Type-Based Structural Analysis for Modular Systems of Equations *Linköping University, 19 June 2014*

Henrik Nilsson Joint work with John Capper

School of Computer Science University of Nottingham

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- Ideally we would like to know, as early as possible:
 - Is a system of equations solvable?
 - Does an individual equation system fragment "make sense"; i.e., could it be part of a solvable system?

Studying/enforcing aspects of the relation between equations and variables occurring in them can help identifying problems, e.g.:

- Bunus and Fritzon's work on debugging Modelica models [1]
- Broman, Nyström, and Fritzon's work on enforcing balance between variables and equations through the Modelica type system [2]
- Modelica's notion of balanced models

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However, (static) *guarantees* only possible under very limited circumstances.

• Consider an equation over \mathbb{R} :

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The same holds for:

$$x - y + z = 1$$
 $z = 2$
(2)

Composing (1) and (2):

$$x + y + z = 0$$

$$x - y + z = 1$$

$$z = 2$$

Does have a solution.

(3)

Composing (1) and (2):

$$\begin{array}{rcl} x+y+z &=& 0\\ x-y+z &=& 1 \end{array}$$

 \boldsymbol{z}

(3)

(4)

Does have a solution.

 However, the following fragment is over-constrained:

$$\begin{array}{rcl} x &=& 1 \\ x &=& 2 \end{array}$$

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However, would accept:

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 - Partial models are allowed to be unbalanced
- Early detection, but type-level information limited to partial model or not.

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- Finds more problems than simple balance checking.
- Would reject (5)
- Based on analysing a complete system, so late detection. (Intended to be a debugging tool.)

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- Type-based approaches inherently modular.
- Sensible to look for type-based solutions if we wish to support
 - First-class equation system fragments
 - Equation systems that vary over time (structural dynamism).
- How far beyond basic balance checking can we go with a type-based approach?
- We'll investigate two approaches:
 - Incidence Type
 - Structural Well-Formedness

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Our work has been carried out in the setting of Functional Hybrid Modelling (FHM), so let's opt for that.

(But remember: the ideas are generally applicable.)

The FHM Setting (1)

 FHM: functional approach to modelling and simulation of (physical) systems that can be described by an *evolving* set of differential equations.



The FHM Setting (2)

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 Equations system fragments are frst-class entities at the functional level; viewed as relations on signals, or signal relations.

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- Temporal composition: *switching* from one structural configuration into another.

$\begin{array}{l} \textit{resistor} :: \texttt{Resistance} \to \texttt{SR} \left(\texttt{Pin}, \texttt{Pin}\right) \\ \textit{resistor} \ r = \textbf{sigrel} \ (p, n) \ \textbf{where} \\ \textbf{local} \ \textbf{u} \\ \textit{twoPin} \diamond (p, n, u) \\ r \cdot p.i = u \end{array}$

Parametrised model represented by function mapping parameters to a model. Note: first class models! resistor :: Resistance \rightarrow SR (Pin, Pin) resistor r = Sigrel (p, n) where local u $twoPin \diamond (p, n, u)$ $r \cdot p.i = u$

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Composition by signal relation application (f_1 , f_2 are known function symbols):

foo :: SR (Real, Real, Real)
foo = sigrel
$$(x_1, x_2, x_3)$$
 where
 $f_1 x_1 x_2 x_3 = 0$
 $f_2 x_2 x_3 = 0$

$$foo \diamond (u, v, w) \\ foo \diamond (w, u + x, v + y) \\ \textbf{/ields}$$

$$\begin{array}{l} f_1 \ u \ v \ w &= 0 \\ f_2 \ v \ w &= 0 \\ f_1 \ w \ (u + x) \ (v + y) = 0 \\ f_2 \ (u + x) \ (v + y) &= 0 \end{array}$$

Evolving system of equations by switching blocks of equations in and out:

 $initially [; when \ condition_1] \Rightarrow equations_1$ $when \ condition_2 \Rightarrow equations_2$

when $condition_n \Rightarrow equations_n$

FHM is thus characterised by *iterative staging*:

- 1. Compute model ("flat" system of equations)
- 2. Simulate (solve)
- 3. Repeat

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- However typical solvers are predicated on the system being structurally non-singular.
- Insisting on structural non-singularity thus makes sense and is not overly onerous.

Structural singularities can be discovered by studying the *incidence matrix*:

Equations Incidence Matrix

$$\begin{array}{rcrcrcrcr}
f_1(x,y,z) &=& 0 \\
f_2(z) &=& 0 \\
f_3(z) &=& 0
\end{array} \qquad \begin{pmatrix} x & y & z \\
1 & 1 & 1 \\
0 & 0 & 1 \\
0 & 0 & 1 \end{pmatrix}$$

A Possible Refinement (3)

So maybe we can index signal relations by incidence matrices?

foo :: SR (Real, Real, Real)

$$\left(\begin{array}{rrrr}1&1&1\\0&1&1\end{array}\right)$$

 $foo = \mathbf{sigrel} (x_1, x_2, x_3)$ where $f_1 x_1 x_2 x_3 = 0$ $f_2 x_2 x_3 = 0$

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- Two interrelated instances:
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 - Incidence type of a signal relation
- The incidence type of signal relation is obtained by *abstraction* over the incidence type of a system of equations as some variables are *local*.

Composition of Incidence Types (1)

Recall

foo :: SR (Real, Real, Real)
$$\begin{pmatrix} 1 & 1 & 1 \\ 0 & 1 & 1 \end{pmatrix}$$

Consider

 $foo \diamond (u, v, w)$ $foo \diamond (w, u + x, v + y)$

in a context with five variables u, v, w, x, y.

Composition of Incidence Types (2)

The incidence type for the equations obtained by instantiating *foo* is simply obtained by Boolean matrix multiplication. For $foo \diamond (u, v, w)$:

$$\begin{pmatrix} u & v & w & x & y \\ 1 & 1 & 1 \\ 0 & 1 & 1 \end{pmatrix} \begin{pmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 \end{pmatrix} =$$
$$\begin{pmatrix} u & v & w & x & y \\ 1 & 1 & 1 & 0 & 0 \\ 0 & 1 & 1 & 0 & 0 \end{pmatrix}$$

Composition of Incidence Types (3)

For $foo \diamond (w, u + x, v + y)$:



Composition of Incidence Types (4)

Complete incidence matrix and corresponding equations:

$$\begin{aligned} f_1 \ u \ v \ w &= 0 \\ f_2 \ v \ w &= 0 \\ f_1 \ w \ (u + x) \ (v + y) &= 0 \\ f_2 \ (u + x) \ (v + y) &= 0 \end{aligned}$$

Now consider encapsulating the equations:

 $bar = \mathbf{sigrel} (u, y) \mathbf{where}$ $\mathbf{local} v, w, x$ $foo \diamond (u, v, w)$ $foo \diamond (w, u + x, v + y)$

The equations of *bar* needs to be partitioned into:

 Local Equations: equations used to (notionally) solve for the local variables

 Interface Equations: equations contributed to the outside

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Note: too few or too many local equations, or too many interface equations, means *locally underdetermined* or *overdeteremined* systems of equations.

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- We have 1 a priori local equation, 3 mixed equations
- We need to choose 3 local equations (as 3 local variables) and 1 interface equation
- Consequently, 3 possibilities, yielding the following possible incidence types for *bar*:

$$\begin{pmatrix} u & y & u & y & u & y \\ \begin{pmatrix} 1 & 0 \end{pmatrix} & \begin{pmatrix} 1 & 1 \end{pmatrix} & \begin{pmatrix} 1 & 1 \end{pmatrix} \end{pmatrix}$$

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Details in [1].

Pros and Cons

Works for analysis in a first-order setting. However:

- Incidence types not intuitive.
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- Type annotations would often be needed.
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Is there a middle ground between incidence types and basic equation-variable balance?

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Signal relation types are indexed by *balance*: henceforth meaning the *number of contributed equations*. Further, *constraints* on balance variables: $(2 \le m \le 4, 3 \le n \le 5) \Rightarrow SR (...) m \rightarrow SR (...) n$

The approach distinguishes two kinds of variables:

- interface variables (i_Z)
- local variables (l_Z)

and three kinds of equations:

- interface equations (i_Q)
- mixed equations (m_Q)
- local equations (l_Q)

Total number of equations: $a_Q = i_Q + m_Q + l_Q$.

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Total number of equations: $a_Q = i_Q + m_Q + l_Q$. Note: abstraction of earlier notion of local equation etc.

A signal relation is *structurally well-formed* (SWF) iff:

- **1.** $l_Q + m_Q \ge l_Z$
- **2.** $l_Q \leq l_Z$
- **3.** $i_Q \leq i_Z$
- **4.** $a_Q l_Z \le i_Z$

5. $i_Q \ge 0, m_Q \ge 0, l_Q \ge 0$

The balance (contribution) of a SWF relation is $n = a_Q - l_Z$.

Structural Dynamism

Recall that FHM allows for an evolving system of equations:

 $initially [; when \ condition_1] \Rightarrow equations_1$ $when \ condition_2 \Rightarrow equations_2$

when $condition_n \Rightarrow equations_n$

What about structural well-formedness?

Exactly one switch-branch active at any point. How should the number of equations in each branch be related?

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- Strong Approach: exactly the same number of interface, mixed, and local equations in each branch.
 Very restrictive.
- Weak Approach: same number of equations in each branch.
 Loses too much information.
- Fair Approach: branches are reconcilable.

A switch-block is **reconcilable**, contributing iinterface equations, m mixed equations, l local equations, iff i, m, l satisfying the following constraints for each branch k can be found:

6. $i \ge i_k \ge 0$ 7. $l \ge l_k \ge 0$ 8. $m \le m_k - (i - i_k) - (l - l_k)$ 9. $i + m + l = i_k + m_k + l_k$

Note: Interestingly, m may be negative!

Preservation? (1)

Consider:

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Both *foo* and *fie* are structurally well-formed (why?) with balance 1 and 0, respectively.

Preservation? (2)

But if we carry out some "flattening":

$$fie = sigrel (u) where$$
$$local z, v$$
$$f (u, v, z) = 0$$
$$g (u) = 0$$

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Reduction turned a structurally well-formed relation into one that is ill-formed.

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- As to the refinement: we cannot say a (fragment of an) equation system is "definitely not flawed" ...

but we can say it is "not definitely flawed".

- Good enough for finding problems.
- Similarities to e.g. Hybrid Types [Knowles and Flanagan].

References (1)

 Peter Bunus and Peter Fritzson. Methods for structural analysis and debugging of Modelica models. In Proceedings of the 2nd International Modelica Conference, pp. 157–165, Oberpfaffenhofen, Germany. March 2002.

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