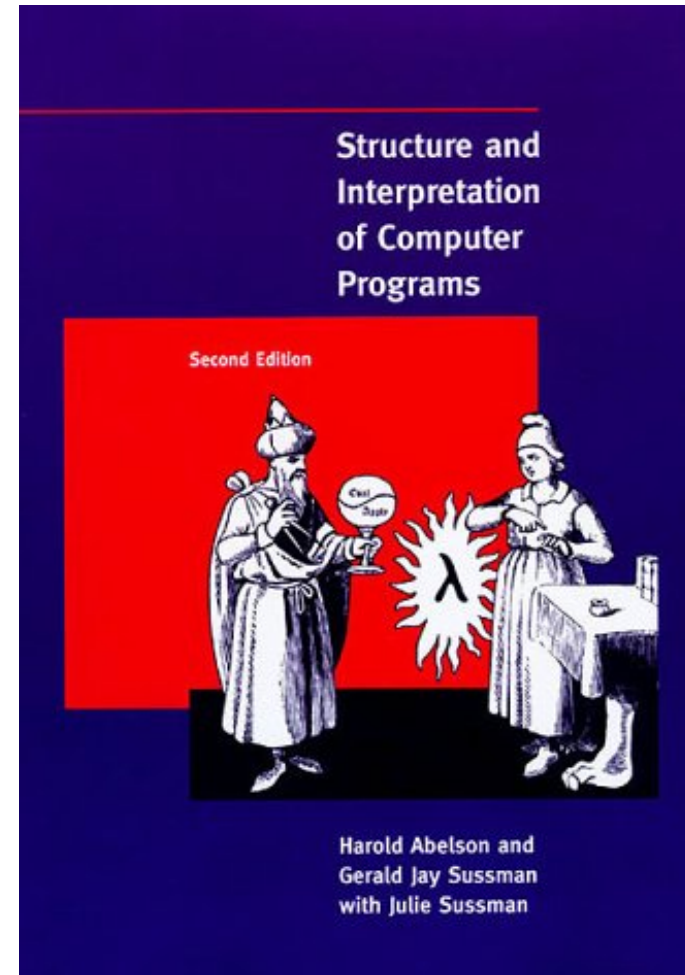
ISAT GeoStar 45  
23:15 EST 14 Aug. 2003

003 / 45 / 7844

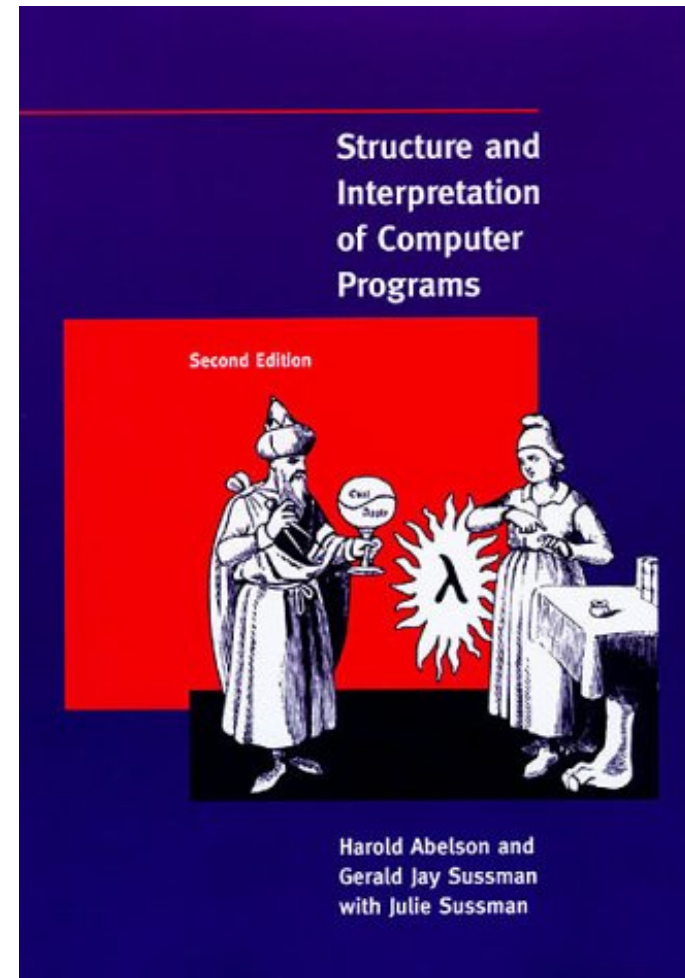


## Research Challenges

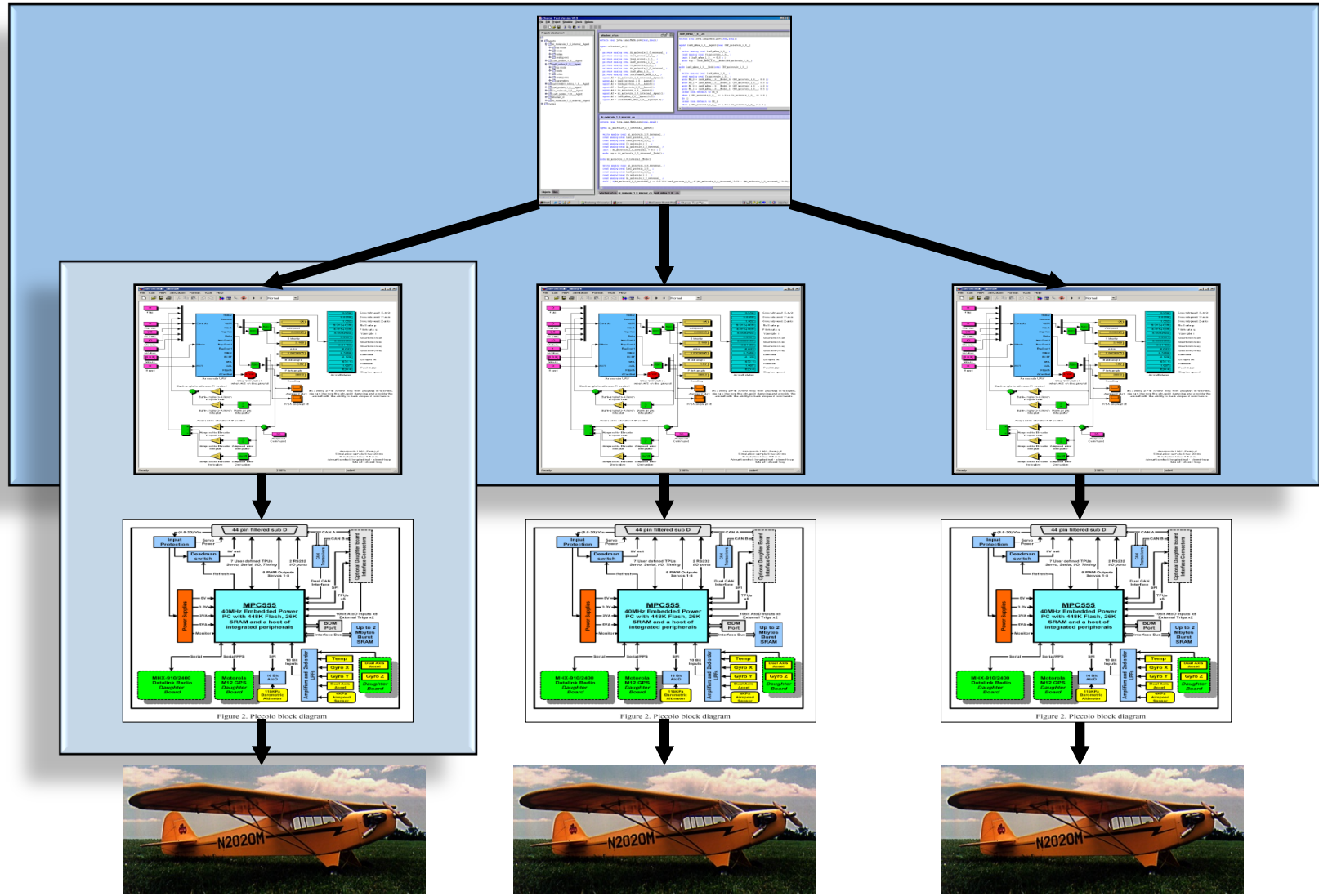
- Part I :            Modeling
- Part II:            Verification
- Part III:          Robustness
- Part IV:          Security

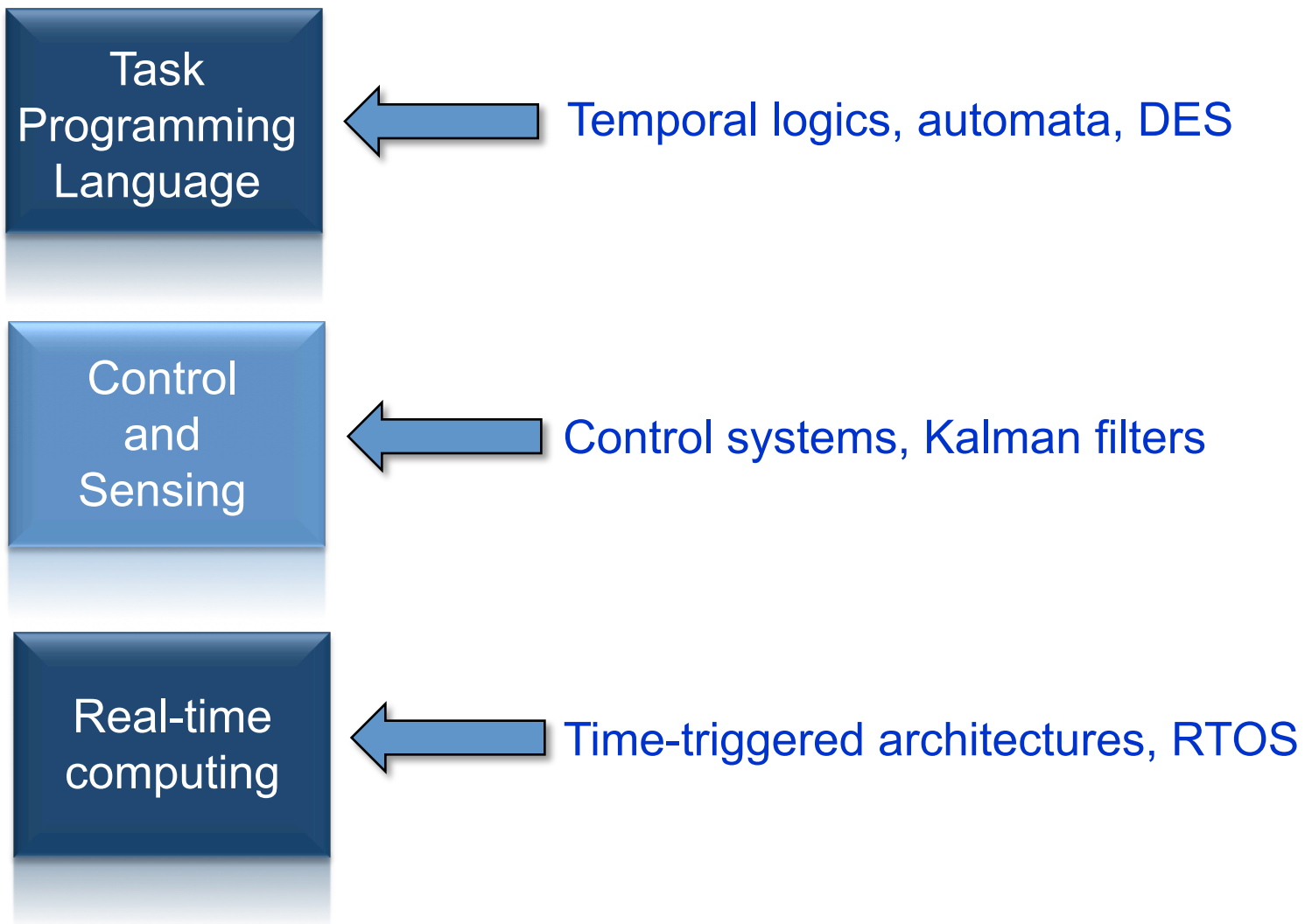


## Part I : Modeling challenges



# Control and computing hierarchies





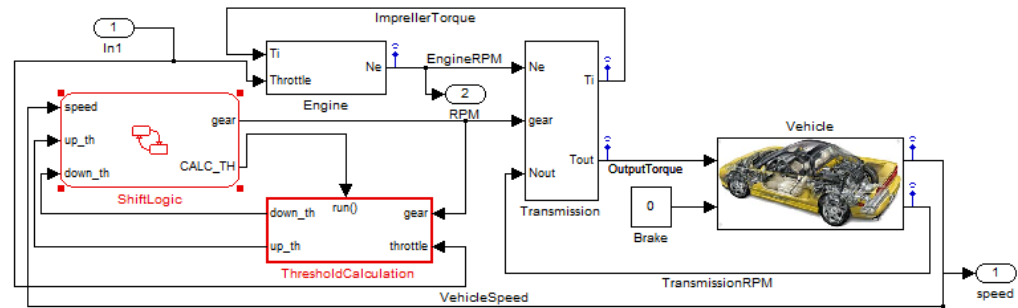
# A CS view of the same hierarchy

Task Programming Language



$$\varphi = \left( \begin{array}{l} \neg s_{Waldo} \\ \wedge \square (s_{Waldo} \rightarrow \bigcirc s_{Waldo}) \\ \wedge \square \left( \left( \bigwedge_{i \in \{1,3,5,8\}} \neg r_i \right) \rightarrow (s_{Waldo} \leftrightarrow \bigcirc s_{Waldo}) \right) \\ \wedge \square \diamond (True) \end{array} \right) \rightarrow \left( \begin{array}{l} r_{12} \wedge_{i \neq 12} \neg r_i \\ \wedge \square (r_1 \rightarrow \bigcirc r_1 \vee \bigcirc r_9) \\ \vdots \\ \wedge \square \left( \bigvee_{j \neq i} (\bigcirc r_i \wedge \neg \bigcirc r_j) \right) \\ \wedge_{i \in \{1,3,5,8\}} \square ((r_i \wedge \bigcirc s_{Waldo}) \rightarrow \bigcirc r_i) \\ \wedge_{i \in \{1,3,5,8\}} \square \diamond (r_i \vee s_{Waldo}) \end{array} \right)$$

Control and Sensing



Real-time computing



```
float updatePI(pi_block* pi, float vi);
/* Integrator Block 1 */
void integratorI1 {
  double in1, in2; /* Two inputs */
  double curTime; /* Current time */
  double deltaT;

  curTime = getTime();

  in1 = Input(1); /* Read input 1 */
  in2 = Input(2); /* Read input 2 */

  deltaT = curTime - prevTime;
  prevTime = curTime;

  x1 += deltaT*0.5*(in1 + prevIn1);
  x2 += deltaT*0.5*(in2 + prevIn2);

  prevIn1 = in1;
  prevIn2 = in2;
}

/* Proportional Block P code */
void blockI1 {
  double in1, out1; /* Input & output */

  in1 = Input(1); /* Read input 1 */

  /* Compute the output */
  out1 = 116.0*in1 + 480.0*x1;

  Output(1, out1); /* Write output 1 */
}
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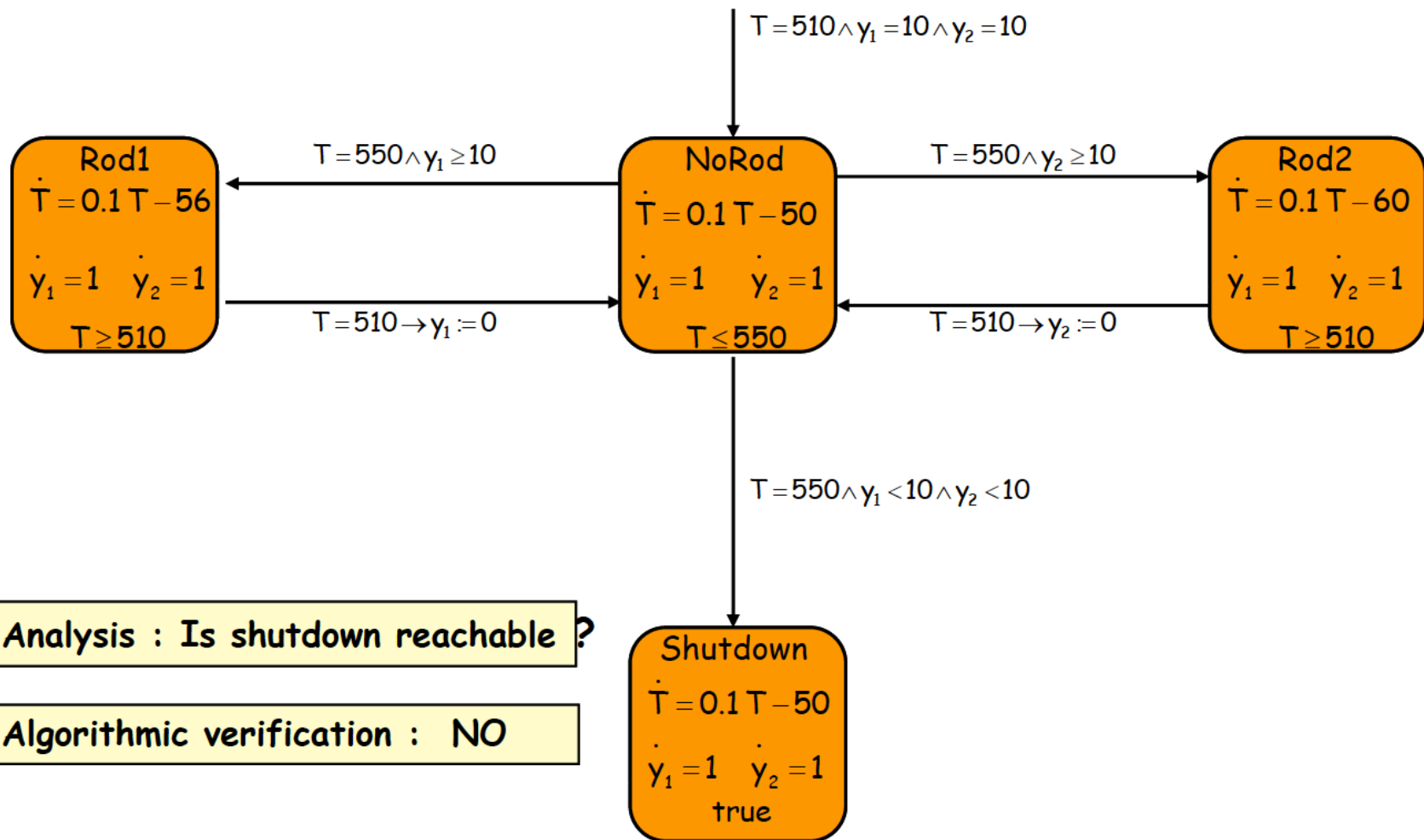
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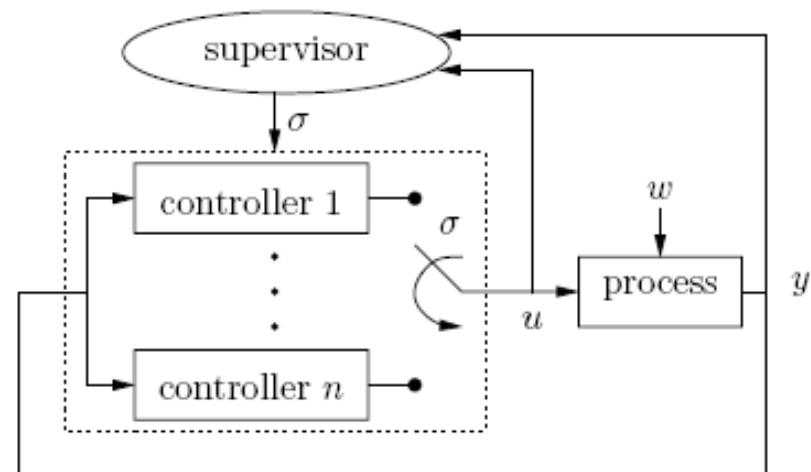
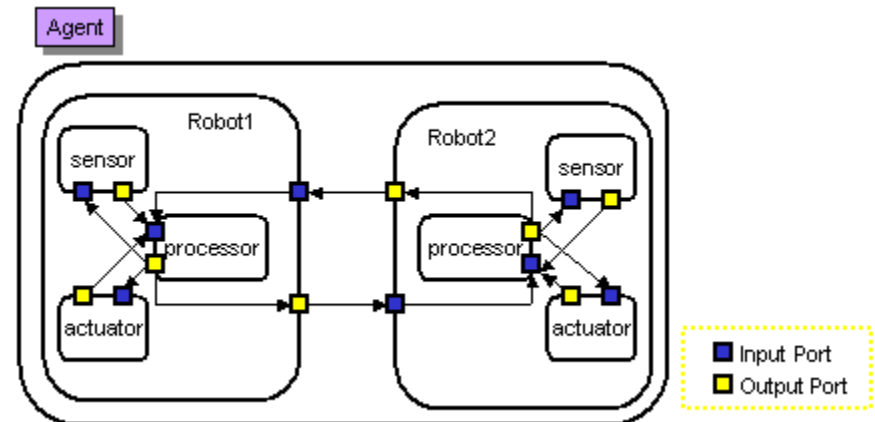


# Hybrid model of nuclear reactor



# A zoo of hybrid systems

- Hybrid Automata
- Hybrid Input-Output Automata
- Hybrid Petri Nets
- Simulink/Stateflow MATLAB models
- Supervisory control systems
- Switched systems
- Nonsmooth systems
- Piece-wise affine systems (PWA)
- Mixed Logical Dynamical
- Linear complementarity models



Time-triggered: Switching depends on time only  
Switching and dynamics are decoupled  
Switching times are known a priori  
Switched systems more appropriate

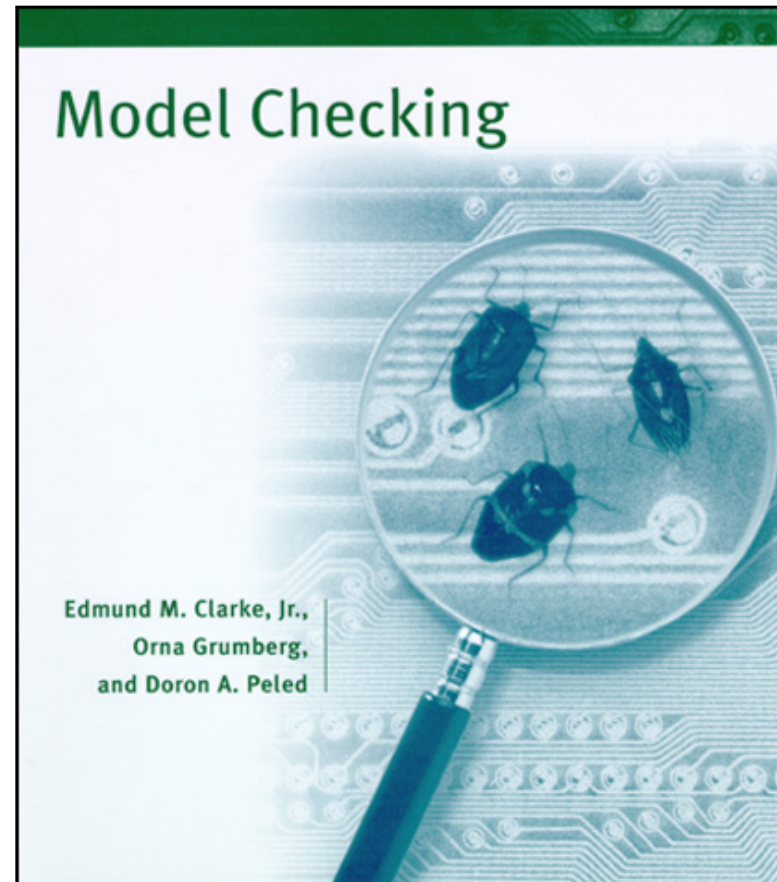
Event-triggered: Switching also depends on state  
Switching and dynamics are coupled  
Switching times not known a priori  
Hybrid automata more appropriate

Similarly there is a large variety of concurrency/synchronization types

A richer, systems view of computer science is needed. Ingredients include:

- ❑ Enriching CS models with relevant physical/resource properties
  - Physical, model-based computing
  - Resource aware (time/energy) computing
  
- ❑ Formal composition of **multiple** physics, models of computing, languages
  - Composition of heterogeneous components
  
- ❑ Impact of cyber components on physical components and vice versa
  - Physically-aware computing

## Part II : Composable verification for CPS

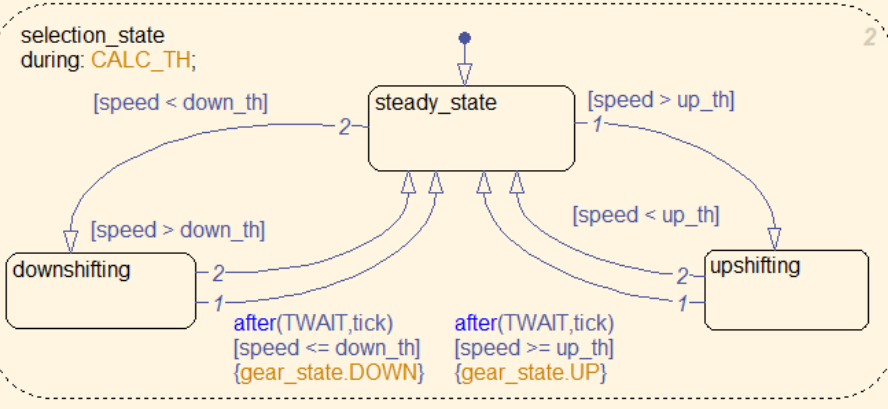
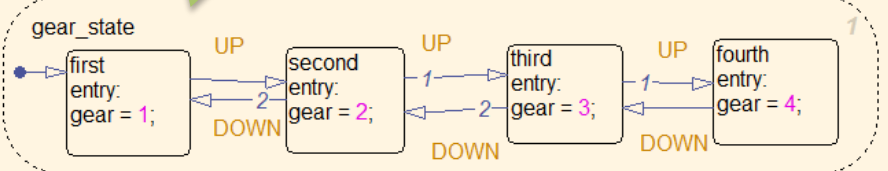
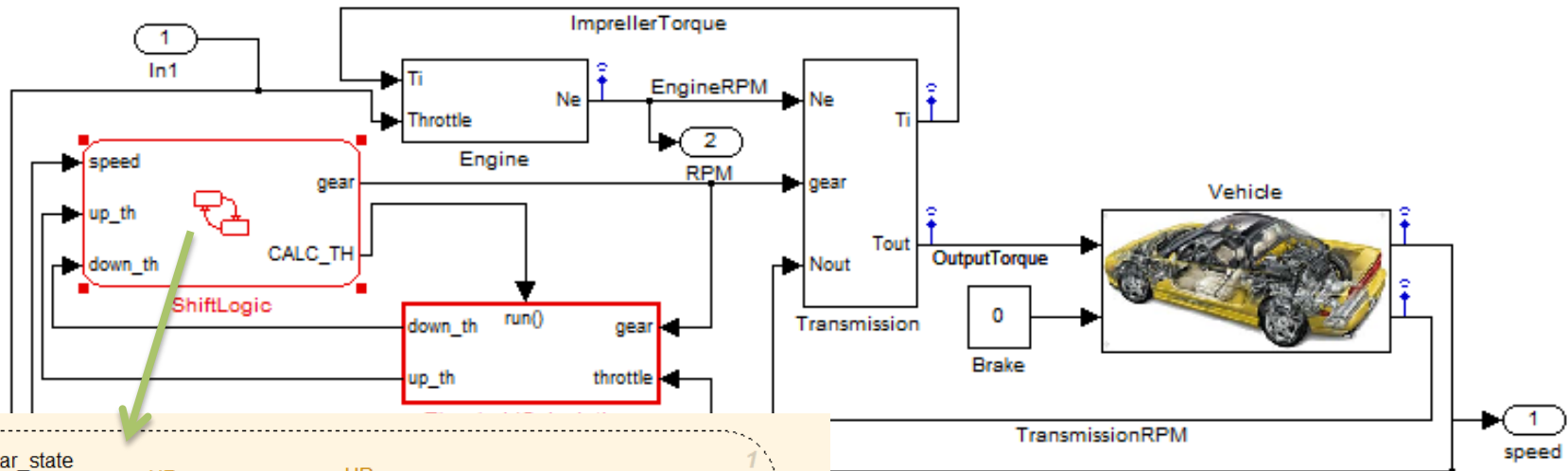


Safety verification: Is  $\text{Reach}(S) \cap S_f$  empty?

Model checking: Does  $S$  satisfy temporal logic formula  $\phi$  ?

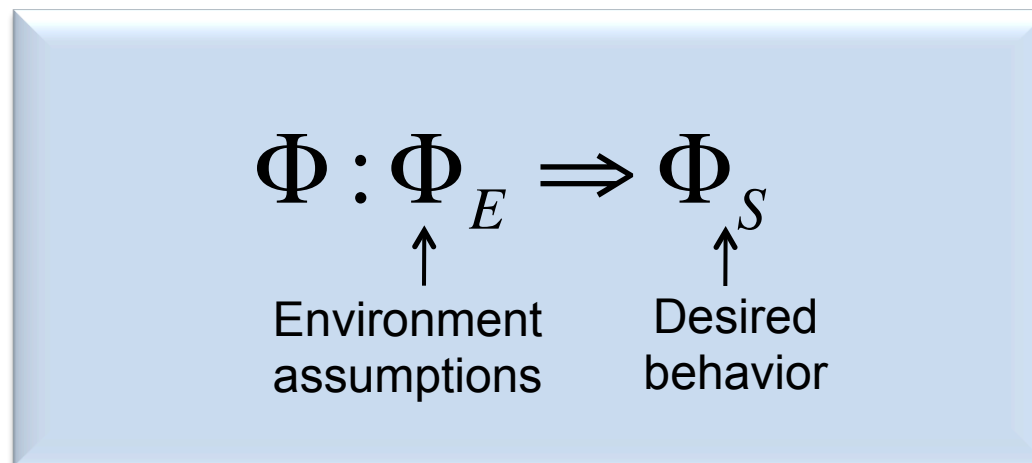
Controller Synthesis: Does  $S \parallel C$  satisfy temporal logic formula ?

# Automatic transmission verification



1. the vehicle speed  $v$  exceeds 120km/h
2. the engine speed  $\omega$  exceeds 4500RPM
3. all states are reached in the switching logic

- Consider component specifications of the form



If the component assumptions are met, then desired behavior should be guaranteed

Assumptions can model other components, physical or computational



# How to analyze the overall design?

Task  
Programming  
Language



Control  
and  
Sensing



Real-time  
computing

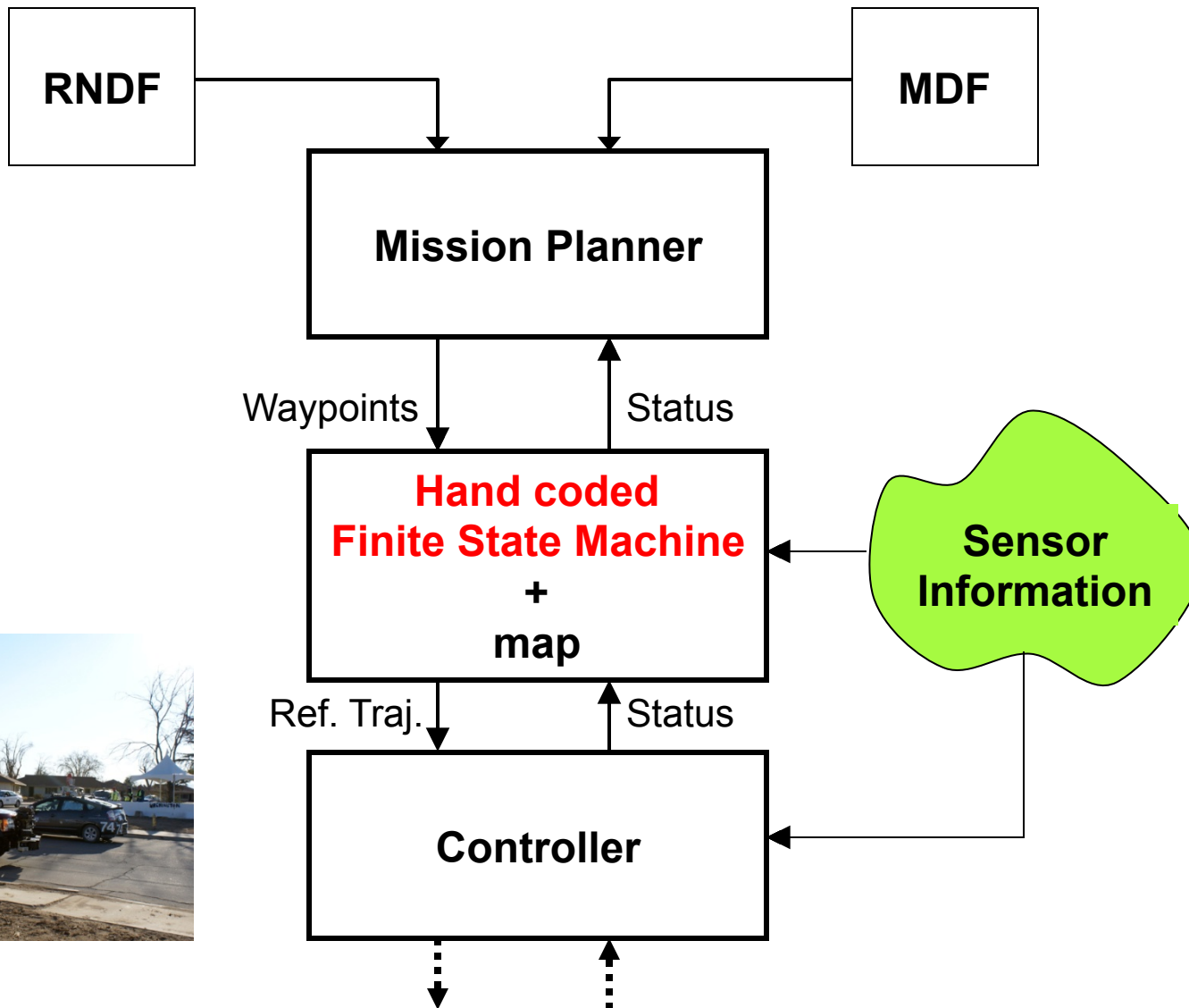
## Technical Challenges

Composable interfaces between  
control and computing components

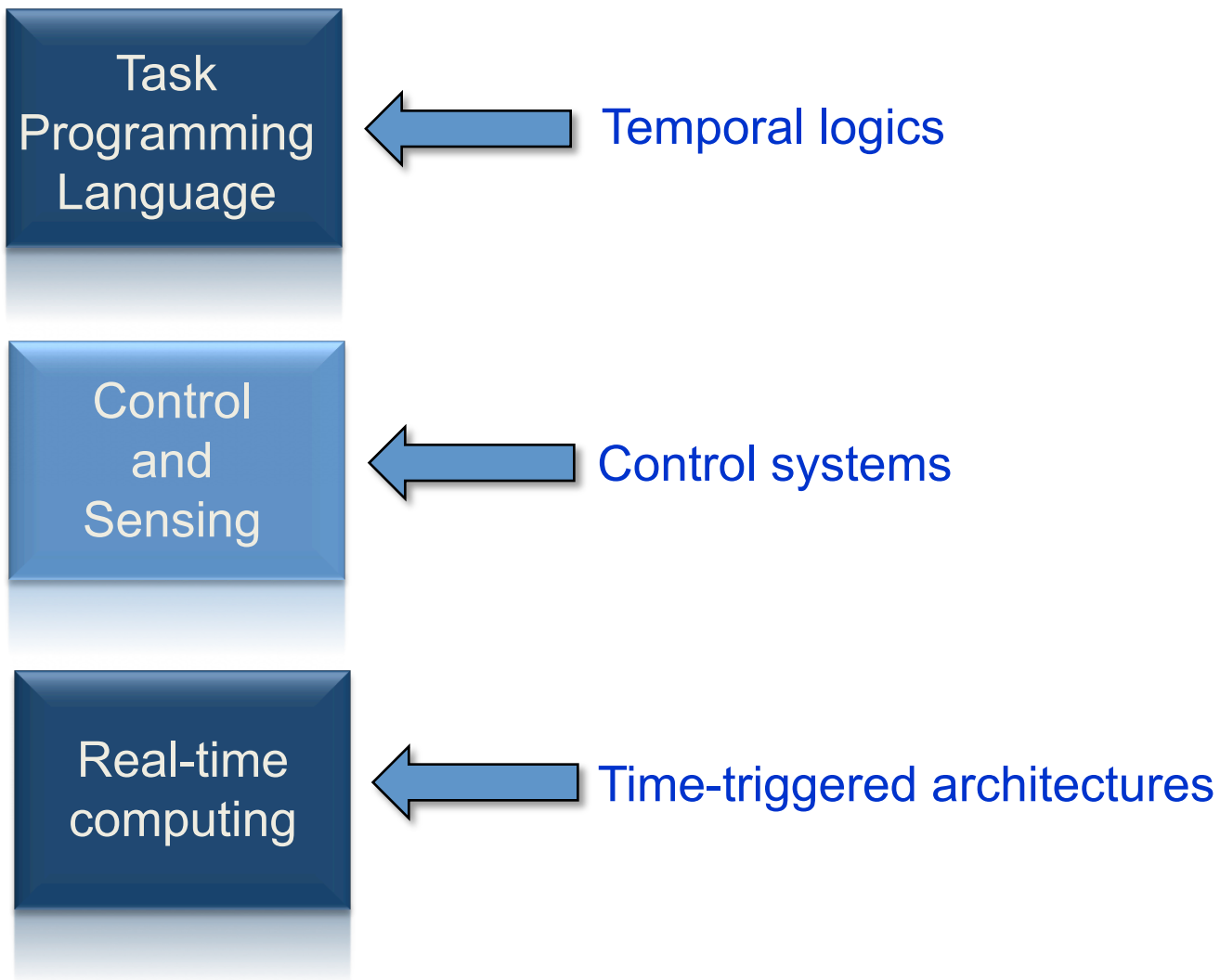
- ❑ From verification of C and P systems to verification of CPS systems
- ❑ Compositional verification and design
  - Requires composable interfaces
  - Assume-guarantee reasoning (contracts)
- ❑ Tradeoffs between different system views
  - Control performance versus scheduling flexibility
  - Understanding the price of compositionality
- ❑ From methods for flat CPS to methods for distributed CPS systems
- ❑ From verification methods to synthesis and code-generation

## Part III : Robustness





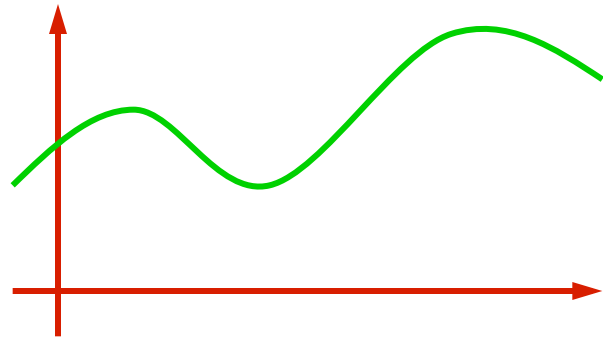
# Control and computing hierarchy



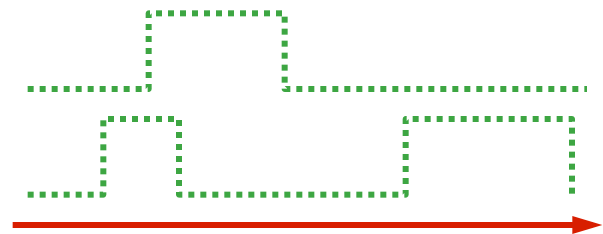
## From exact to approximate

- Exact relationships useful for binary answers/relations
- Exact results are fragile with respect to uncertainty
- When interacting with the physical world, we need approximations
  - Labeled Markov processes (Desharnais et. al., TCS 2004)
  - Quantitative transition systems (de Alfaro et. al., ICALP 2004)
  - Quantitative generalizations of languages (Henzinger, DLT 2007)
- Approximate system relationships
  - Enable larger system “compression”
  - Quantify error/complexity tradeoffs
  - Provide measures of robustness
  - Potentially introduce different algorithms

# Boolean testing & verification of CPS



A/D  
Boolean abstraction

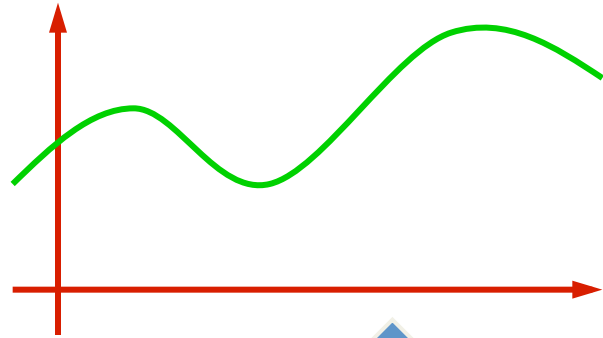


LTL / MTL  
 $\Phi = G(p_1 \rightarrow F_{\leq 2} p_2)$

Testing/Verification Algorithm

Truth Value  
{true, false}

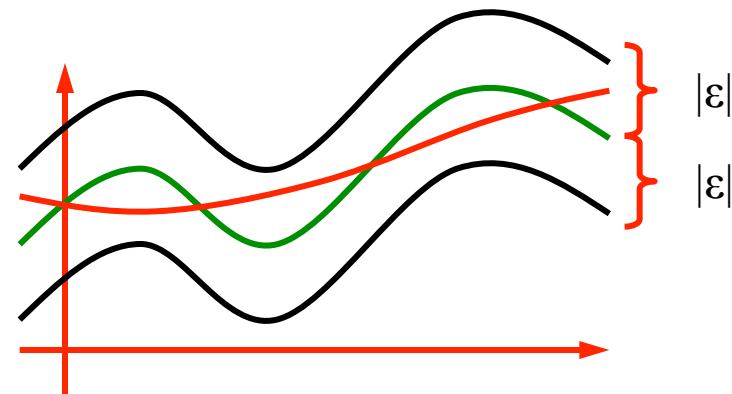
- [Maler and Nickovic '04]
- [Thati and Rosu '04]
- [Rosu and Havelund '05]
- [Geilen '01]
- others ...



LTL / MTL  
 $\Phi = G(p_1 \rightarrow F_{\leq 2} p_2)$

**Robust Testing/  
Verification  
Algorithm**

Robustness Estimate  
 $\varepsilon$



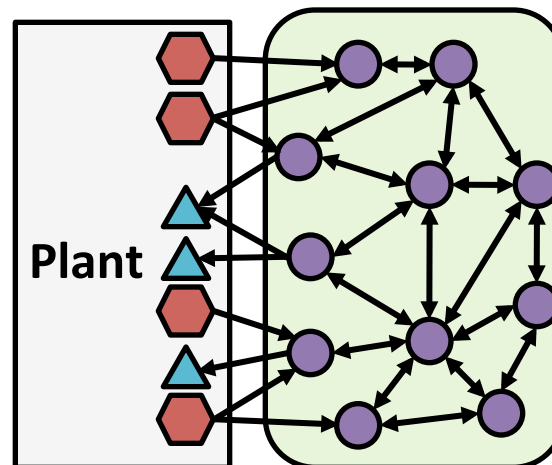


- ❑ Computing needs to transform from exact to approximate.
  - From boolean to robust computing
  - From qualitative to quantitative
- ❑ Robust computing interacting with uncertain world (stochastic)
  - Uncertainty due to P or C components, networking
  - From deterministic to stochastic verification
- ❑ Robustness verification of CPS systems
  - Closer to sensitivity analysis
- ❑ Verification of numerical software

## Part IV : CPS Security Beyond Cybersecurity



- Many CS efforts focus on building security walls
- What happens after a fault or after an attack?
- What if certain wireless nodes become faulty or malicious?



- Security of control networks in industrial control systems is a major issue [NIST Technical Report, 2008]
  - Data Historian: Maintain and analyze logs of plant and network behavior
  - Intrusion Detection System: Detect and identify any abnormal activities
- Is it possible to design an Intrusion Detection System (IDS) to determine if any nodes are not following protocol?
- Can IDS scheme avoid listening all nodes? Under what conditions? Which nodes?

- ❑ CPS Beyond cybersecurity
  - From pre-attack defense to post-attack methods
  - Detection, identification, reconfiguration, graceful degradation
- ❑ Theory of resilient and trustworthy CPS
  - Security/trust metrics
- ❑ Privacy for CPS
  - Crucial in many contexts (i.e. medical CPS)
  - Interesting ideas in database theory (differential privacy)