



# Physical model based systems design

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Updated October 2016

# Contents

## **1. Physical Modeling & Systems Design: a vision**

## **2. The foundations for compiling Modelica (multi-mode DAE systems)**

Acknowledgements:

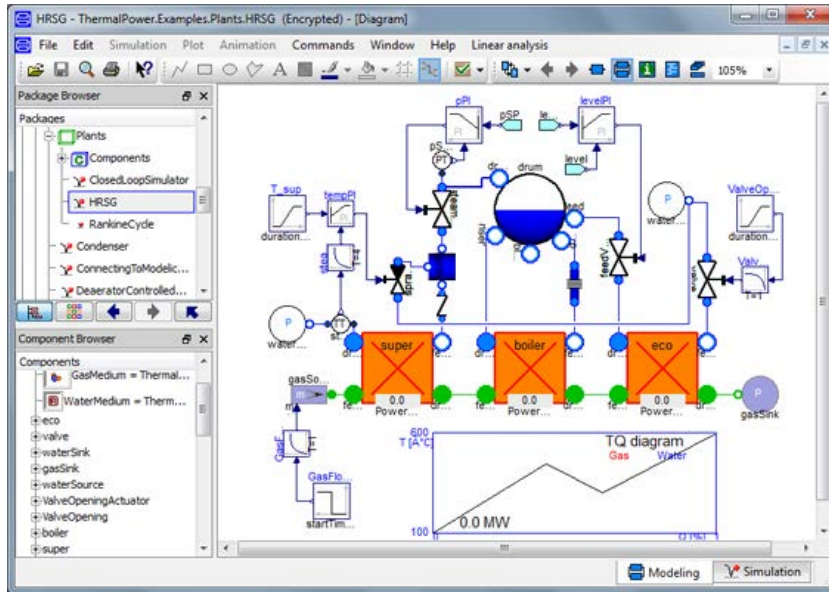
- Benoît Caillaud, Khalil Ghorbal
- Tim Bourke, Marc Pouzet;
- Hilding Elmqvist, Martin Otter, Sven-Erik Mattsson;
- Paul Caspi and Paul Le Guernic .



# Physical Modeling & Systems Design: the overall vision

# Physical modeling using Modelica

(DAE: Differential Algebraic Equation)



- **Modelica supports component based physical system modeling (not Simulink)**
- **Compilation is complex:**
  - Latent constraints
  - Index reduction
  - Structural analysis
- **Requires sophisticated causality analyses (as for bond graphs)**

Modelica: multi-mode DAE systems:

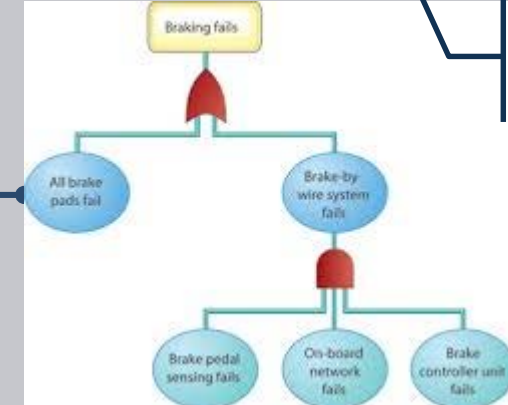
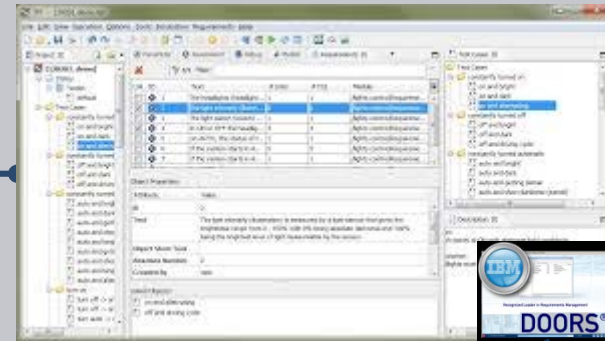
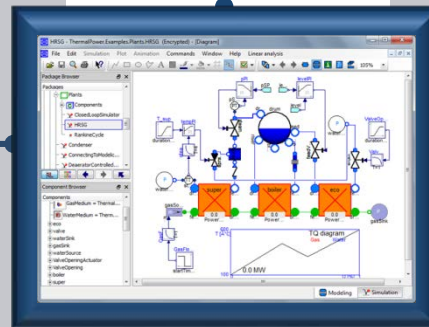
$$\begin{cases} \text{if } b \text{ do } F(\dot{x}, x, u) = 0 \\ b = \text{BoolCond}(\dot{x}, x, u) \end{cases}$$

# The overall vision

Not discussed  
see [Elmqvist 2014,2015]



3D CAD



Requir.

Safety  
Monitoring

Our focus

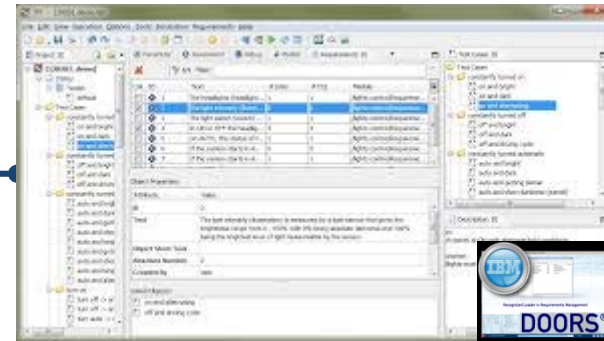
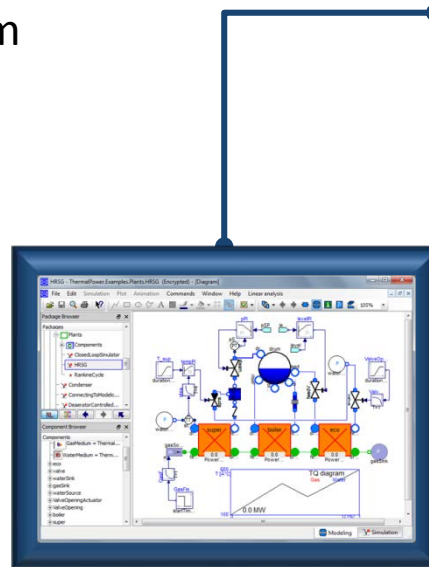


# Modelica & Requirement Engineering

# Modelica + Requirements

Is this all we need? No!

Requirement architectures  
differ from (physical) system  
architectures



A requirement profile has  
been defined for Modelica  
[Fritzson14]

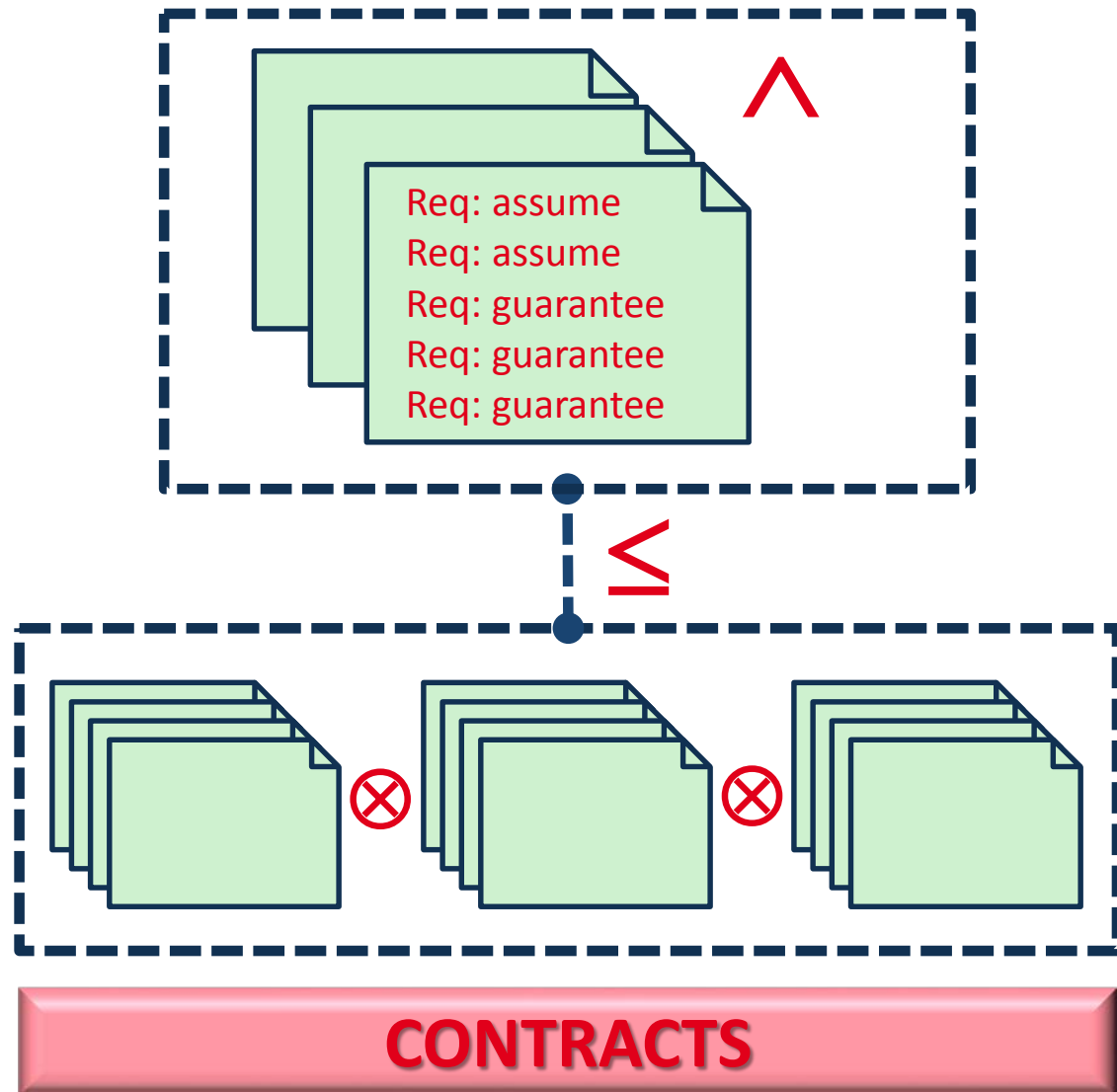
- Provision for writing requirements
- Linking requirements to test cases
- The link is syntactic, not semantic

# Modelica + Requirements

Is this all we need? No!

Requirement architectures differ from (physical) system architectures

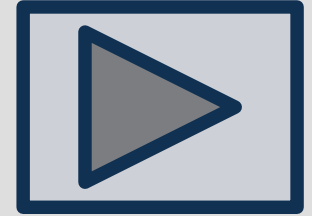
- Responsibilities must be clearly identified:
  - **guarantees**, vs.
  - **assumptions**
- **Conjunction** of requirements; several viewpoints
- From system to subsystem: **refinement** & **parallel composition**





# Modelica + Contracts

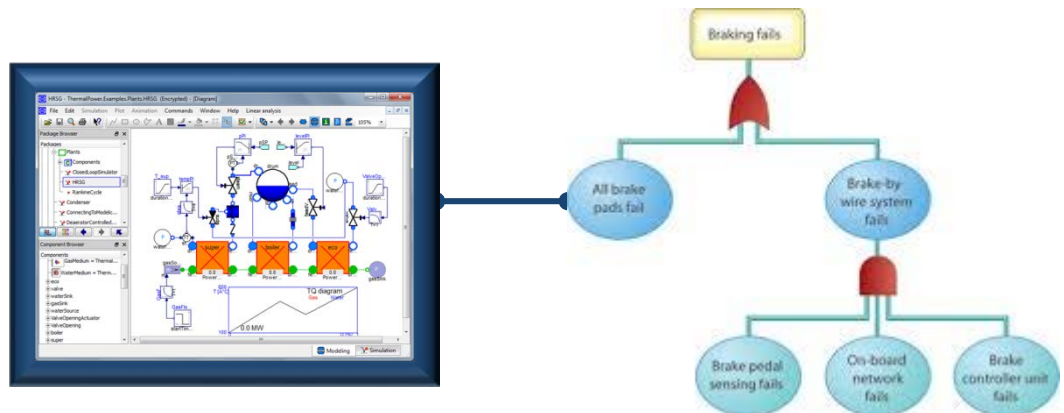
- Assume/Guarantee contracts
- $C = (A, G) = (\textit{Assumption}, \textit{Guarantee})$   
= pair of Modelica properties
- All the needed operators and relations exist
- Other forms of contract exist...



# Modelica & Safety Engineering

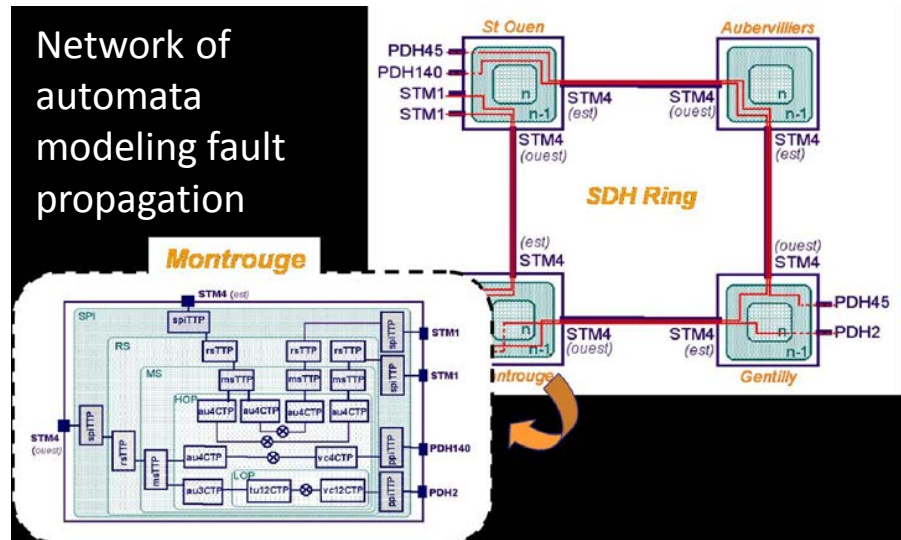
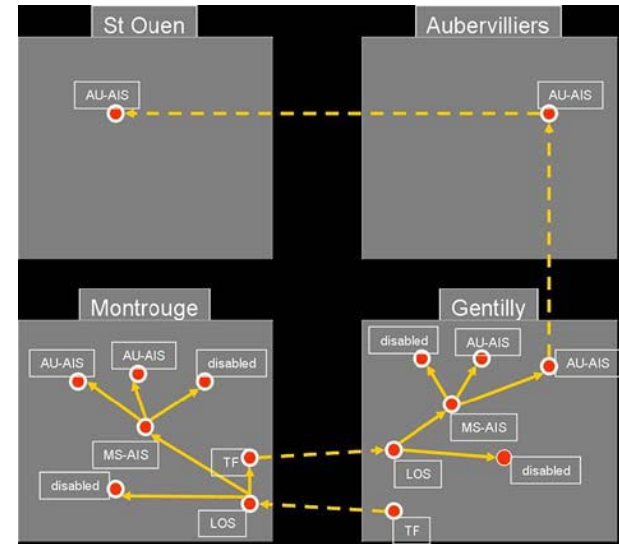
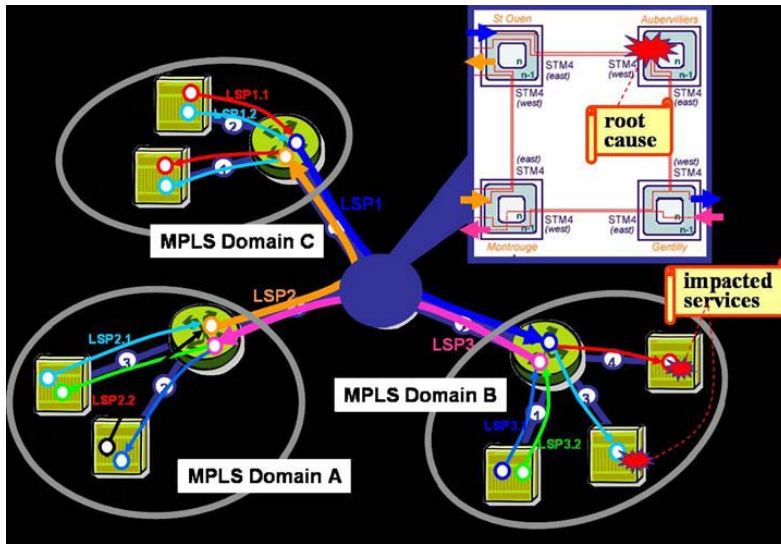
# Modelica + Safety

- Extend Modelica models with failure modes
- Use Modelica structural analysis to derive fault effects and propagation (fault tree)
- Check critical branches of the fault tree on the detailed Modelica model (guided simulation)

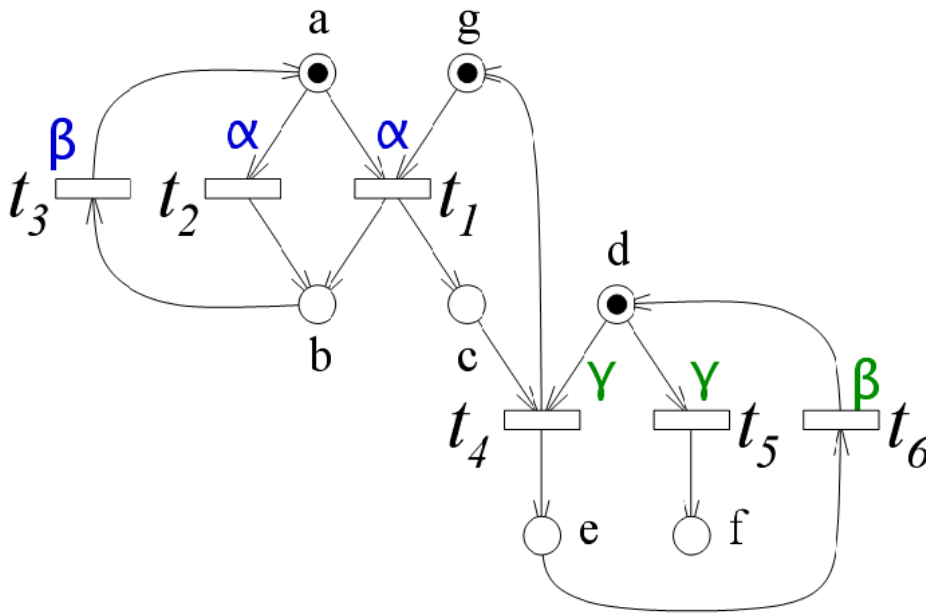


We can go beyond and perform system wide alarm handling

# Telecom network diag [Fabre et al. 2006]



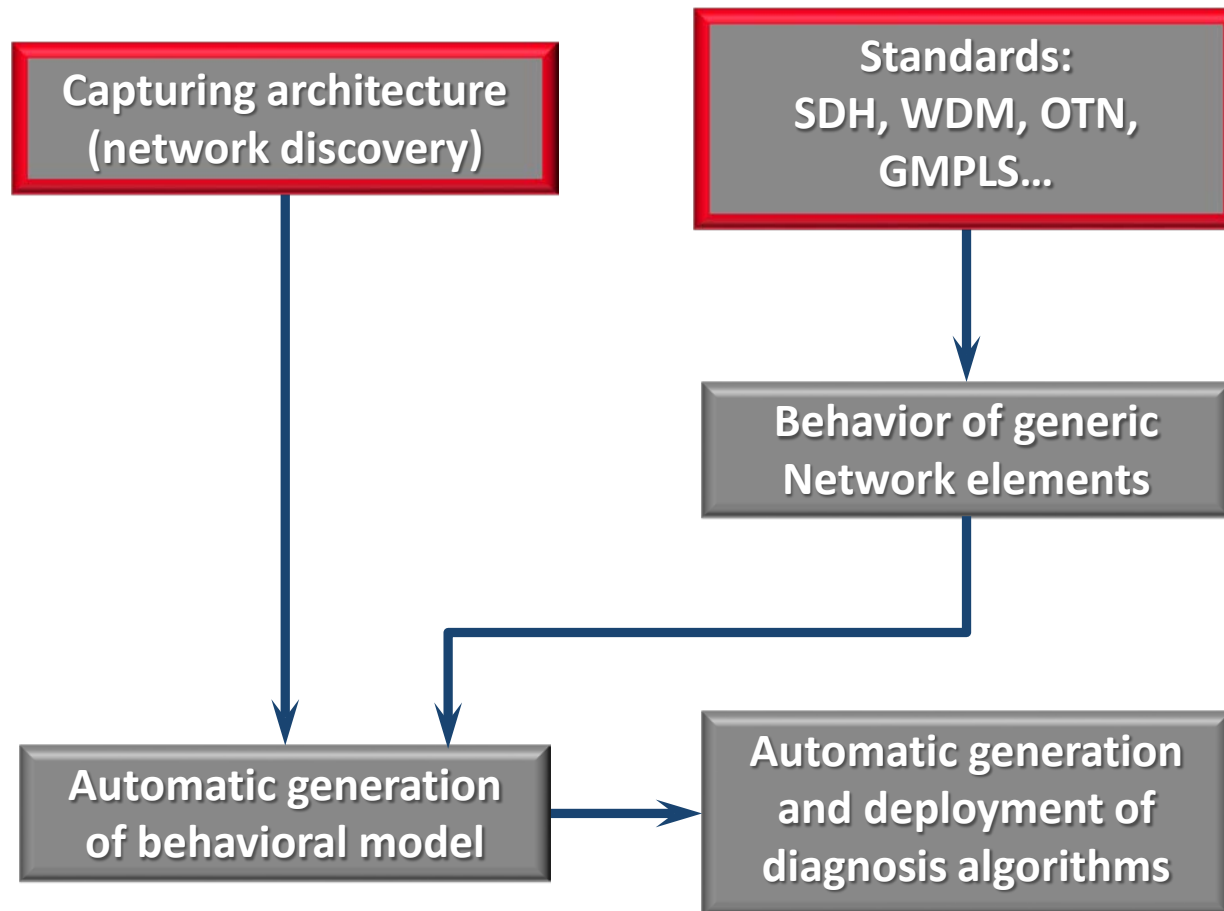
# Diagnosis algorithm



- Automaton describing the operating modes (nominal, failed\_x, ...) and their transitions
- Some transitions are observed (alarms)
- System = product of many such automata
- **Reconstruct hidden state histories from observations (state observer)**

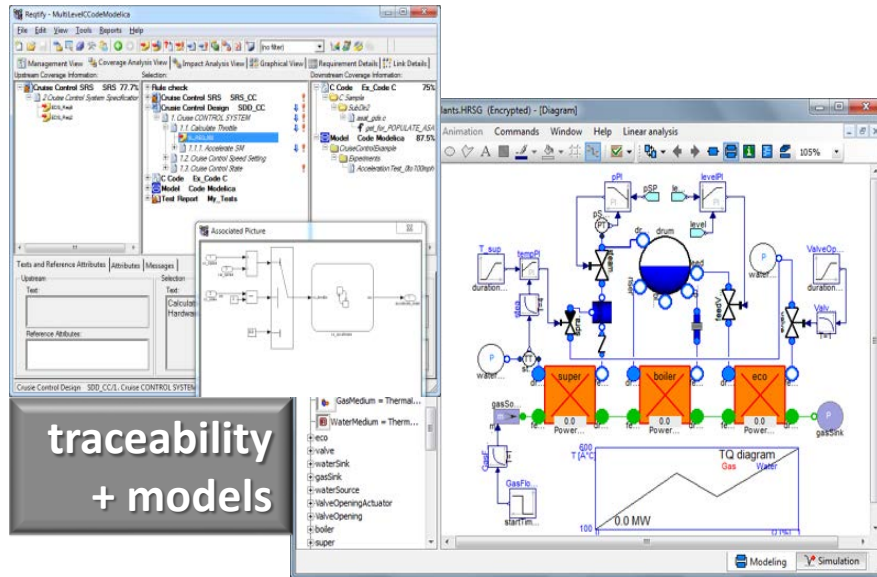
# How to construct models?

## Self-Modeling



# How to construct models?

## Self-Modeling



**FMEA**  
(Fault Mode and  
Effects Analysis)

**Behavior of generic  
elements**

**Automatic generation  
of behavioral model**

**Automatic generation  
and deployment of  
diagnosis algorithms**

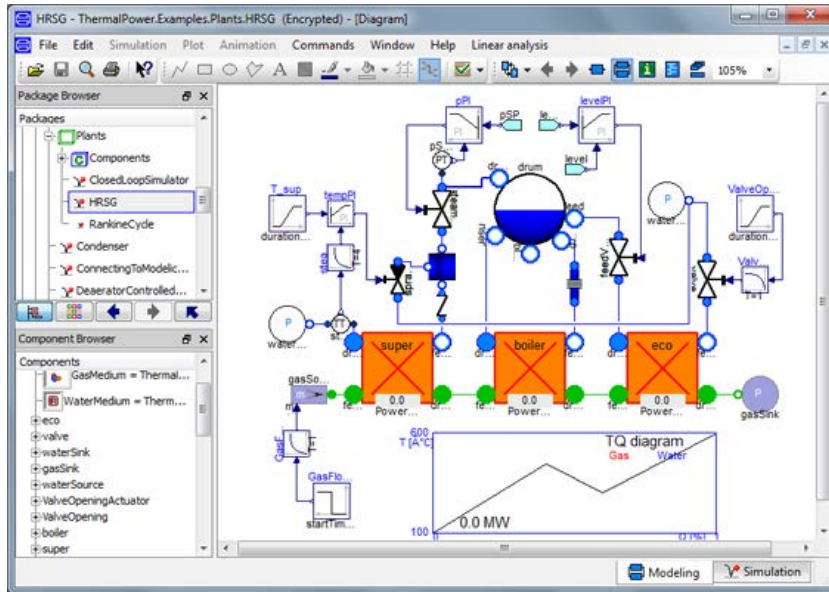


# Modelica & System wide Diagnosis



# Modelica

(DAE: Differential Algebraic Equation)

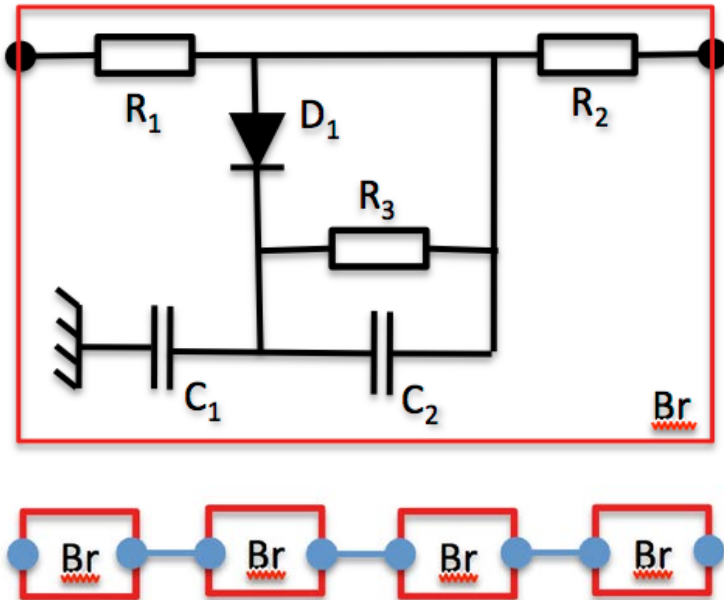


Modelica: multi-mode DAE systems:

$$\begin{cases} \text{if } b \text{ do } F(\dot{x}, x, u) = 0 \\ b = \text{BoolCond}(\dot{x}, x, u) \end{cases}$$

- **Modelica supports component based physical system modeling** (not Simulink)
- **Compilation is complex:**
  - Latent constraints
  - Index reduction
  - Structural analysis...
- **Requires sophisticated causality analyses** (as for bond graphs)
- **Idea: exploit the power of Modelica analyses by automatically deriving parity checks**

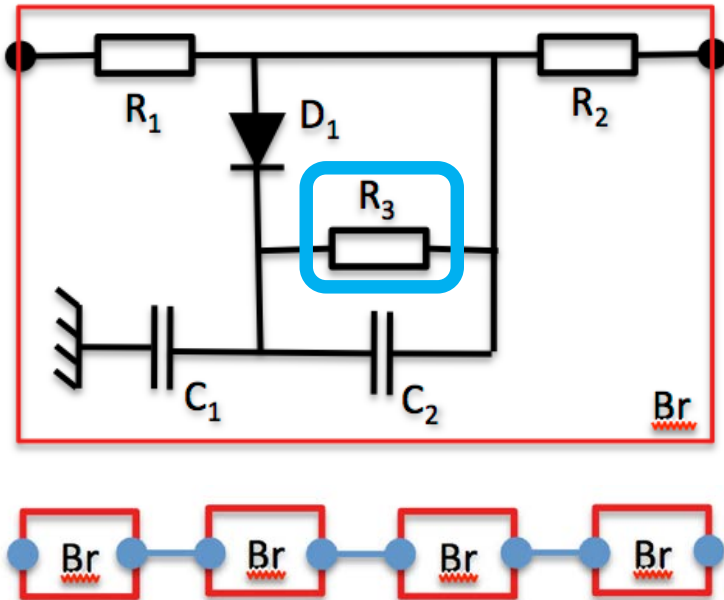
# From Modelica to parity checks, automatically



- Westinghouse braking system;  
control: pressure at the head of the train
- Each wagon induces two modes:  
valve  $D_1$  open / closed
  - $2^n$  modes for a  $n$  wagons train
- Resistor  $R_3$  captures possible leakage

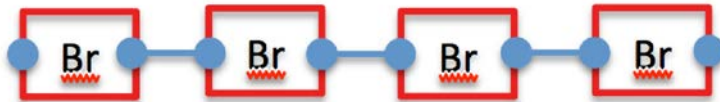
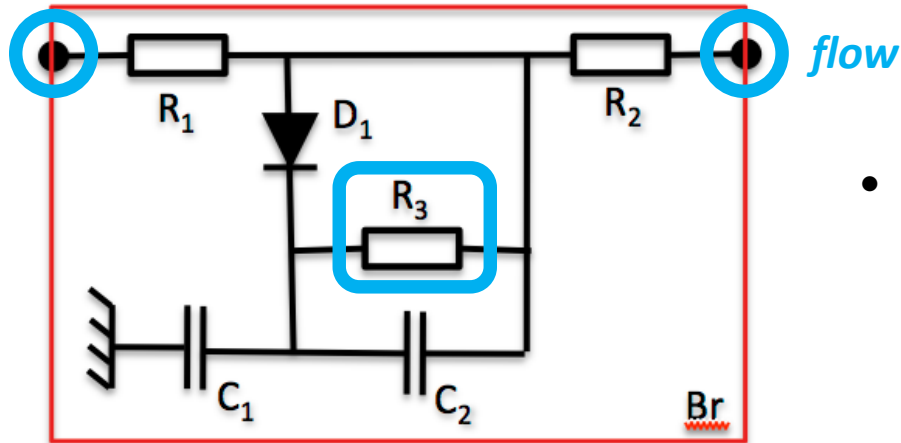


# From Modelica to parity checks, automatically



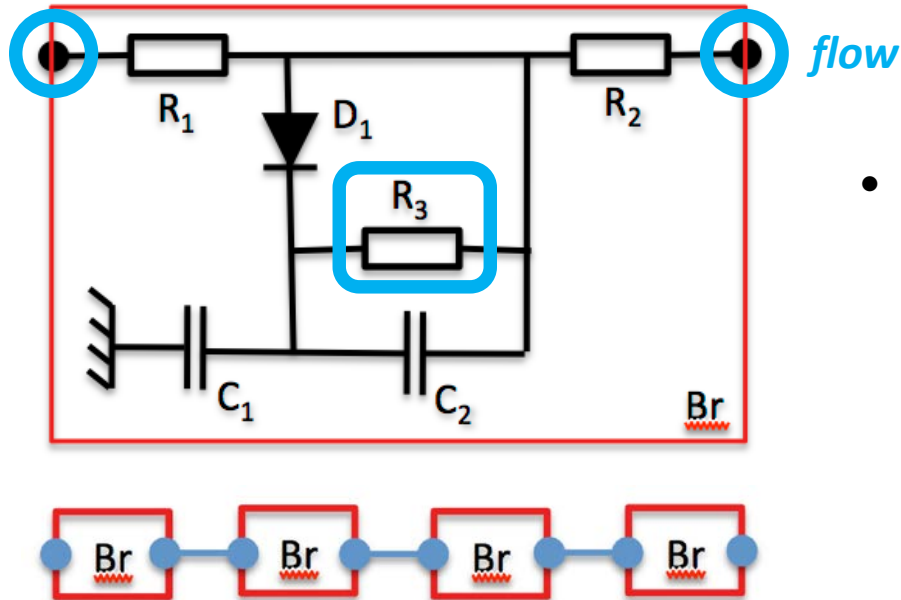
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valve  $D_1$  open / closed
  - $2^n$  modes for a  $n$  wagons train
- Resistor  $R_3$  captures possible leakage
  - Nominal / Leak :  $R_3 = \infty / R_3 < \infty$
- **Goal: monitoring for a possible leakage**
  - What should we measure?
  - Where to put sensors?
  - Getting all of this from Modelica compilation

# From Modelica to parity checks, automatically



- The failure is non detectable when  $D_1$  is open (no breaking mode)
  - (no flow traverses  $R_3$  in this case)
  - Diagnosticability is mode-dependent (recall:  $2^n$  modes for a  $n$  wagons train)
- How to generate parity checks
  - To monitor all possible leaks
  - By measuring (some or all of) the *flows*?

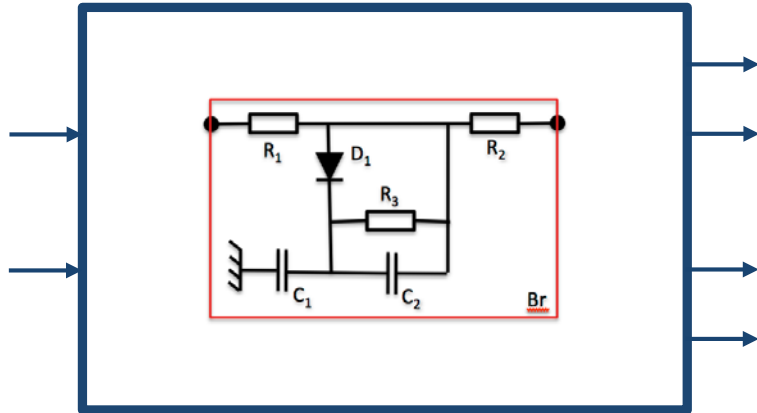
# From Modelica to parity checks, automatically



- Idea: reuse the same Modelica model with the following adjustments:
  - Subset of the flows  $\varphi_{j_1}, \dots, \varphi_{j_k}$  : inputs (possibly constrained)
  - Resistors  $R_1, \dots, R_n$ : nominal parameters
  - Unobserved states  $X = (x_1, \dots, x_m)$
- The mode-dependent causality analysis of the Modelica model reveals that diagnosticability is mode-dependent



# From Modelica to parity checks, automatically



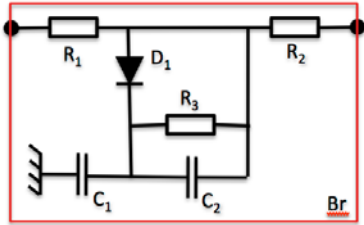
- We have our Modelica model for simulation



- And the actual system for monitoring
- Some (but not all) states or outputs are measured



# From Modelica to parity checks, automatically



- And feed the Modelica model with all the measurement data
- Yields an overconstrained Modelica model; exploit it to measure model/data fit
- Collect measurement data from the system in operation

# Contents

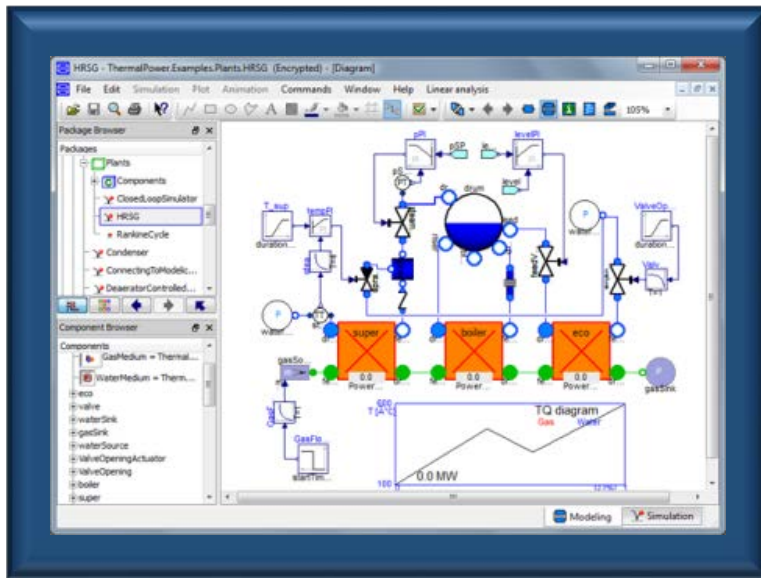
- 1. Physical Modeling & Systems Design:  
a vision**
- 2. The foundations for compiling Modelica  
(multi-mode DAE systems)**





# The need for flexibility and solid foundations

# Modelica, thou shall be flexible and formally sound



- **Flexible**

- Simulating
- Supporting safety analyses
- Generating fault trees
- Generating parity equations
- Handling multi-mode with no restriction
- Supporting non-regular systems?

- **Formally sound**

- Benefiting from the heritage of synchronous languages

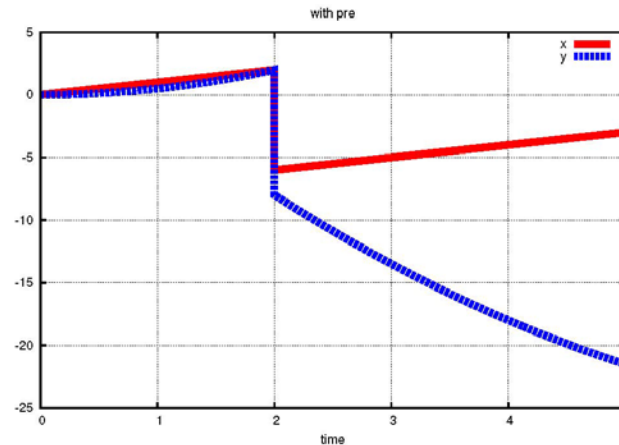
# Challenging hybrid causal loops in Modelica tools

```
model scheduling
  Real x(start=0);
  Real y(start=0);
```

```
equation
  der(x)=1;
  der(y)=x;
```

```
when x>=2 then
  reinit(x,-3*pre(y));
end when;
when x>=2 then
  reinit(y,-4*pre(x));
end when;
```

```
end scheduling
```



At the instant of reset,  $x$  and  $y$  each have a value defined in terms of their values just prior to the reset.

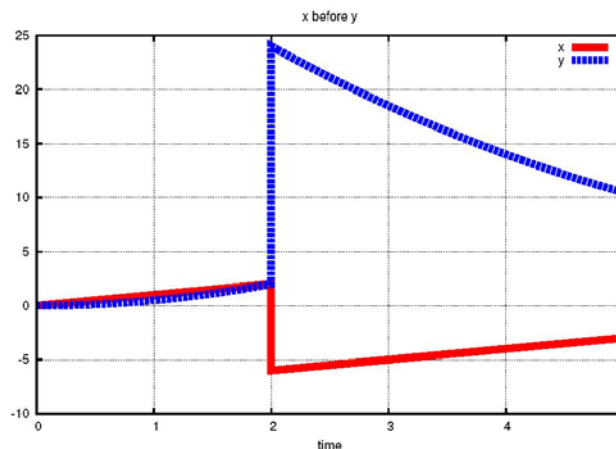
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  when x>=2 then
    reinit(y,-4*x);
  end when;

end scheduling
```



## Take the pre's away:

At the time of reset,  $x$  and  $y$  are in cyclic dependency chain.

The simulation runtime (of both OpenModelica and Dymola), chooses to reinitialize  $x$  first, with the value -6 as before, and then to reinitialize  $y$  in terms of the updated value of  $x$ : 24.

# Challenging hybrid causal loops in Modelica tools

```
model scheduling
  Real x(start=0);
  Real y(start=0);
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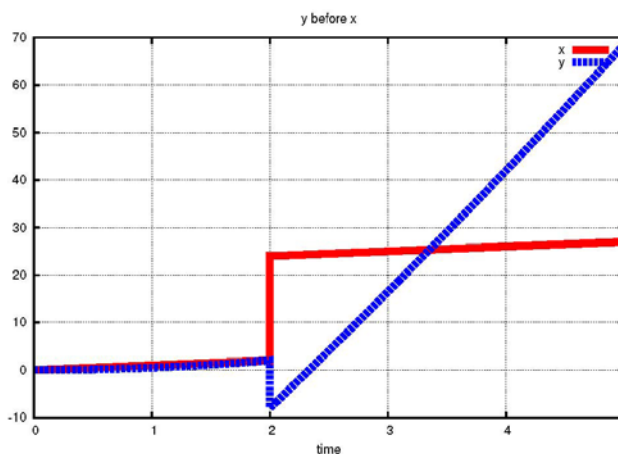
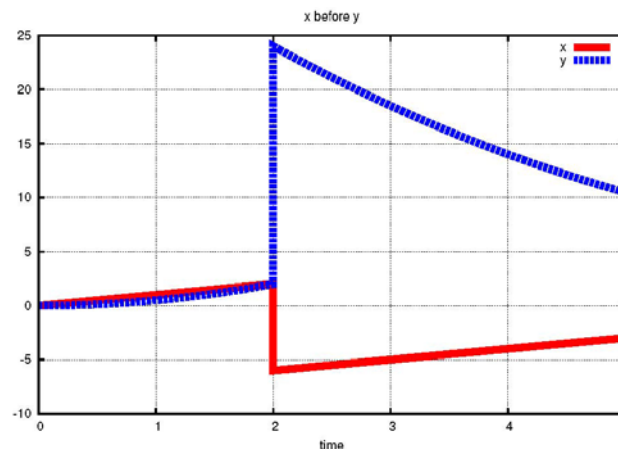
```
end when;
```

```
when x>=2 then
```

```
  reinit(y,-4*x);
```

```
end when;
```

```
end scheduling
```



**What happens, if we reverse the order of the two reinit?...**

The simulation result changes, as shown on the bottom diagram.

The same phenomenon occurs if the reinit's are each placed in their own when clause.

# Challenging hybrid causal loops in Modelica tools

- The causal version (with the “pre”) is scheduled properly and simulates as expected.
- The non-causal programs are accepted as well, but the result is not satisfactory.
- Algebraic loops cannot be rejected, even in resets, since they are just another kind of equation. They should be accepted, but the semantics of a model must not depend on its layout!
- Studying causality can help to understand the detail of interactions between discrete and continuous code.



# All about synchronous languages in a few slides

**Compilation schemes from the Constructive Semantics**

# An example of Signal program and its compilation

- **Why discussing Signal?**
  - Among synchronous languages, Signal is closest to Modelica
  - It has clocks and equations on clocks, and
  - Requires mode-dependent causality analysis



# An example of Signal program and its compilation

- **Why discussing Signal?**

- Among synchronous languages, Signal is closest to Modelica
- It has clocks and equations on clocks, and
- Requires mode-dependent causality analysis



- **The Signal vintage watch**

- This is an old mechanical watch like the one I have. Turn the button. The watch goes for some time, and then stops. When it stops, turn again the button... and so on...

# An example of Signal program and its compilation

```
(  X := IN default ZX-1  
|  ZX := X$1 init 0  
|  IN ^= when (ZX ≤ 0) )
```

Input IN returns X

This was Signal code; Lustre-like pseudo-code follows:

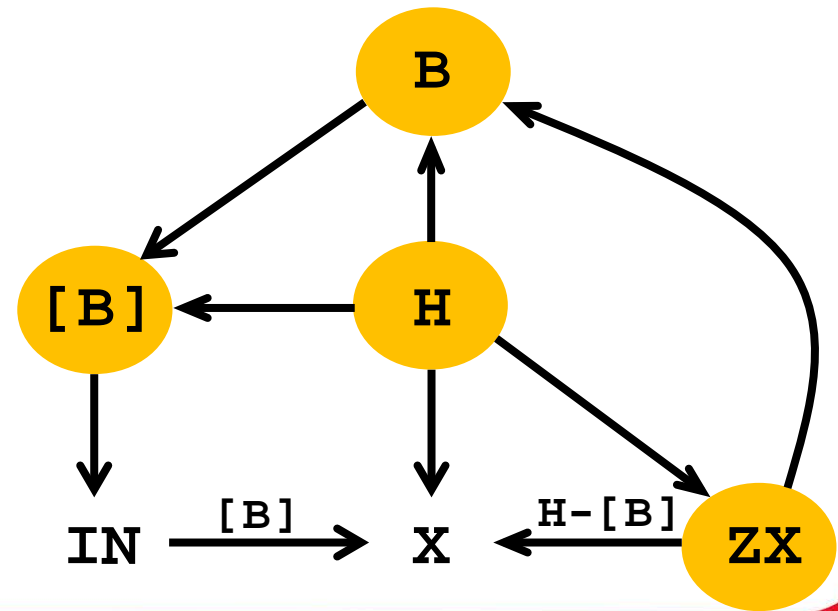
```
pre(X) init 0 in  
if pre(X) ≤ 0  
    then (get IN and set X := IN)  
    else (set X := pre(X)-1)
```



# An example of Signal program and its compilation

```
(  X := IN default ZX-1
|  ZX := X$1 init 0
|  B := (ZX ≤ 0)
|  IN ^= (when B) ^< B
|  H ^= B ^= X ^= ZX )
```

[B]: when B

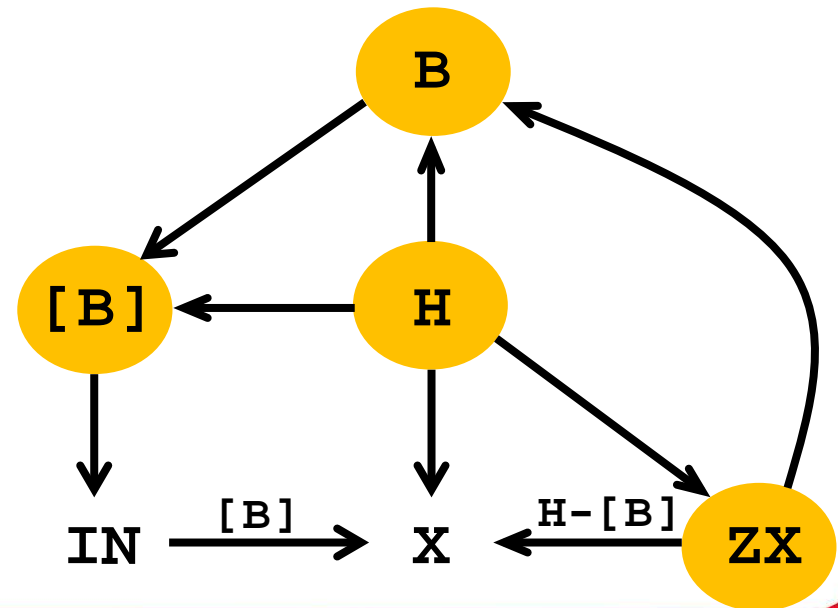


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[B]: when B

Case B = true  
Case B = false

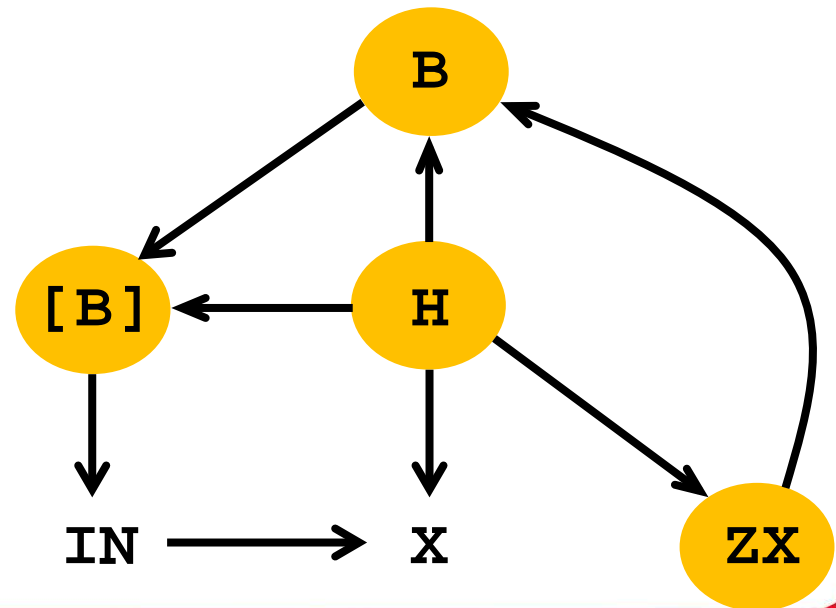


# An example of Signal program and its compilation

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[B]: when B

Case B = true



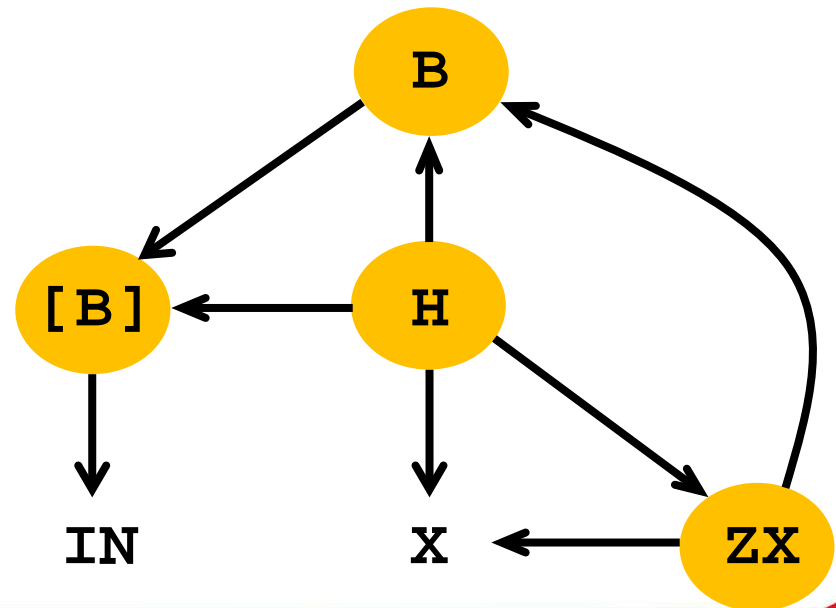
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[B]: when B



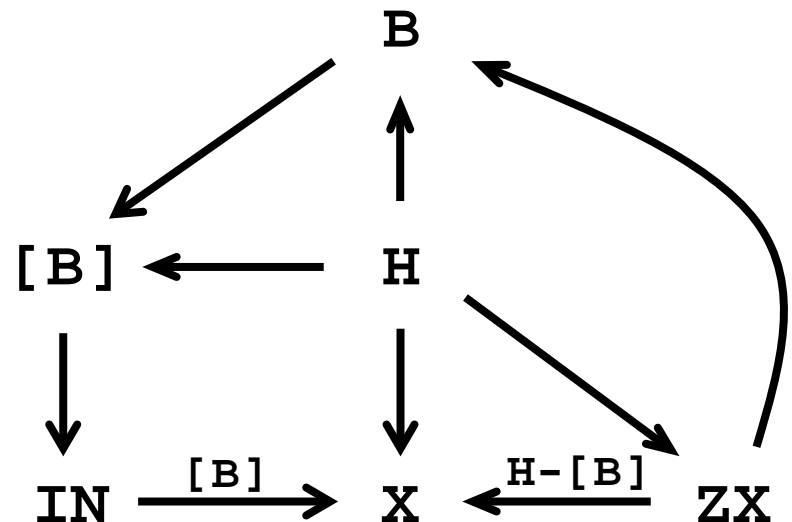
Case B = false



# An example of Signal program and its compilation

## Constructive Semantics:

execution scheme that schedules  
atomic actions (here: evaluating expressions)  
and successfully evaluates all variables at each reaction





# **From Synchronous Languages to the Structural Analysis of multi-mode DAE systems**

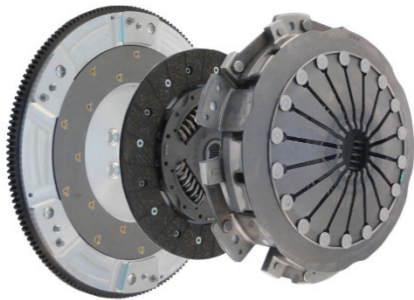
**From continuous to discrete time  
using non-standard analysis**



# A simple clutch

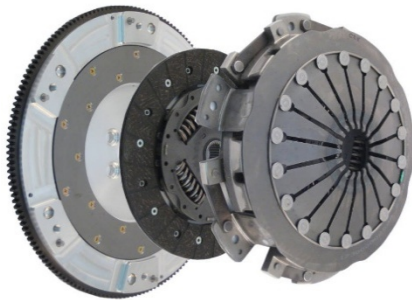
$$\left\{ \begin{array}{l} \omega'_1 = f_1(\omega_1, \tau_1) \\ \omega'_2 = f_2(\omega_2, \tau_2) \\ \text{if } \gamma \text{ then } \begin{cases} \omega_1 - \omega_2 = 0 \\ \tau_1 + \tau_2 = 0 \end{cases} \\ \text{else } \begin{cases} \tau_1 = 0 \\ \tau_2 = 0 \end{cases} \end{array} \right.$$

- The clutch has two modes:
  - *engaged* :  $\gamma = T$  ; DAE
  - *released* :  $\gamma = F$  ; ODE



# A simple clutch

$$\left\{ \begin{array}{l} \omega'_1 = f_1(\omega_1, \tau_1) \\ \omega'_2 = f_2(\omega_2, \tau_2) \\ \text{if } \gamma \text{ then } \begin{cases} \omega_1 - \omega_2 = 0 \\ \tau_1 + \tau_2 = 0 \end{cases} \\ \text{else } \begin{cases} \tau_1 = 0 \\ \tau_2 = 0 \end{cases} \end{array} \right.$$



- The clutch has two modes:
  - *engaged* :  $\gamma = T$  ; DAE
  - *released* :  $\gamma = F$  ; ODE
- Is it enough to make DAE analysis mode dependent?
  - problem: this says nothing about how to handle the resets at mode change
- When the clutch engages and the two rotation speeds differ, an impulse occurs for the torques
- This example is not supported by existing Modelica tools today

# A simple clutch the “engaged” mode

$$\left\{ \begin{array}{l} \omega'_1 = f_1(\omega_1, \tau_1) \\ \omega'_2 = f_2(\omega_2, \tau_2) \\ \text{if } \gamma \text{ then } \begin{cases} \omega_1 - \omega_2 = 0 \\ \tau_1 + \tau_2 = 0 \end{cases} \\ \text{else } \begin{cases} \tau_1 = 0 \\ \tau_2 = 0 \end{cases} \end{array} \right.$$

$$\left\{ \begin{array}{ll} \omega'_1 = f_1(\omega_1, \tau_1) & (e_1) \\ \omega'_2 = f_2(\omega_2, \tau_2) & (e_2) \\ \omega_1 - \omega_2 = 0 & (e_3) \\ \omega'_1 - \omega'_2 = 0 & (e_4) \\ \tau_1 + \tau_2 = 0 & (e_5) \end{array} \right.$$

- The source DAE model is in black
- In **red** I have added a **latent equation**, which implicitly holds although not written in the source
- When all latent equations are added (here only 1), we inherit a structurally nonsingular system of algebraic eqns  $(e_1, e_2, e_4, e_5)$  with dependent variables  $(\tau_1, \tau_2, \omega'_1, \omega'_2)$  (**dummy derivatives**)
- Solving it yields the velocities as an implicit function of the positions  $\approx$ ODE

# A simple clutch trying existing tools

$$\left\{ \begin{array}{l} \omega'_1 = f_1(\omega_1, \tau_1) \\ \omega'_2 = f_2(\omega_2, \tau_2) \\ \text{if } \gamma \text{ then } \begin{cases} \omega_1 - \omega_2 = 0 \\ \tau_1 + \tau_2 = 0 \end{cases} \\ \text{else } \begin{cases} \tau_1 = 0 \\ \tau_2 = 0 \end{cases} \end{array} \right.$$

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- Unfortunately, this tells nothing about how to handle the mode changes
- The difficult case is  $\gamma: F \rightarrow T$  (the clutch gets engaged)
- Some simulation results for this example by existing tools follow

# A simple clutch trying Modelica

```
model ClutchBasic
parameter Real w01=1;
parameter Real w02=1.5;
parameter Real j1=1;
parameter Real j2=2;
parameter Real k1=0.01;
parameter Real k2=0.0125;
parameter Real t1=5;
parameter Real t2=7;
Real t(start=0, fixed=true);
Boolean g(start=false);
Real w1(start = w01, fixed=true);
Real w2(start = w02, fixed=true);
Real f1;
Real f2;
equation
der(t) = 1;
g = (t >= t1) and (t <= t2);
j1*der(w1) = -k1*w1 + f1;
j2*der(w2) = -k2*w2 + f2;
0 = if g then w1-w2 else f1;
f1 + f2 = 0;
end ClutchBasic;
```

- Mode changes  $F \rightarrow T \rightarrow F$  at  $t = 5, 10$

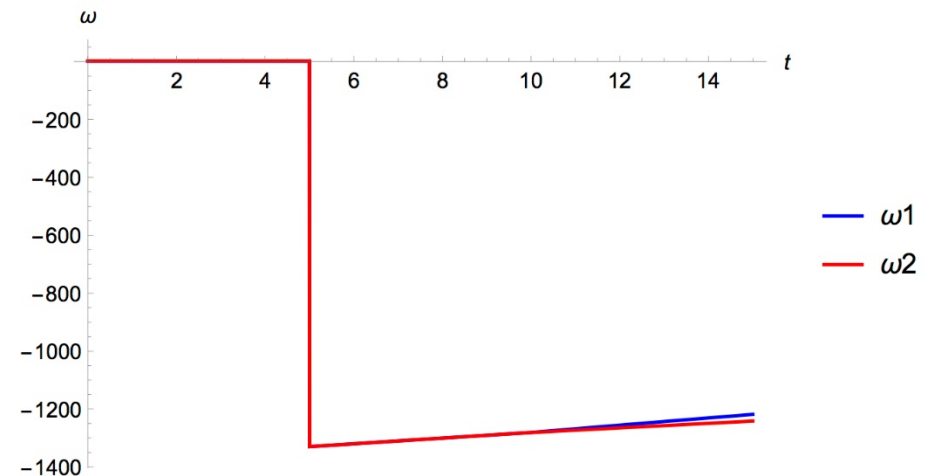
The following error was detected at time: 5.002  
Error: Singular inconsistent scalar system for  
 $f1 = ((\text{if } g \text{ then } w1-w2 \text{ else } 0.0))/(-(\text{if } g \text{ then } 0.0 \text{ else } 1.0)) = -0.502621/-0$   
Integration terminated before reaching  
"StopTime" at T = 5

- The reason is that Dymola has symbolically pivoted the system of equations, independently of the mode. By doing so, it has produced an equation defining  $f1$  that is singular in mode  $g$ .

# A simple clutch trying Mathematica (NDSolve)

```
NDSolve[{
w1'[t] == -0.01 w1[t] + t1[t],
2 w2'[t] == -0.0125 w2[t] + t2[t],
t1[t] + t2[t] == 0,
s[t] (w1[t] - w2[t]) + (1 - s[t]) t1[t]
== 0,
w1[0] == 1.0, w2[0] == 1.501, s[0] == 0,
WhenEvent[t == 5,
{s[t] -> 1}
],
},
{w1, w2, t1, t2, s},
{t, 0, 7}, DiscreteVariables -> s]
```

No crash at mode change. But  
nondeterministic reset reveals that  
cold restart is indeed performed by  
NDSolve on this example.



Mode changes  
 $F \rightarrow T$  at  $t = 5$   
 $T \rightarrow F$  at  $t = 10$

# A simple clutch a comprehensive approach

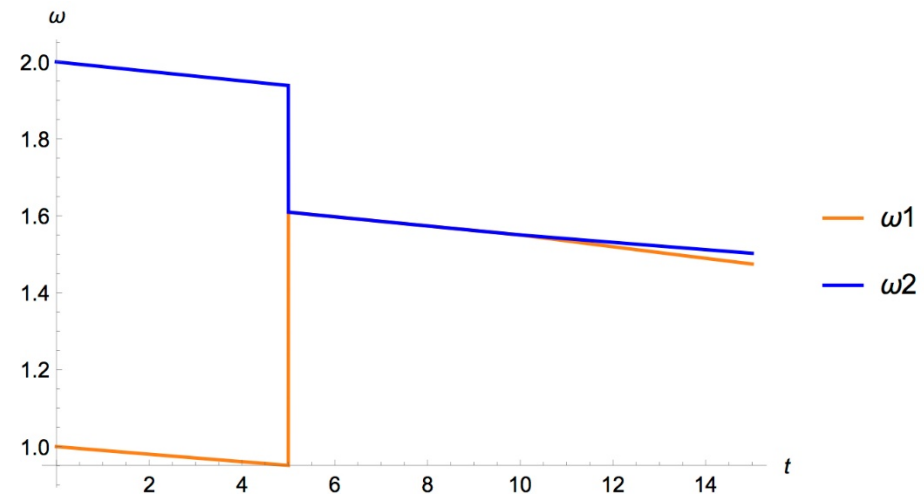
$$\left\{ \begin{array}{l} \omega'_1 = f_1(\omega_1, \tau_1) \\ \omega'_2 = f_2(\omega_2, \tau_2) \\ \text{if } \gamma \text{ then } \left\{ \begin{array}{l} \omega_1 - \omega_2 = 0 \\ \tau_1 + \tau_2 = 0 \end{array} \right. \\ \text{else } \left\{ \begin{array}{l} \tau_1 = 0 \\ \tau_2 = 0 \end{array} \right. \end{array} \right.$$

- The difficult case is  $\gamma: F \rightarrow T$  (the clutch gets engaged)
- We handle this by invoking nonstandard analysis and expand:  
 $\omega' = \frac{\omega^\blacksquare - \omega}{\partial}$  where  $\omega^\blacksquare$  is the “next” operator and time step  $\partial$  is an infinitesimal of nonstandard analysis
- This brings the whole model to discrete-time and we are able to combine the techniques from synchronous languages with those of index analysis from DAE

# A simple clutch our results

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The reset is handled satisfactorily.  
The rotation speed right after engagement sits between the two rotation speeds before, which matches the intuition from physics.



Mode changes  
 $F \rightarrow T$  at  $t = 5$   
 $T \rightarrow F$  at  $t = 10$





# Structural Analysis of multi-mode DAE systems

**See my detailed lecture**

# Conclusion

## 1. Physical modeling is central to systems design

- Modeling for simulation
- Modeling fault propagation
- Generating parity checks for diagnostics
- Complemented with modeling the computing architecture

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## 1. Physical modeling is central to systems design

- Modeling for simulation
- Modeling fault propagation
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- Complemented with modeling the computing architecture

## 2. The compilation of physical models requires a difficult structural analysis

- Source of difficulties in current tools
- Techniques from synchronous languages help
- Efficient algorithms are yet to obtain

# Thanks

