

# Hybrid vs. nonsmooth dynamical systems

## Why can it be so difficult to model physics in hybrid modelers? <sup>1</sup>

Benoît Caillaud

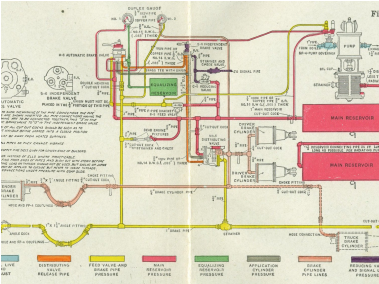
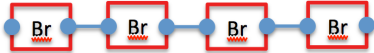
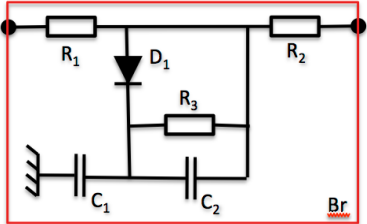
Inria  
Rennes, France

Aussois, 1–5 December 2014

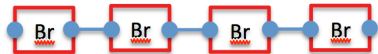
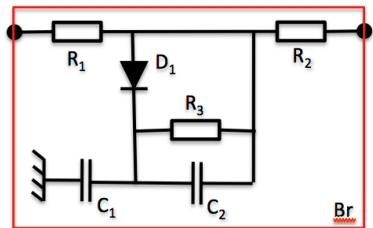
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<sup>1</sup>Collaboration with A. Aljarbooh, A. Benveniste, T. Bourke et M. Pouzet.

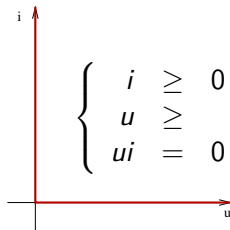
# Example: the Westinghouse brake



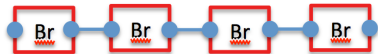
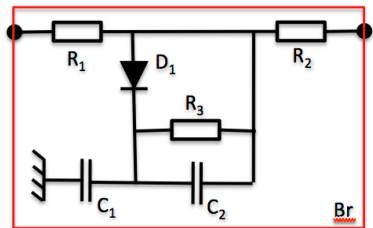
## Example: the Westinghouse brake



$$\left\{ \begin{array}{l} Ni = 0 \\ Ku = 0 \\ \mathbf{u} - R\mathbf{i} = 0 \\ C\dot{\mathbf{u}} - \mathbf{i} = 0 \\ \forall i \quad 0 \leq \mathbf{i}_{D_i} \perp \mathbf{u}_{D_i} \geq 0 \end{array} \right.$$



## Example: the Westinghouse brake



$$\left\{ \begin{array}{l} N\mathbf{i} = \mathbf{0} \\ K\mathbf{u} = \mathbf{0} \\ \mathbf{u} - R\mathbf{i} = \mathbf{0} \\ C\dot{\mathbf{u}} - \mathbf{i} = \mathbf{0} \\ \forall i \quad 0 \leq \mathbf{i}_{D_i} \perp \mathbf{u}_{D_i} \geq 0 \end{array} \right.$$



- ▶  $2^n$  modes
- ▶ Orientation and scheduling are mode dependent
- ▶ Dymola/OpenModelica : need to introduce leakage and impedance in diodes

# Nonsmooth dynamical systems

Dynamical system:

$$\dot{q} = A.q + r$$

Nonsmooth perturbation  $r$ , solution of (for instance) a linear complementarity problem (LCP) :

$$\left\{ \begin{array}{l} r = B.x \\ y = N.q + M.x \\ 0 \leq x \perp y \geq 0 \end{array} \right.$$

Other nonsmooth optimisation problems: MLCP, NLCP, QP

[Siconos](#) numerical library [1, 2]

# Nonsmooth dynamical systems

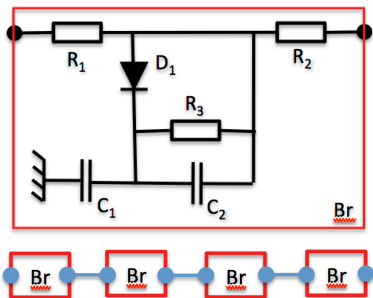
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Other nonsmooth optimisation problems: MLCP, NLCP, QP  
[Siconos](#) numerical library [1, 2]



$$\begin{cases} Ni = 0 \\ Ku = 0 \\ u - Ri = 0 \\ C\dot{u} - i = 0 \\ \forall i \quad 0 \leq i_{D_i} \perp u_{D_i} \geq 0 \end{cases}$$

*A software for modeling and simulation of nonsmooth dynamical systems*

- ▶ C++ numerical library
- ▶ Several layers:
  - ▶ Kernel: nonsmooth optimization, LCP, MLCP (relay), NLCP, Newton impact law, QP
  - ▶ Numerics: system structure, discretization schemes, (N)LCS, MDI
  - ▶ Mechanics: high level multibody mechanics
- ▶ `http://siconos.gforge.inria.fr`

# The Westinghouse brake in Siconos

```
#include "SiconosKernel.hpp"

int main(int argc, char * argv[])
{
    ...; // Define constants and initial state

    // --- Model definition ---

    SP::DynamicalSystemsSet NSDS(new DynamicalSystemsSet());

    // NSDS = linear time-invariant dynamical system (LTIDS) +
    //         linear complementarity problem (LCP)

    // LTIDS: q' = A.q + b + r
    SP::SiconosVector q0(new SiconosVector(2*n));
    SP::SimpleMatrix A(new SimpleMatrix(2*n,2*n));
    SP::SiconosVector b(new SiconosVector(2*n));
    ...; // Initializing q0, A and b
    SP::FirstOrderLinearTIDS RC(new FirstOrderLinearTIDS(q0,A,b));

    // LCP = linear time-inv. relation + complementarity cond.
    // y = N.q + M.x and r = B.x and 0 <= y ortho x >= 0
    SP::SimpleMatrix B(new SimpleMatrix(2*n,n));
    SP::SimpleMatrix M(new SimpleMatrix(n,n));
    SP::SimpleMatrix N(new SimpleMatrix(n,2*n));
    ...; // Initializing B, M and N
    SP::FirstOrderLinearTIR LTIR(new FirstOrderLinearTIR(*N,*B));
    LTIR->setDPtr(M);

    SP::NonSmoothLaw CC(new ComplementarityConditionNSL(n));

    // --- Connecting pieces ---

    NSDS->insert(RC);
    SP::Interaction Inter(new Interaction("I",*NSDS,1,n,CC,LTIR));
    SP::Model Circ(new Model(t0,T,Modeltitle));
    Circ->nonSmoothDynamicalSystem()->insertDynamicalSystem(RC);
    Circ->nonSmoothDynamicalSystem()->link(Inter,RC);

    // --- Initialize simulation ---

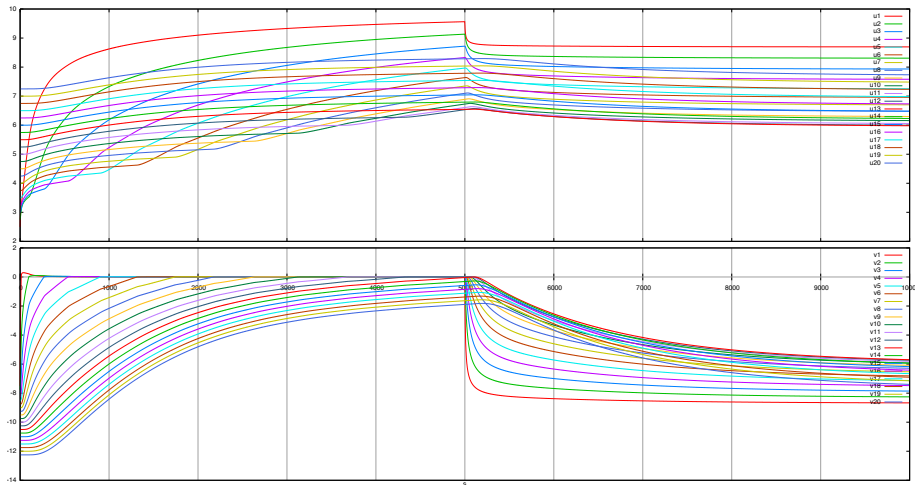
    SP::Moreau OSI(new Moreau(RC,theta)); // Moreau sweeping
    SP::TimeDiscretisation TiDisc(new TimeDiscretisation(t0,tau));
    SP::LCP OSNSP(new LCP()); // Select LCP solver
    SP::TimeStepping Strat(new TimeStepping(TiDisc,OSI,OSNSP));
    Circ->initialize(Strat); // Initialize scheme

    // --- Simulation ---

    for(k = 1 ; k < Ns ; ++k) // Time stepping
    {
        ...; // Get input
        Strat->computeOneStep(); // Solve
        Strat->nextStep(); // Transfer curr. state into last state
    }
}
```



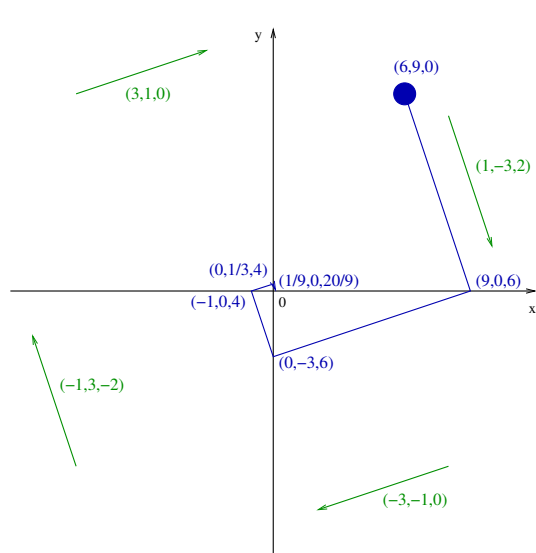
# The Westinghouse brake in Siconos



## Filippov differential inclusions: Zeno + sliding modes

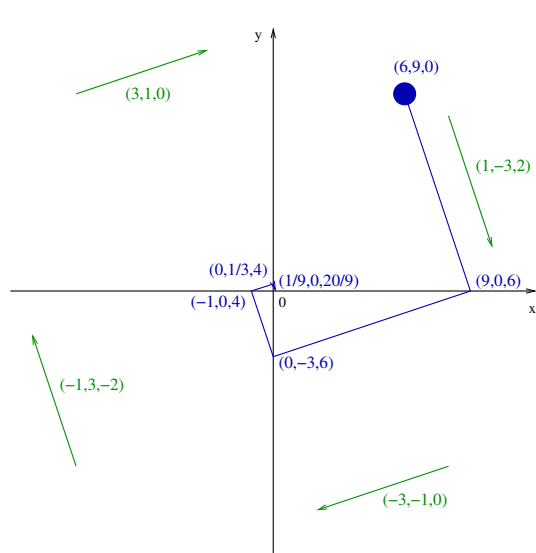
$$\begin{cases} \dot{x} = -\operatorname{sgn}(x) + 2\operatorname{sgn}(y) \\ \dot{y} = -2\operatorname{sgn}(x) - \operatorname{sgn}(y) \\ \dot{z} = \operatorname{sgn}(x) + \operatorname{sgn}(y) \end{cases}$$

# Filippov differential inclusions: Zeno + sliding modes



$$\begin{cases} \dot{x} = -\text{sgn}(x) + 2\text{sgn}(y) \\ \dot{y} = -2\text{sgn}(x) - \text{sgn}(y) \\ \dot{z} = \text{sgn}(x) + \text{sgn}(y) \end{cases}$$

# Filippov differential inclusions: Zeno + sliding modes



$$\begin{cases} \dot{x} = -\text{sgn}(x) + 2\text{sgn}(y) \\ \dot{y} = -2\text{sgn}(x) - \text{sgn}(y) \\ \dot{z} = \text{sgn}(x) + \text{sgn}(y) \end{cases}$$

- ▶ Square “spiral”
- ▶ Attractor :  
line  $x = y = 0$
- ▶ Zeno à  $t = 7.5$
- ▶ Compute  $z$  at  $t = 10$  ?

## Filippov differential inclusions: Zeno + sliding modes

Filippov differential inclusions:

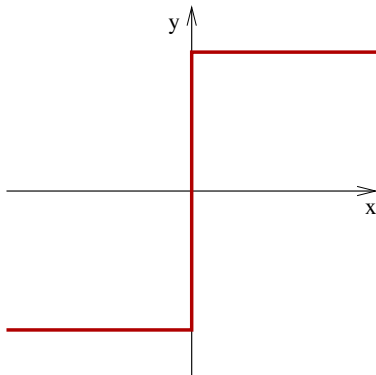
$$\dot{x} = A.x + B.\sigma$$

with:

$$\sigma \in \text{sgn}(C.x)$$

reduction to a Mixed-LCP. Averaging  $\sigma$  over discretization step [3]:

$$\left\{ \begin{array}{l} M.z + q = w - v \\ -1 \leq z \leq 1 \\ (1 + z).w = 0 \\ (1 - z).v = 0 \\ w, v \geq 0 \end{array} \right.$$

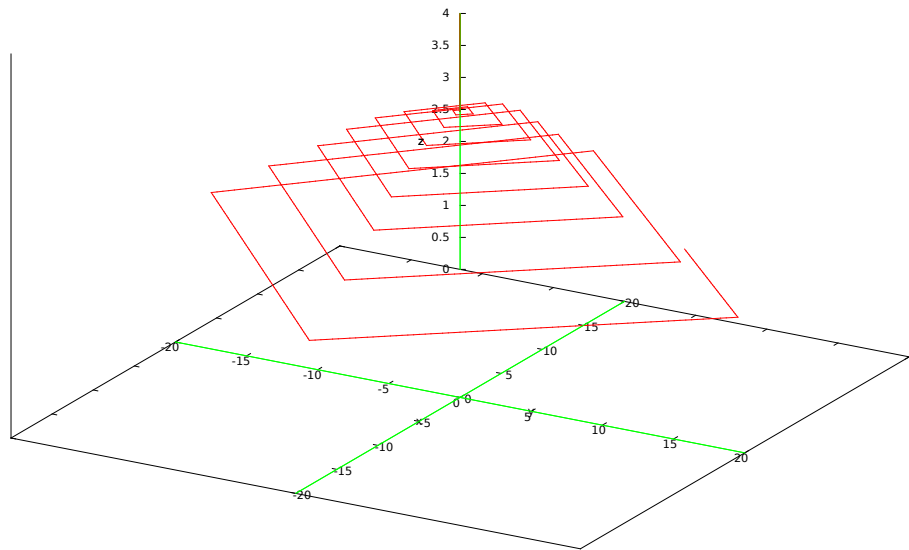


$$\sigma \in \text{sgn}(y)$$

$$\iff$$

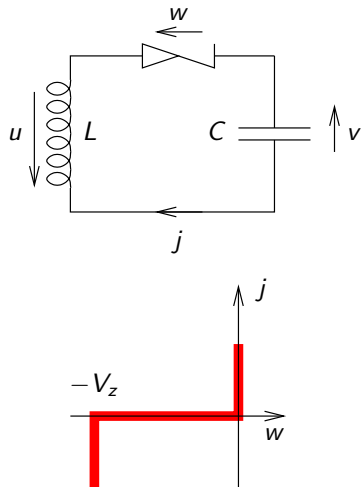
$$y \in N_{[-1,1]}(\sigma) = \{y | \forall \alpha \in [-1, 1], y(\sigma - \alpha) \geq 0\}$$

# Filippov differential inclusions: Zeno + sliding modes



## Detailed example: LZC

$$\left\{ \begin{array}{l} j' = (1/L)u \\ v' = (1/C)j \\ 0 = u + v + w \\ j = j_1 - j_2 \\ w_1 = -w \\ w_2 = w + V_z \\ 0 \leq j_1 \perp w_1 \geq 0 \\ 0 \leq j_2 \perp w_2 \geq 0 \end{array} \right.$$



## Detailed example: LZC

Put system into the following form:

$$\begin{cases} q' = Aq + r \\ r = Bx \\ y = Nq + Mx + d \\ 0 \leq x \perp y \geq 0 \end{cases}$$

Define:

$$q = \begin{bmatrix} j \\ v \end{bmatrix} \quad x = \begin{bmatrix} w_1 \\ j_2 \end{bmatrix} \quad y = \begin{bmatrix} j_1 \\ w_2 \end{bmatrix}$$

This gives:

$$A = \begin{bmatrix} 0 & -\frac{1}{L} \\ \frac{1}{C} & 0 \end{bmatrix} \quad B = \begin{bmatrix} \frac{1}{L} & 0 \\ 0 & 0 \end{bmatrix} \\ N = \begin{bmatrix} 1 & 0 \\ 0 & 0 \end{bmatrix} \quad M = \begin{bmatrix} 0 & 1 \\ -1 & 0 \end{bmatrix} \quad d = \begin{bmatrix} 0 \\ V_z \end{bmatrix}$$



## Detailed example: LZC

Discretization: implicit Euler

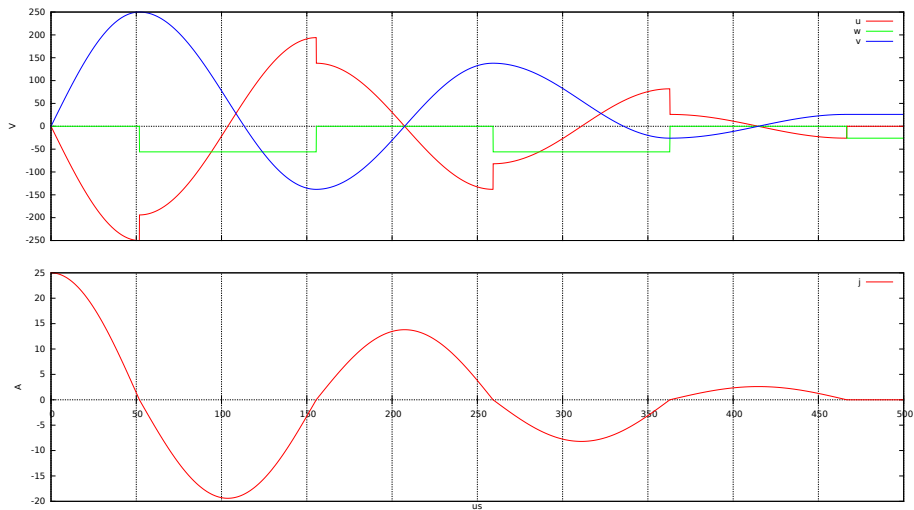
$$\frac{1}{h}(q_{n+1} - q_n) \approx Aq_{n+1} + r_{n+1}$$

With:

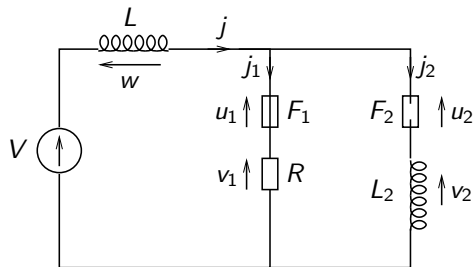
$$\begin{cases} r_{n+1} = Bx_{n+1} \\ y_{n+1} = Nq_{n+1} + Mx_{n+1} + d \\ 0 \leq x_{n+1} \perp y_{n+1} \geq 0 \end{cases}$$

Solve LCP at each step (after elimination of  $q_{n+1}$  in system above)

## Detailed example: LZC



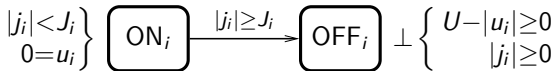
# The two fuses example: Relative degree of a LCS



► Invariant:  
 $j_1, j_2, u_1, u_2 \geq 0$

► Smooth dynamics:

$$\left\{ \begin{array}{l} j' = \frac{1}{L} w \\ j_2' = \frac{1}{L_2} v_2 \\ j_1 = j - j_2 \\ v_1 = R j_1 \\ u_1 + v_1 = u_2 + v_2 \\ = V - w \end{array} \right.$$



$$\left\{ \begin{array}{l} 0 \leq j_1 \quad \perp \quad z_1 - u_1 \geq 0 \\ 0 \leq j_2 \quad \perp \quad z_2 - u_2 \geq 0 \\ \text{when } j_1 \geq J_1 \text{ do } z_1 := U_1 \\ \text{when } j_2 \geq J_2 \text{ do } z_2 := U_2 \end{array} \right.$$

## The two fuses example: Relative degree of a LCS

- ▶ Put system in LCS form:

$$\begin{cases} \dot{x} = Ax + b + r \\ r = B\lambda \\ y = Cx + D\lambda + e \\ 0 \leq y \perp \lambda \geq 0 \end{cases}$$

- ▶ Choose:

$$\begin{aligned} x &= \begin{bmatrix} j \\ j_2 \end{bmatrix} \\ y &= \begin{bmatrix} j_1 \\ j_2 \end{bmatrix} \\ \lambda &= \begin{bmatrix} z_1 - u_1 \\ z_2 - u_2 \end{bmatrix} = \begin{bmatrix} \lambda_1 \\ \lambda_2 \end{bmatrix} \end{aligned}$$

- ▶ Difficulty:  $D = 0$
- ▶ LCS is ill-defined: LCP does not have a unique solution
- ▶ Derivation of the LCP gives:

$$\begin{cases} \dot{y} = CAx + Cb + CB\lambda \\ y = 0 \Rightarrow 0 \leq \dot{y} \perp \lambda \geq 0 \\ y > 0 \Rightarrow \lambda = 0 \end{cases}$$

- ▶ Relative degree = 1
- ▶ CB is non-singular: derived NS law has a unique solution

## Conclusion

- ▶ Need to design modeling languages with nonsmooth dynamics during continuous-time evolution
- ▶ Paradigm shift:
  - “Hybrid = Continuous + Discrete” to
  - “Hybrid = Nonsmooth + Discrete”
- ▶ Time-stepping methods enable simulation:
  - ▶ past Zeno points
  - ▶ chattering-free sliding modes
  - ▶ Main drawback: slow convergence  $O(h)$ , unlike high order numerical schemes
  - ▶ Mixed adaptive event-driven / time-stepping methods
- ▶ Solutions of Filippov differential inclusions and (N)LCS are:
  - ▶ absolutely continuous
  - ▶ almost everywhere differentiable
- ▶ zero-Xing detection is as usual
- ▶ Relative degree of NSDS  $\approx$  DAE index
- ▶ Not developed in this talk: Measure differential inclusions (required for Newton impact law)

# References



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