

# Extensible Modeling Languages and Precision Timed Infrastructures for Cyber-Physical Systems

RAWFP Workshop, Gothenburg, Sweden

May 28, 2012

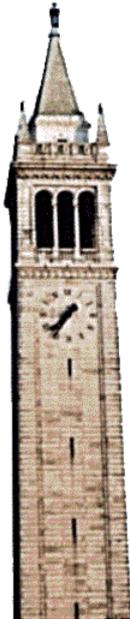
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**Jeremy G. Siek**

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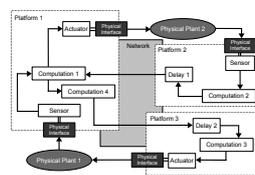
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## Agenda

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### Part I Cyber-Physical Systems



### Part II Modelyze - a host language for equation-based languages



### Part III Precision Timed Infrastructure – making time an engineering abstraction



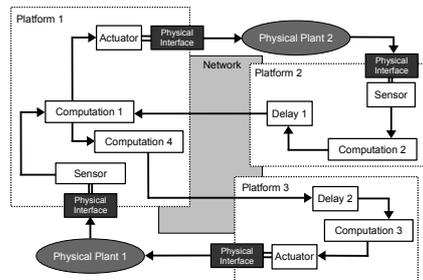
**Part I**  
Cyber-Physical  
Systems

**Part II**  
Modelyze - a host language for  
equation-based languages

**Part III**  
Precision Timed Infrastructure -  
making time an engineering abstraction

# Part I

## Cyber-Physical Systems



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Cyber-Physical  
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Modelyze - a host language for  
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## Complex Cyber-Physical Systems (CPSs)



Industrial Robots



Power Plants



Aircraft

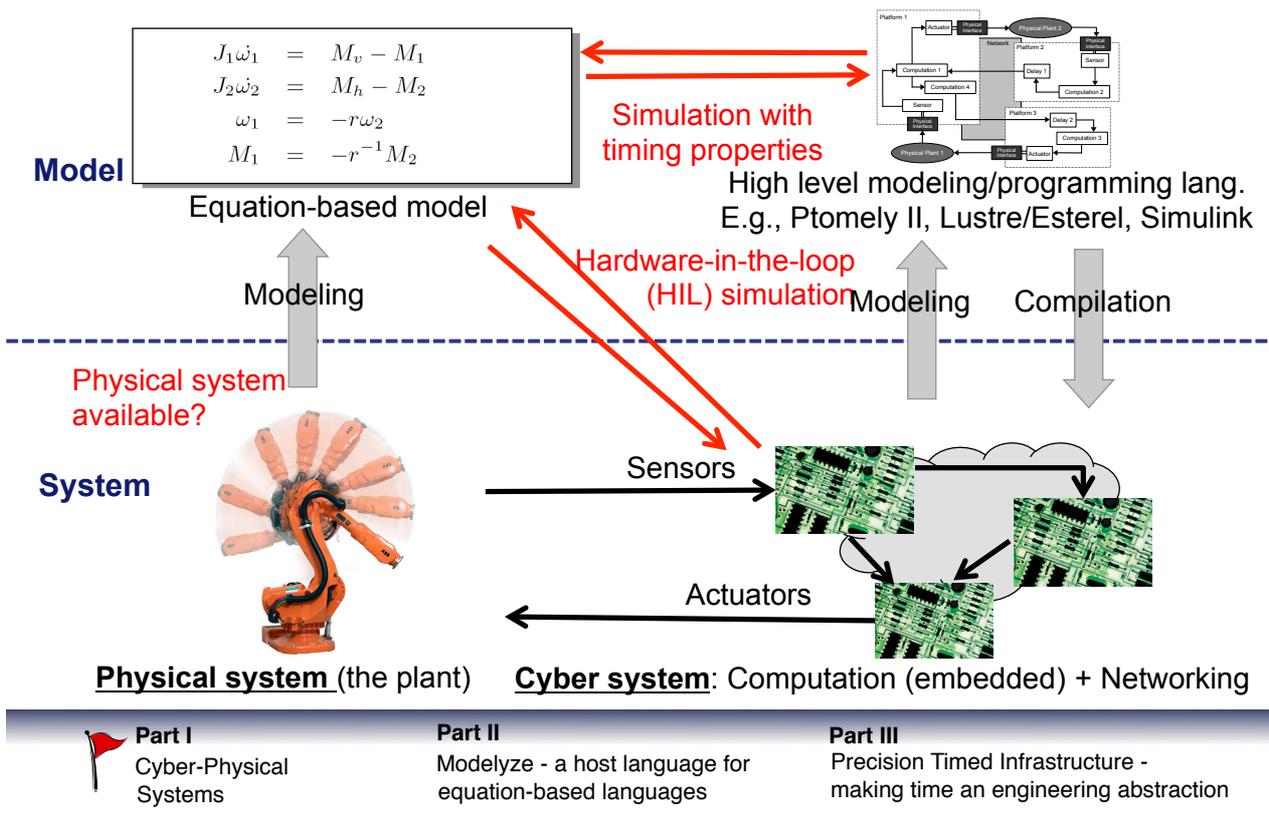


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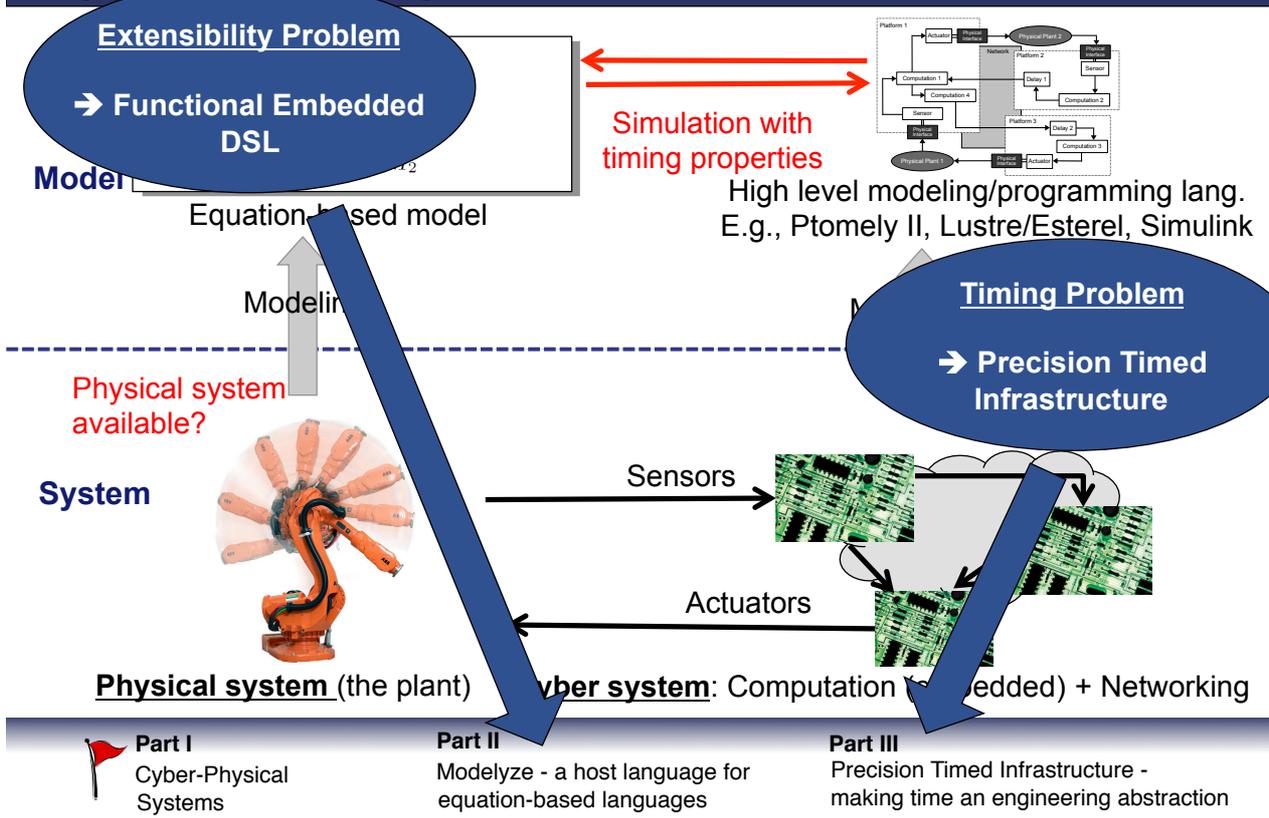
**Part II**  
Modelyze - a host language for  
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Precision Timed Infrastructure -  
making time an engineering abstraction

# Modeling, Simulating, and Running Cyber-Physical Systems



# Modeling, Simulating, and Running Cyber-Physical Systems



# Part II

## Modelyze

a host language for equation-based languages



In collaboration with

**Jeremy G. Siek**

University of Colorado at Boulder

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Cyber-Physical  
Systems

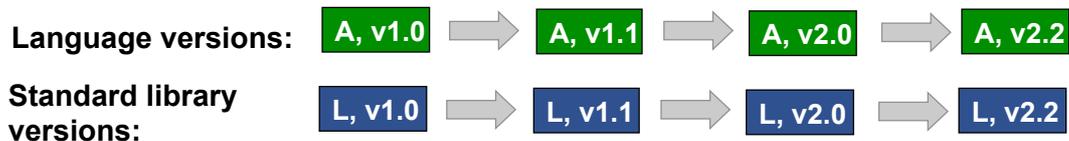


**Part II**  
Modelyze - a host language for  
equation-based languages

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## Problem: Expressiveness and Extensibility

Cannot express all modeling or analysis needs.  
Limited to what the modeling language can provide.



**Modelica: A new language definition approximately every second year**

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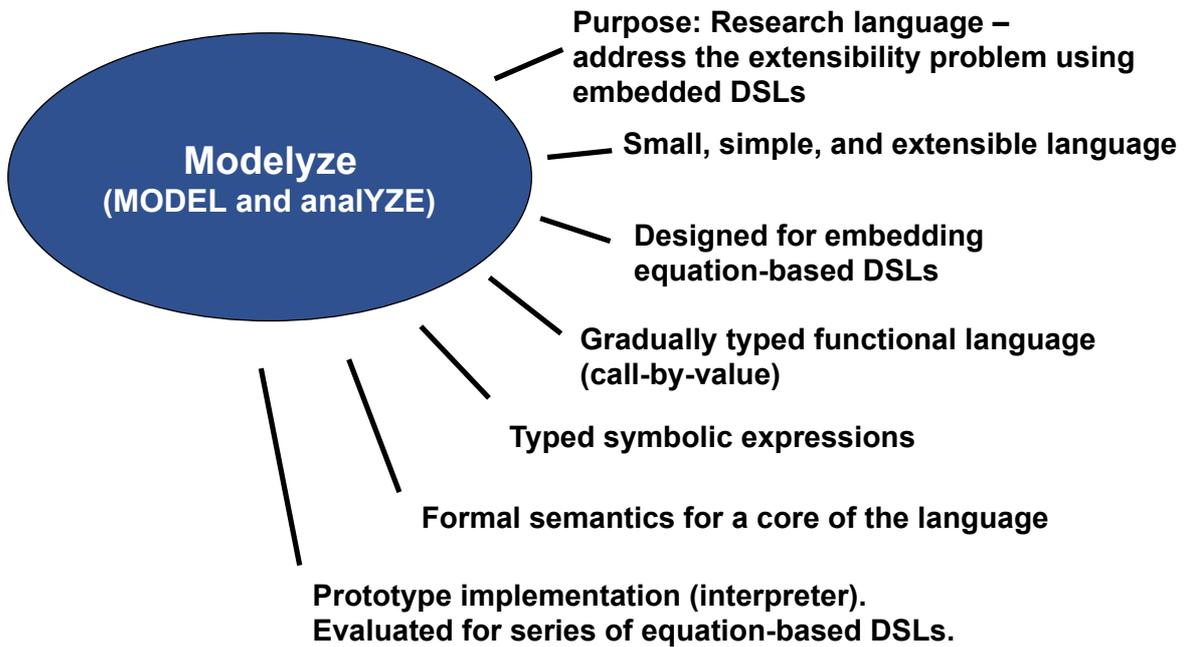


**Part II**  
Modelyze - a host language for  
equation-based languages

**Part III**  
Precision Timed Infrastructure -  
making time an engineering abstraction

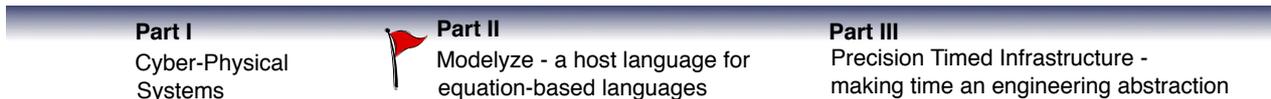
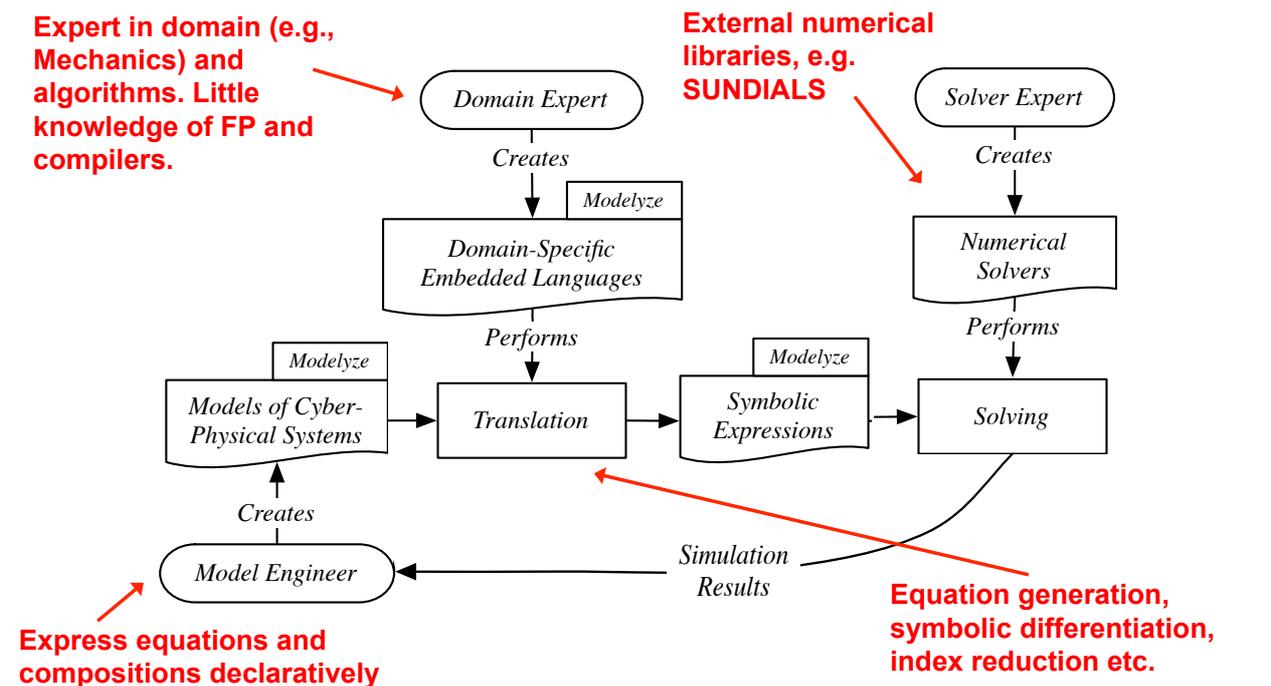
# What is Modelyze?

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# Process Overview

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# Challenges and Contributions

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1. Provide seamless integration between host language and embedded DSL

Performed together with type checking.

Symbol Lifting Analysis

2. Make it easy to transform and analyze equations (domain expert)

Pattern matching on symbolic expressions

Gradual Typing

+

Typed Symbolic Expressions

3. Provide domain specific errors (model engineer)

Static type checking

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Cyber-Physical Systems

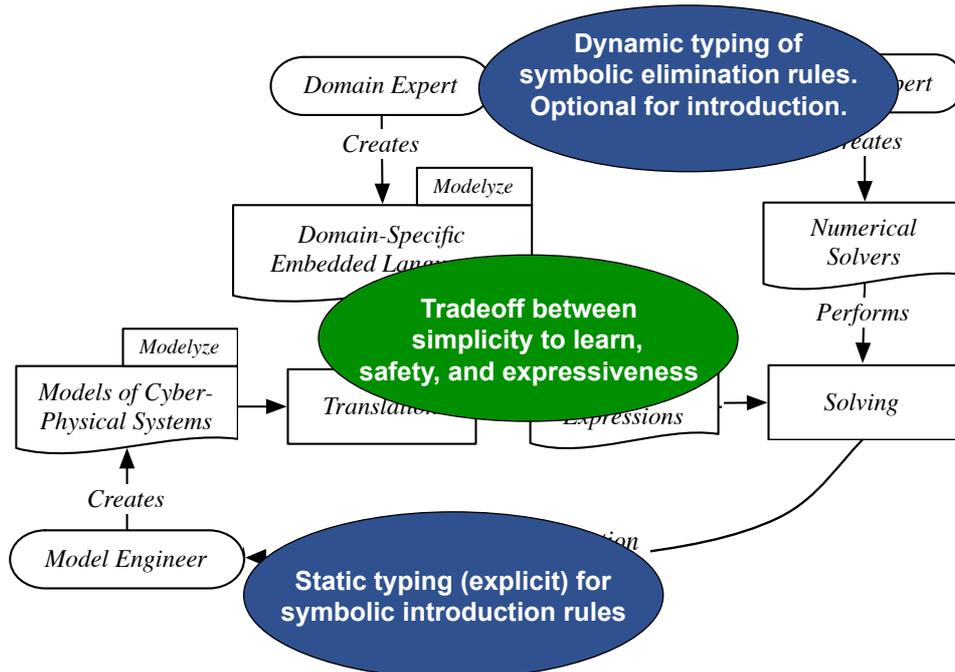


**Part II**  
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**Part III**  
Precision Timed Infrastructure - making time an engineering abstraction

# Process Overview

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**Part I**  
Cyber-Physical Systems



**Part II**  
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# Related Work

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## Implementing DSLs

### Compiler construction

- JastAdd (Ekman & Hedin, 2007)
- MetaModelica (Pop & Fritzson, 2006)

### Preprocessing and template metaprogramming

- C++ Templates (Veldhuizen, 1995)
- Template Haskell (Sheard & Peyton Jones, 2002)
- Stratego/XP (Bravenboer et al., 2008)

### Embedded DSLs

- Haskell DSEs, e.g., Fran (Ellito & Hudak, 1997), Lava (Bjesse et al. 1998), and Paradise (Augustsson, 2008)
- FHM (Nilsson et al., 2003)
- Pure embedding (Higher-order functions, polymorphism, lazy evaluation, type classes) (Hudak, 1998)

## Combining Dynamic and Static Typing

- Gradual Typing (Siek & Taha, 2007)
- Soft Typing (Cartwright & Fagan, 1991)
- Dynamic type with typecase (Abadi et al., 1991)
- Typed Scheme, Racket (Tobin-Hochstadt, Felleisen, 2008)
- Thorn, like types (Wrigstad et al., 2010)

## Representing Code and Data type

- Dynamic languages LISP, Mathematica
- MetaML <T> (Taha & Sheard, 2000)
- GADT (Peyton Jones et al., 2006; Xi et al., 2003; Cheney & Ralf, 2003)
- Open Data types (Löh & Hinze, 2006)
- Pattern Calculus (Jay, 2009)

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### Part II

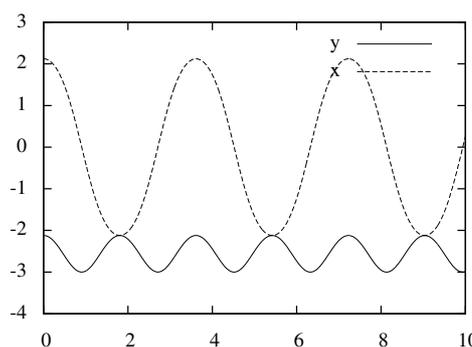
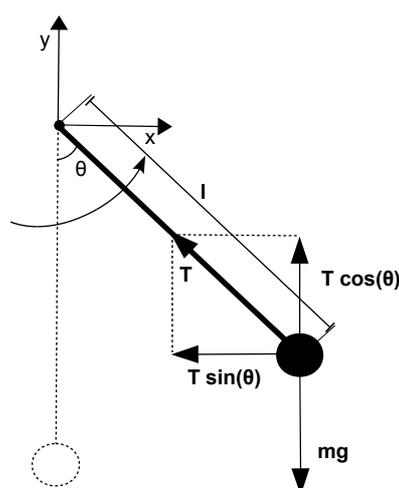
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# Pendulum Example

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**Differential-Algebraic  
equations**

**Algebraic constraint**

**Initial values**

$$\begin{aligned}
 -T \cdot \frac{x}{l} &= m\ddot{x} & x(0) &= l \sin(\theta_s) \\
 -T \cdot \frac{y}{l} - mg &= m\ddot{y} & y(0) &= -l \cos(\theta_s) \\
 x^2 + y^2 &= l^2 & &
 \end{aligned}$$

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# Declarative Mathematical Model

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Using function abstraction to define the model

Unknowns are given types but not bound to values

Equations and initial values are defined declaratively, just as the mathematical equations

```
def Pendulum(m:Real, l:Real, angle:Real) = {
  def x, y, T:Real;
  init x (l*sin(angle));
  init y (-l*cos(angle));

  -T*x/l = m*x'';
  -T*y/l - m*g = m*y'';
  x^2 + y^2 = l^2;
}
```

$$\begin{aligned} -T \cdot \frac{x}{l} &= m\ddot{x} & x(0) &= l \sin(\theta_s) \\ -T \cdot \frac{y}{l} - mg &= m\ddot{y} & y(0) &= -l \cos(\theta_s) \\ x^2 + y^2 &= l^2 \end{aligned}$$

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# Declarative Mathematical Model

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Which parts are part of the host language (Modelyze)?

Unknowns are internally represented as typed symbols

Fresh  
(unique)  
symbol

 $S:\mathcal{T}$ 

Tagged with  
a type

 $\langle \mathcal{T} \rangle$ 

Symbolic type

```
def Pendulum(m:Real, l:Real, angle:Real) = {
  def x, y, T:Real;
  init x (l*sin(angle));
  init y (-l*cos(angle));

  -T*x/l = m*x'';
  -T*y/l - m*g = m*y'';
  x^2 + y^2 = l^2;
}
```

Variable **x** is bound to fresh  
symbol of type  $\langle \text{Real} \rangle$

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# Release the user from annotation burden

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Symbols cannot be bound to values, so  $x^2$  would crash at runtime

Use quasi-quoting to mix symbolic expressions and program code?

Using MetaML syntax `< >` for quotation and `~` for anti-quoting (escape)

```
def Pendulum(m:Real, l:Real, angle:Real) = {
  def x, y, T:Real;
  init x (l*sin(angle));
  init y (-l*cos(angle));

  -T*x/l = m*x'';
  -T*y/l - m*g = m*y'';
  x^2 + y^2 = l^2;
}
```

```
<~x^2 + ~y^2 = ~((fun t -> <t>)l^2)>;
```

Heavy annotation burden for the end-user

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# Symbol Lifting Analysis (SLA)

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Symbol Lifting Analysis (SLA): During type checking, lift expressions that cannot be safely evaluated at runtime into symbolic expressions (data).

$$\Gamma \vdash_L e \rightsquigarrow e' : \tau$$

Rewritten to prefix curried form

```
((/) x) l)
```

where

```
(/):Real-> Real -> Real
```

```
x:<Real>
```

```
l:Real
```

```
def Pendulum(m:Real, l:Real, angle:Real) = {
  def x, y, T:Real;
  init x (l*sin(angle));
  init y (-l*cos(angle));

  -T*x/l = m*x'';
  -T*y/l - m*g = m*y'';
  x^2 + y^2 = l^2;
}
```

```
((lift(/):Real-Real->Real) @ x) @ (lift l:Real))
```

Division cannot be performed, lift expression to type `<Real-> Real -> Real>`.

Term `lift e:T` wraps `e` and results in type `<T>`

Resulting  
type  
`<Real>`

Term `e1@e2` is a symbolic application, represented as a tuple.

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# Symbols used to construct equation systems

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```
def Pendulum(m:Real, l:Real, angle:Real) -> Equations = {
  def x,y,T:Real;
  init x (l*sin(angle));
  init y (-l*cos(angle));

  -T*x/l = m*x'';
  -T*y/l - m*g = m*y'';
  x^2 + y^2 = l^2;
}
```

Symbolic  
data type

Typed symbol  
used as  
constructors

Data types are open  
with no exhaustive  
checking for  
patterns

Type of Pendulum : Real -> Real -> Real -> Equations

```
type Equations
def (=) : Real -> Real -> Equations
def (;) : Equations -> Equations -> Equations
```

```
def der : Real -> Real
def (') = der
def init : Real -> Real -> Equations
```

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# Pattern Matching on Symbolic Expressions

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Dynamic symbolic type <?>

Accumulator Sets of symbolic  
type <Real>

Query for all unknowns in a  
model instance

```
def getUnknowns(exp:<?>, acc:(Set <Real>)) -> (Set <Real>) = {
  match exp with
  | e1 e2 -> getUnknowns(e2, getUnknowns(e1, acc))
  | sym:Real -> Set.add exp acc
  | _ -> acc
}
```

Uniform data structure, no  
boilplate code (matching on  
symbolic applications)

Match all symbols of type <Real>  
i.e., unknowns in the model.

```
getUnknowns(Pendulum(5, 3, 45*pi/180), Set.empty)
```

Returns a set with 3 symbols (representing **x**, **y**, and **T**).

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# Static Error Checking at the DSL Level

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Syntactically correct model (host syntax)

Static type error instead of dynamic error during translation/pattern matching.

```
def ModifiedPendulum(m:Real, l:Real, angle:Real) = {
  def x, y, T:Real;
  init x (l*sin(angle));
  init y; //Error 1: Missing initial value

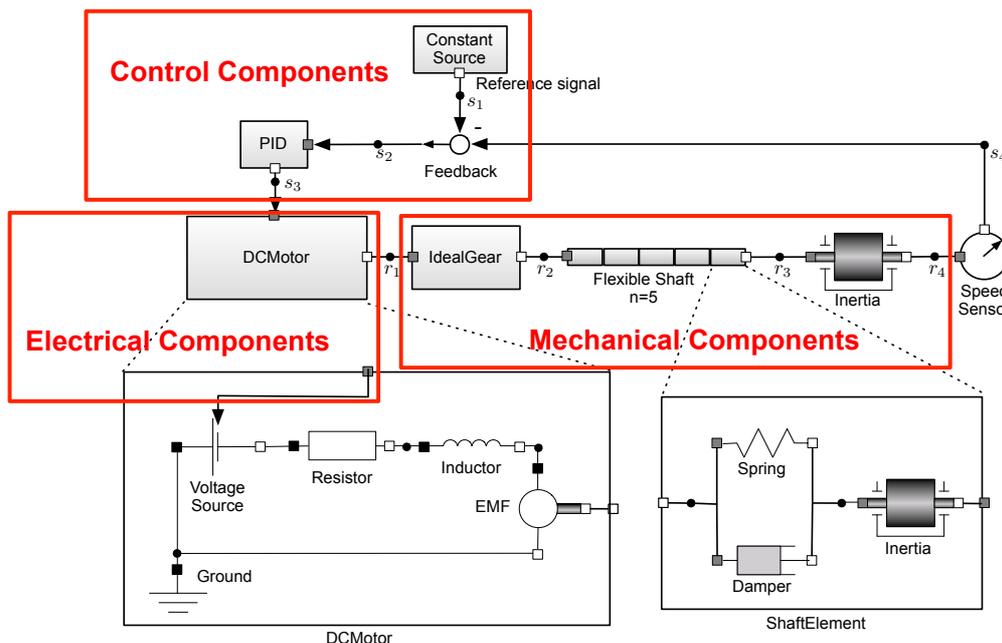
  -T*der/l = m*x''; //Error 2: der used incorrectly
  -T*y/l - m*g = m*y'';
  x^2 + y^2 = l^2;
}
```

Still challenging to provide meaningful error messages.  
 "Expected type <Real> but found <Real->Real>"

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# Mechatronic Control Example

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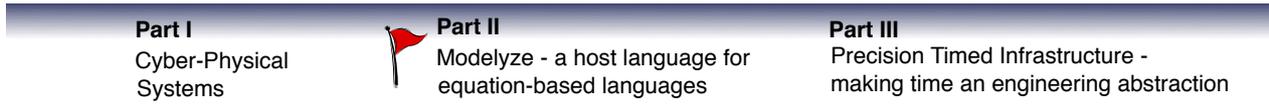
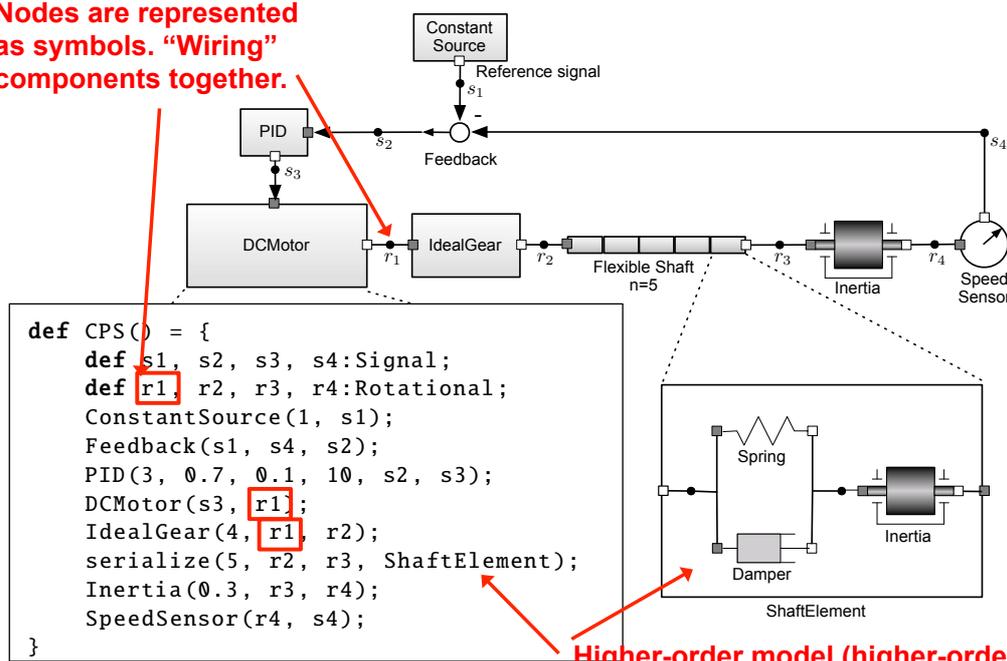


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# Mechatronic Control Example

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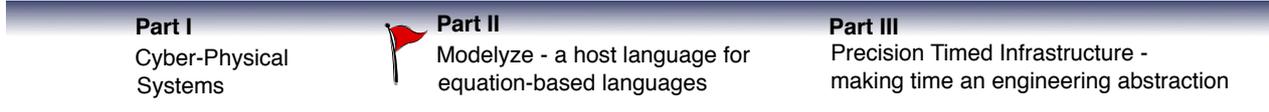
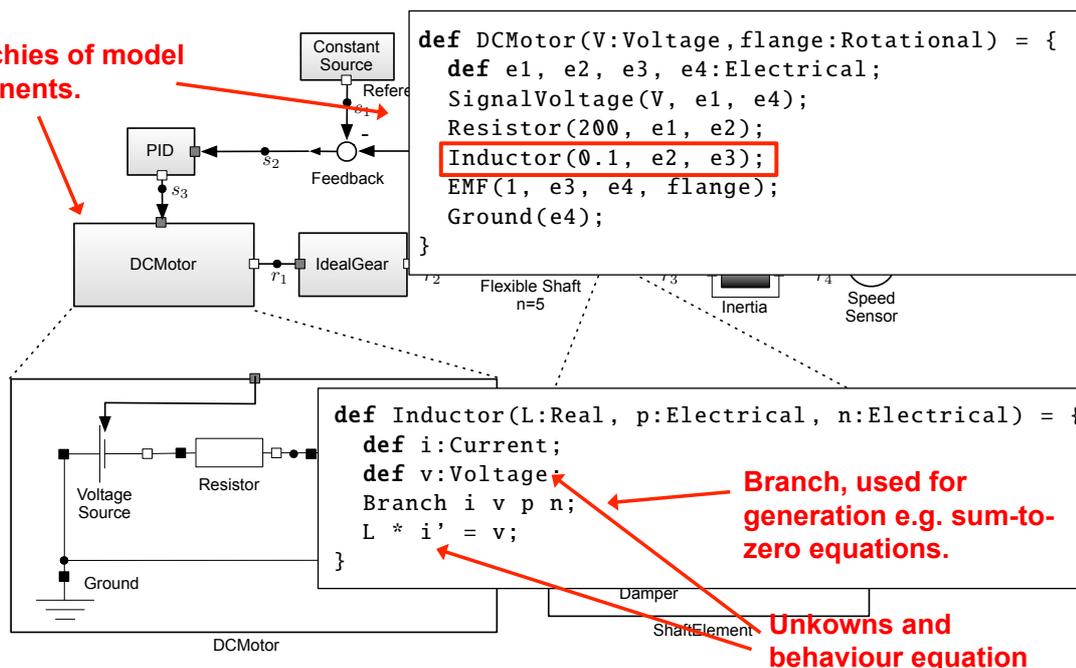
Nodes are represented as symbols. "Wiring" components together.



# Mechatronic Control Example

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Hierarchies of model components.



# Conclusions

## Main takeaway points (Modelyze)

A simple research language – host language for embedding equation-based DSLs



Symbol lifting analysis (SLA) is used to release the annotation burden from the user

Typed symbols with gradual typing is used for pattern matching and DSL-level error reporting

## Part II

### Precision Timed Infrastructure Making Time an Engineering Abstraction



#### Key contributors and collaborators related to the PRET project

**Edward A. Lee**

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Jeff Jensen

**Isaac Liu**

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# A Story...

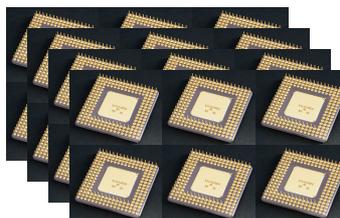
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Fly-by-wire technology controlled by software.

**Safety critical** →  
Rigorous validation and certification

Success?



They have to purchase and store microprocessors for at least 50 years production and maintenance...

Why?

Apparently, the software does not specify the behaviour that has been validated and certified!

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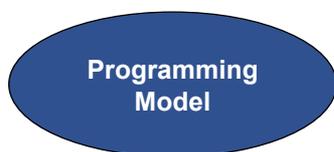
# What is PRET?

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**Timing is not part of the software semantics**

Correct execution of programs (e.g., in C, C++, C#, Java, Scala, Haskell, OCaml) has nothing to do with how long time things takes to execute.

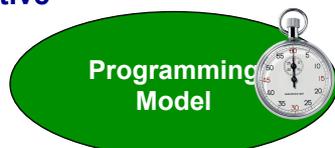
Traditional Approach



Timing Dependent on the Hardware Platform



Our Objective



**Make time an engineering abstraction within the programming model**



Timing is independent of the hardware platform (within certain constraints)

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# What is PRET?

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- PRET = PREcision-Timed
- PRET = Predictable, REpeatable Timing
- PRET = Performance *with* REpeatable Timing

## PRET Infrastructure

- PRET Language (Language timing semantics)
- PRET Compiler (Timing aware compilation)
- PRET Machine (Computer Architecture)



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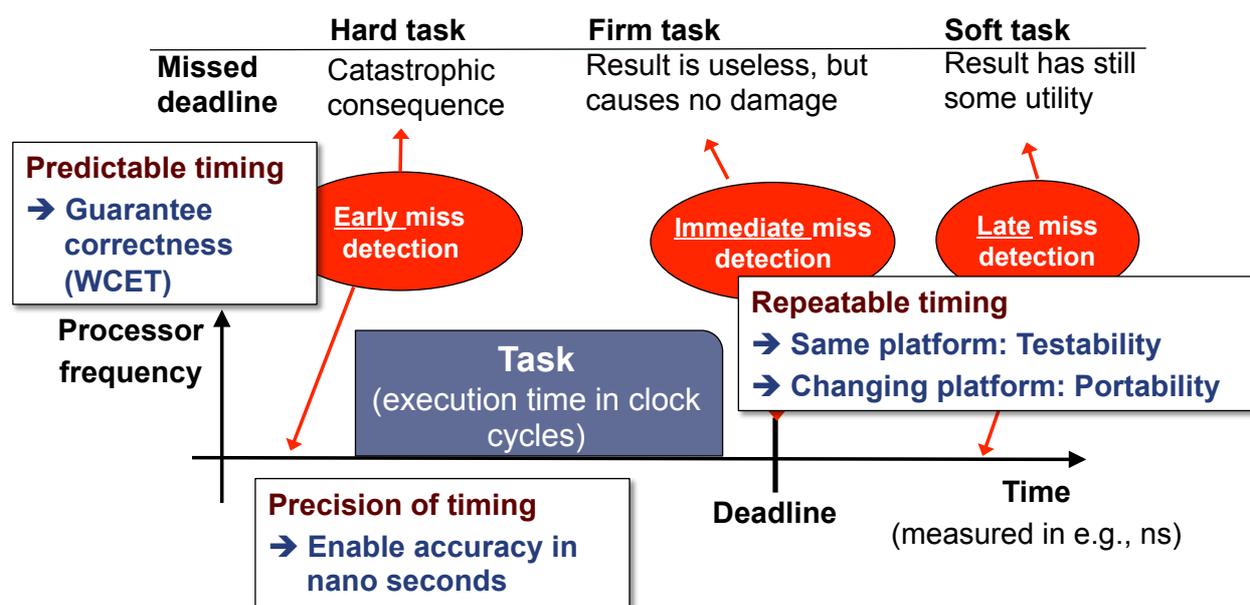
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# What do precision, predictable, and repeatable timing mean?

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## Focus on cyber-physical systems with real-time constraints



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# Instruction set architecture (ISA)

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## Rethink the ISA

Timing has to be a *correctness* property not only a *performance* (quality) property

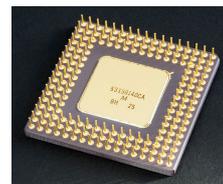


Photo by Andrew Dunn, 2005

## PRET Machine

- Repeatable and predictable execution time (instructions)
- Repeatable memory access time
- Timing instructions for handling missed deadline detection

### Related Work

Java Optimized Processor (JOP)  
(Schoeberl, 2008)

ARPRET  
(Andalam et al., 2009)

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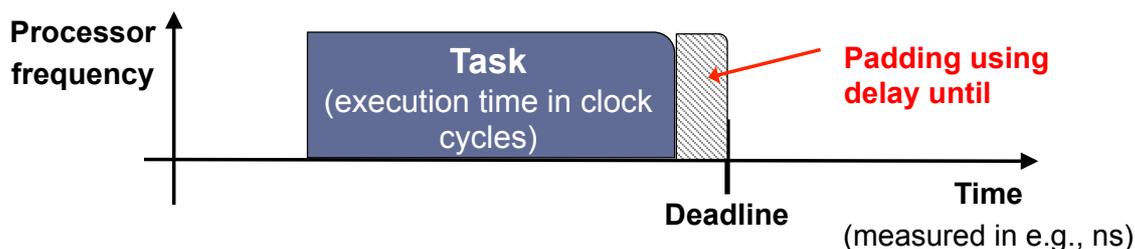
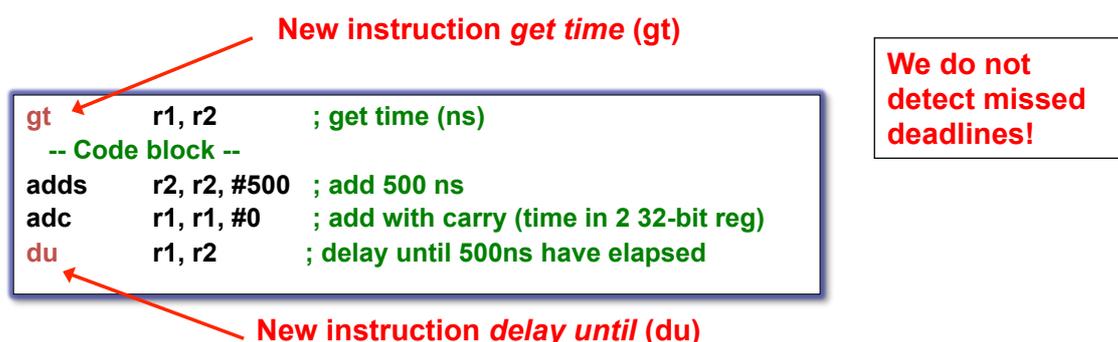


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# ARMv4 ISA extended with timing constructs

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## Best effort (with padding)



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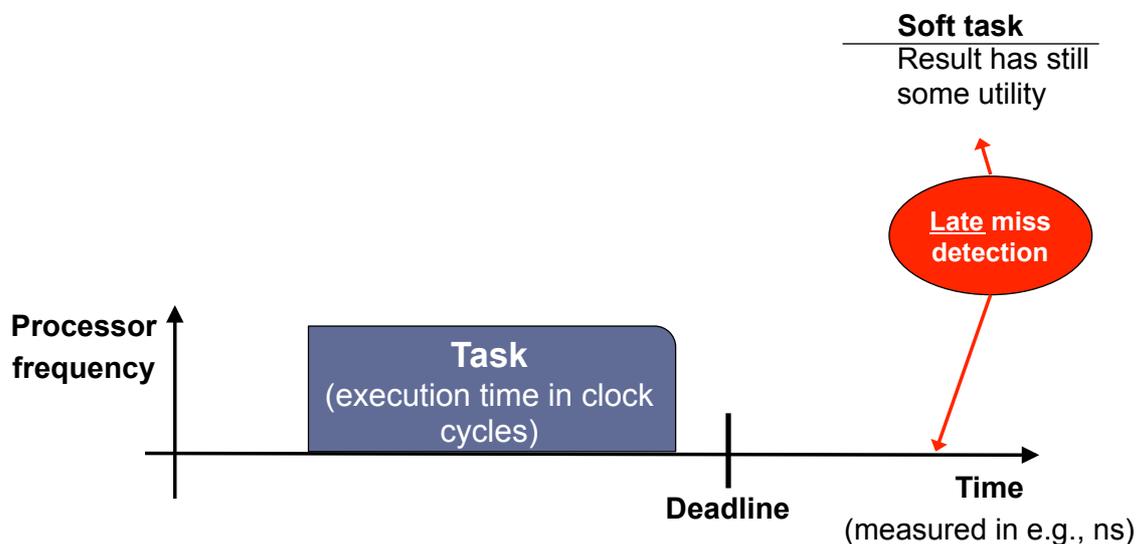


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# ARMv4 ISA extended with timing constructs

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## Late miss detection



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# ARMv4 ISA extended with timing constructs

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## Early and immediate miss detection

**Not handled at the ISA level**

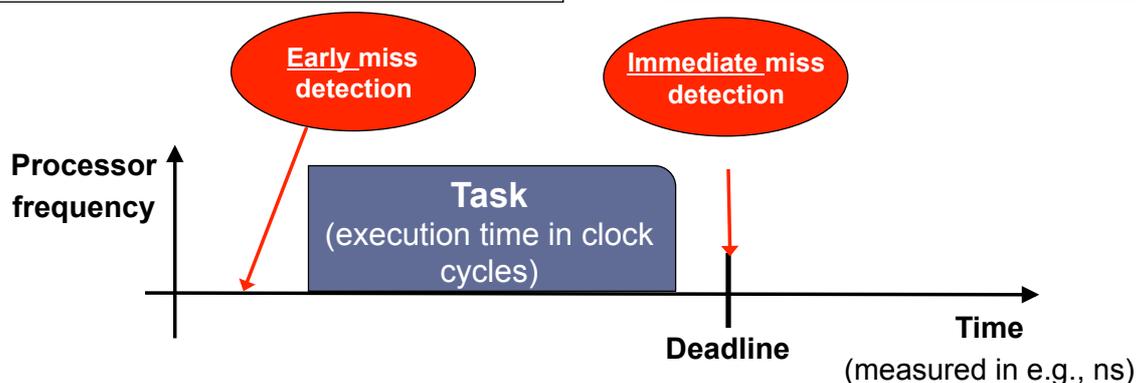
**Needs static timing analysis!**

**Handled using timing exceptions**

**New instructions:**

**ee** - Exception on Expire

**de** - Deactivate Exception



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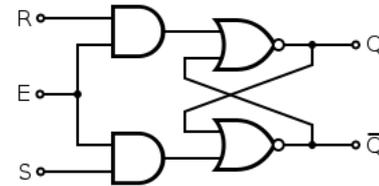
# We need implementations that deliver repeatable timing

## The good news

Fortunately, electronics technology delivers highly reliable and precise timing

## The bad news...

The chip architectures introduces highly non-deterministic behavior (e.g., using caches, pipelines etc.).



## We need to rethink the microarchitecture

- Pipelining
- Memory hierarchies
- I/O (DMA, interrupts)
- Power management
- On-chip communication
- Resource sharing (e.g., in multicore)

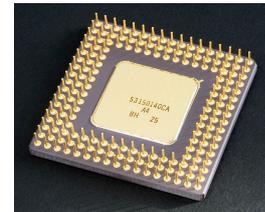
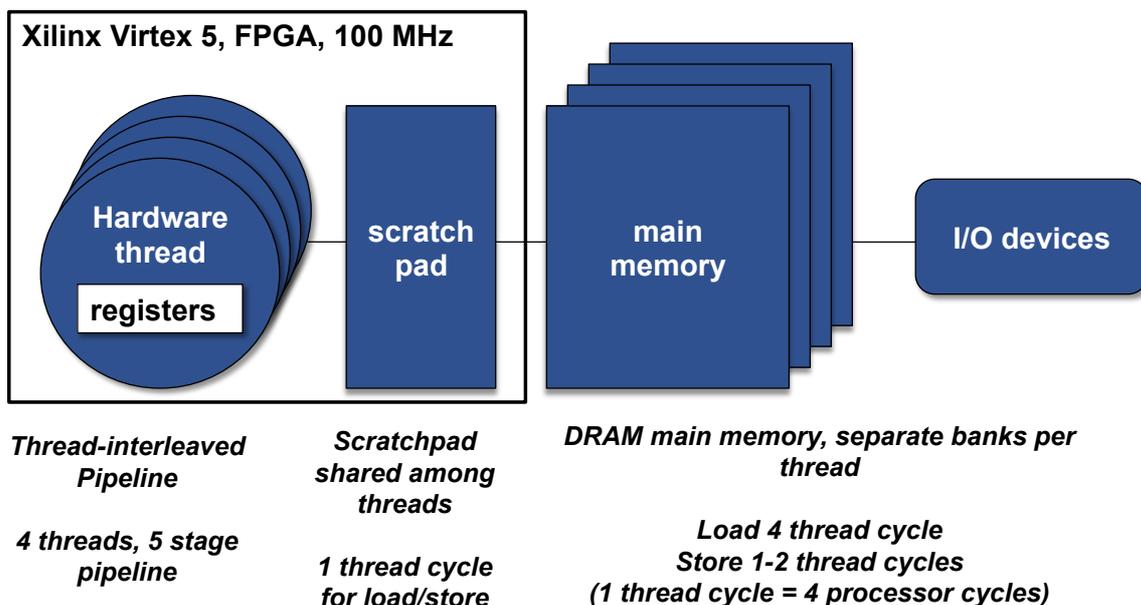


Photo by Andrew Dunn, 2005

<p><b>Part I</b> Cyber-Physical Systems</p>	<p><b>Part II</b> Modelyze - a host language for equation-based languages</p>	<p><b>Part III</b> Precision Timed Infrastructure - making time an engineering abstraction</p>
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# Our Current PRET Architecture

## PTARM, a soft core on Xilinx Virtex 5 FPGA



<p><b>Part I</b> Cyber-Physical Systems</p>	<p><b>Part II</b> Modelyze - a host language for equation-based languages</p>	<p><b>Part III</b> Precision Timed Infrastructure - making time an engineering abstraction</p>
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# Timing Aware Compilation (Work-in-progress)

broman@eecs.berkeley.edu

**Modeling Language**



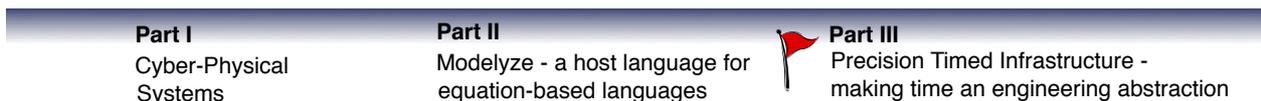
**Programming Language**

**Real-time Concurrent C**  
(Gehani and Ramamritham, 1991)

**PRET-C**  
(Andalam et al., 2009)

**WCC**  
(Falk and Lokuciejewski, 2010)

**Assembly Language**



# Timing Aware Compilation (Work-in-progress)

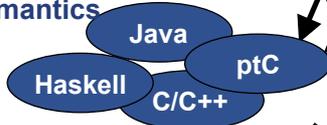
broman@eecs.berkeley.edu

**Modeling Language**



**Programming Language**

Extended with timing semantics



**Intermediate Language**

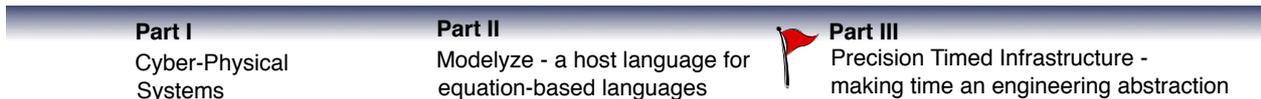
Expose timing constructs and WCET

Abstracting away the memory allocation (scratchpad)

PRETIL

**Assembly Language**

PRET ISA



# Some of the main challenges

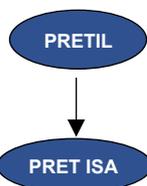
broman@eecs.berkeley.edu



## Relating real-time to execution-time

**Execution time in clock cycles – oscillators not precise enough**

→ IEEE1588 clock synchronization (needs WCET margin)



## Compiling with execution time

**(1) Estimate WCET of ASM program**

**(2) WCET-aware compilation to minimize WCET**

**Scratchpad allocation is now a compiler problem**

- Optimization problem with timing constraints. Options:
- (1) For a given frequency, optimize (average case) performance
  - (2) Find lowest frequency fulfilling constraints

```

runfor(10ms){
  <code1>
}
  
```



## Making time independent of the hardware

**For the same ISA, different platform parameters affect timing (Scratchpad size, clock frequency, memory latency, etc.)**

→ Compiler generates a certificate – checked at load time

### Part I

Cyber-Physical Systems

### Part II

Modelyze - a host language for equation-based languages



### Part III

Precision Timed Infrastructure - making time an engineering abstraction

## Conclusions

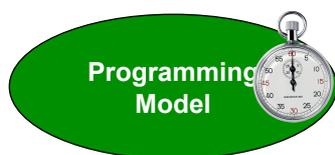
### Main takeaway points (PRET)



**Time is a correctness factor – not just a performance (quality) factor**



**Today, timing behavior is a property of the *realizations* of a software system**



**The PRET approach aims at making time an engineering abstraction *within the programming model***

**Thank you for listening!**