

## Model Synthesis

### New Challenges in Model Based Design

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Medical CPS NSF Site Visit, Jan 2012



### Software: Key to Embedded Revolution



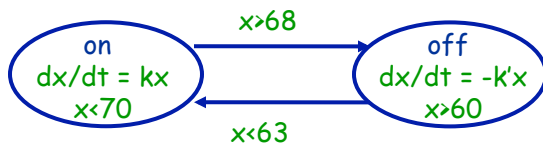
Software → New features, Automation, Customization

~~Software~~ Bugs, Unpredictability, Recalls



## Hybrid Systems

State machines + Dynamical systems



### Computer Science

- Automata/Logic
  - Concurrency
  - Formal verification
  - + Control Theory
  - Optimal control
  - Stability analysis
  - Discrete-event system
- Software + Environment

### Automotive



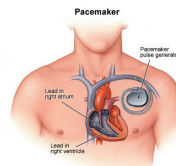
### Coordination Protocols



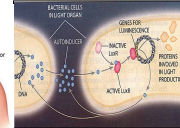
### Robotics



### Medical Devices



### Systems Biology



## Model Based Design for Embedded Software

Can we formally prove safety properties of models?

Formal Specification  
Environment Model

Can we infer properties of code from properties of models?

Metrics

Programming/Modeling Language  
Based on Hybrid Automata

Design and Analysis Tools  
Simulation, Verification, Optimization

Platform Description

Compiler +  
Scheduler

Libraries in Base Language

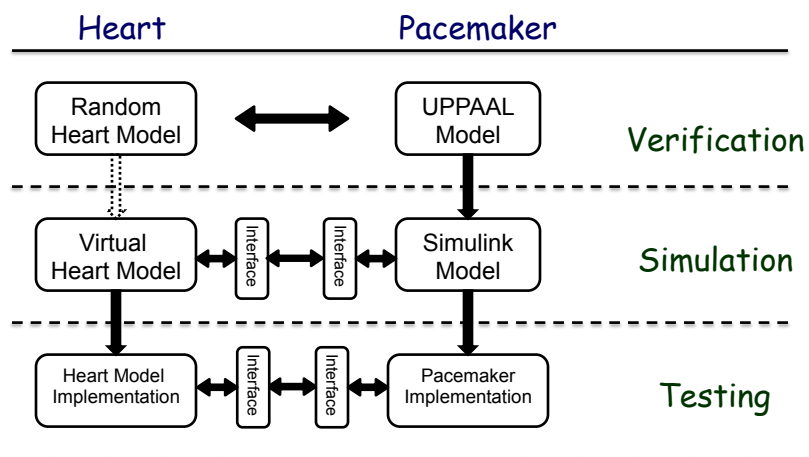
Executable Code on  
Embedded Processor



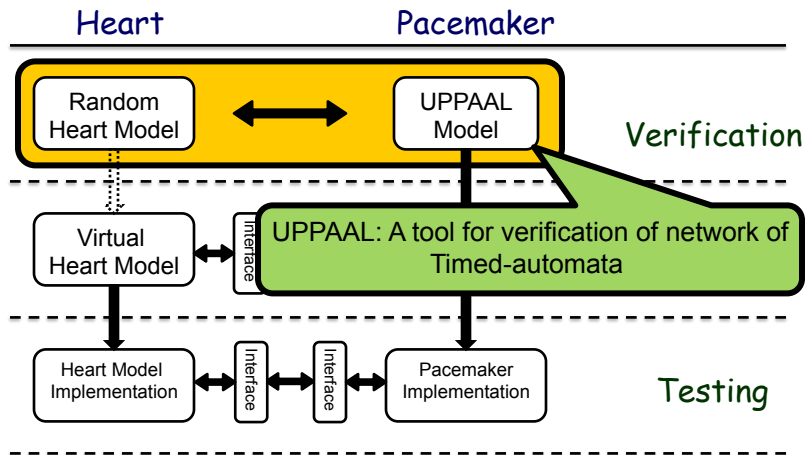
## Medical Devices

- ❑ From 1985-2005, nearly 30,000 deaths and 600,000 injuries from device failures
- ❑ From 1996-2006, the percentage of software-related causes in medical device recalls have grown from 10% to 21% (Complexity ↑ → Potential safety violations ↑)
- ❑ There is currently no well-established standards for development of software for medical devices

## Model-based Pacemaker Software Design

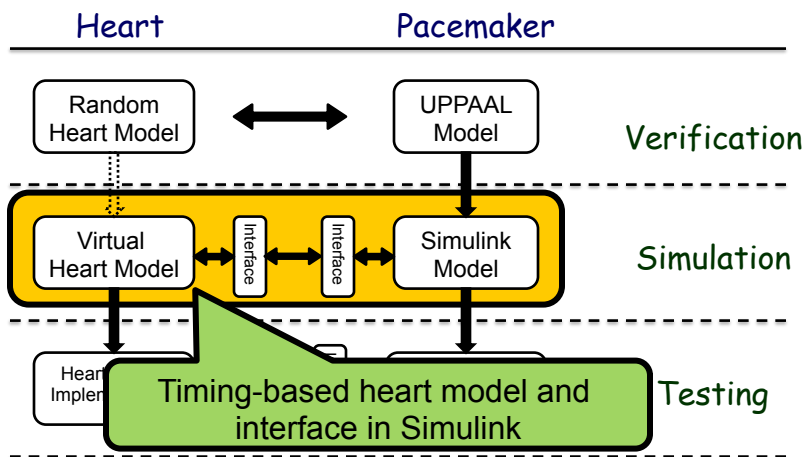


## Model Verification



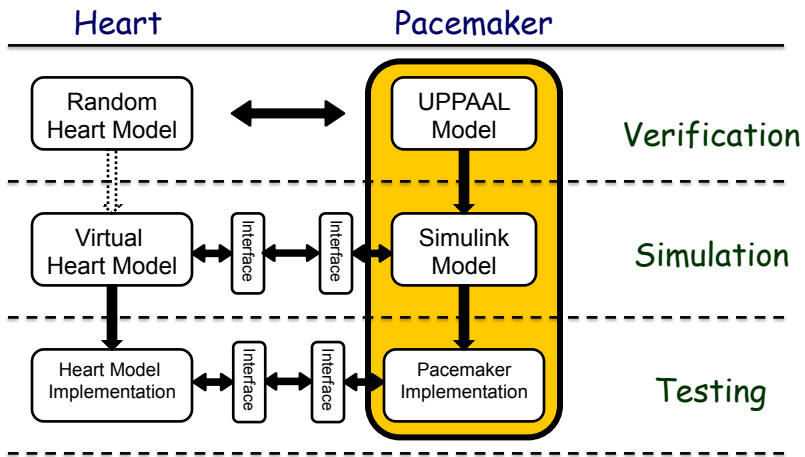
*Jiang, Pajic, Moarref, Alur, Mangharam, TACAS 2012*

## Model Simulation



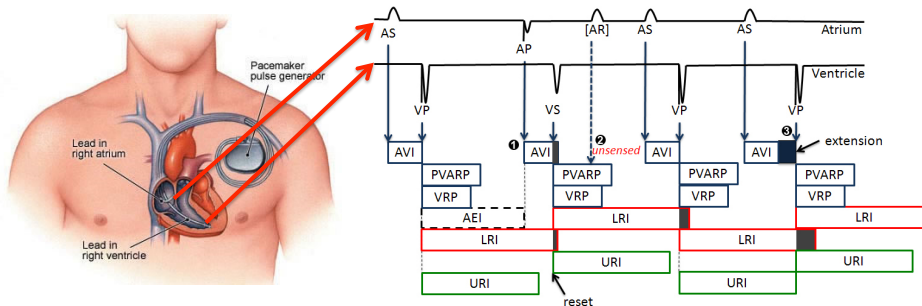
*Jiang, Pajic, Mangharam, ICCPS, Proc. IEEE, 2011*

## Model Translation and Implementation

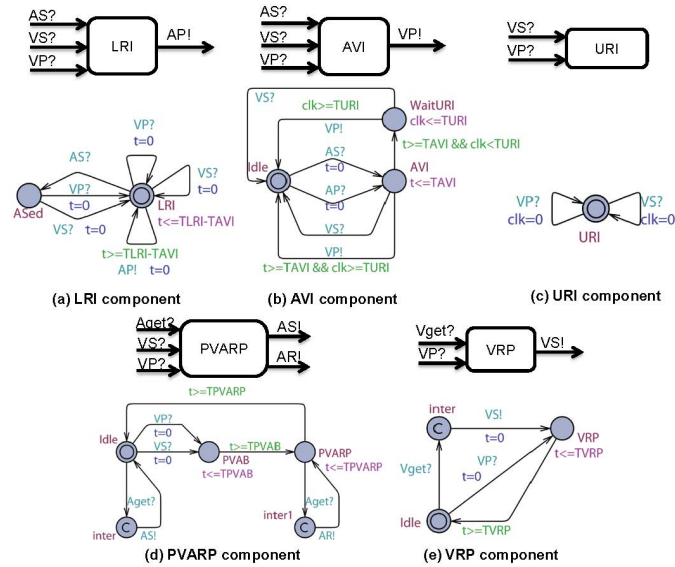


Pajic, Jiang, Lee, Mangharam, Sokolsky, RTAS 2012

## Implantable Pacemaker Modeling



## Uppaal Model of Dual Chamber Pacemaker



## Summary of Verification Results

- ❑ Modeled and verified a dual chamber pacemaker and additional advanced functions
- ❑ Showed that adding new functions to the pacemaker may result in safety violations
- ❑ Showed that more detailed heart model is needed for more advanced safety requirements

## New Challenges: Model Synthesis

1. Can we extract (controller) models from code?
2. Can we extract (plant) models from data?
3. Can we use analysis/verification technology to assist the designer to construct models?

### 1. From Code to Models

- ❑ What if pacemaker software is not developed using MBD
  - ◆ How to verify / certify code for pacemaker software
- ❑ Potential solution: Extract EFSM (Extended finite-state-machine) models from code
- ❑ Starting point: Predicate abstraction used for software verification
  - ◆ Challenges: Extract timing properties



## Model Checking of C code

Phase 1: Given a program P, build an abstract finite-state (Boolean) model A such that set of behaviors of P is a subset of those of A (conservative abstraction)

Phase 2: Model check A wrt specification: this can prove P to be correct, or reveal a bug in P, or suggest inadequacy of A

- ◆ Shown to be effective on Windows device drivers in Microsoft Research project SLAM

```
do{
  KeAcquireSpinLock();
  nPacketsOld = nPackets;
  if(request){
    request = request->Next;
    KeReleaseSpinLock();
    nPackets++;
  }
}while(nPackets!= nPacketsOld);
KeReleaseSpinLock();
```

Do lock operations, acquire and release, strictly alternate on every program execution?

## 2. From Data to Models

- ❑ What's a good model of heart for verifying correctness requirements of pacemaker software?
  - ◆ Ideally, model should be patient specific
- ❑ Potential solution: Extract timed/hybrid automata models for ECG data for a patient
- ❑ Computational challenge: Can we develop suitable learning algorithms?
  - ◆ Background: L\* algorithm for learning DFA
  - ◆ Background: Learning linear constraints among variables

### 3. Assisting Designers in Model Construction

- ❑ How can computational tools assist designers?
  - ◆ Maturing verification technology, fast constraint solvers
  - ◆ Enormous computational power available
  
- ❑ Goal: Allow designer to express "model under construction" using multiple, intuitive formats
  - ◆ Synthesis tool can integrate different formats, interactively with designer to produce desired model
  - ◆ EFSMs + Example scenarios + High-level requirements
  
- ❑ Inspiration: Emerging research in software synthesis

### Sketch: Program completion

Ref: Chaudhuri, Solar-Lezama (PLDI 2010)

```
Err = 0.0;
for(t = 0; t < T; t += dT){
  if(stage == STRAIGHT){
    if(t > ??) stage = INTURN;
  }
  if(stage == INTURN){
    car.ang = car.ang - ??;
    if(t > ??) stage = OUTTURN;
  }
  if(stage == OUTTURN){
    car.ang = car.ang + ??;
    if(t > ??) break;
  }
  simulate_car(car);
  Err += check_collision(car);
}
Err += check_destination(car);
```

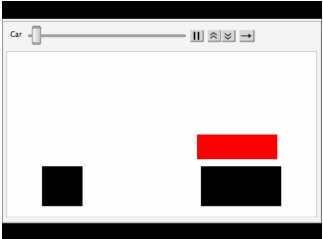
When to start turning?

Backup straight

How much to turn?

Turn

Straighten



Enables programmers to focus on high-level solution strategy

## Conclusions

- ❑ Model based design (MBD) is a promising approach to design of embedded software
- ❑ Over the past year, research at Penn has demonstrated benefits of MBD for rigorous design of pacemaker software
- ❑ Synthesis has the potential to transform the way a designer can employ MBD