## **Chaotic Dynamics in Hybrid Systems**

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## Outline

- Some chaotic hybrid systems
- A formalism for hybrid systems
  - Hybrid time space
  - Skorohod topology
  - Upper semicontinuity
- Properties of upper-semicontinuous systems
- Example-filling tanks
- Conclusions and further research



• Switched arrival systems



• Switch whenever a tank empties.

[Ref: Chase, Serrano & Ramadge. IEEE Trans. Automatic Control, 38(1) 70-83, 1993]

Impact oscillators

$$\ddot{x} + \zeta \dot{x} + x = \cos(\omega t), \quad x < d;$$
$$\dot{x} \mapsto -\lambda \dot{x}, \quad x = d.$$

[Ref: Budd, in Nonlinear mathematics and its applications, CUP, 1996]

Boost power converter



- Inductor current I and capacitor charge Q.
- Switch open:

$$I \ge 0: \quad L\frac{dI}{dt} = E - \frac{Q}{C}, \quad \frac{dQ}{dt} = I - \frac{Q}{RC},$$
  
or  $Q \ge EC: \quad I = 0, \quad \frac{dQ}{dt} = -\frac{Q}{RC}.$ 

• Switch closed:  $Q \ge 0$ 

$$L\frac{dI}{dt} = E; \quad \frac{dQ}{dt} = -\frac{Q}{RC}$$

[Ref: Banerjee et al. IEEE Trans. Circuits Systems, I47(3), 389–394, 2000] Chaotic Dynamics in Hybrid Systems – p.4/24



- Existence of limiting trajectories.
- Zeno executions.
- Statistical properties invariant measures and ergodic theory.
- Orbit structure symbolic dynamics.
- Parameter dependence bifurcation theory.



## A framework for hybrid systems

- A hybrid system  $\mathcal{H}$  without inputs with state space X is described by
  - A vector field  $F: X \to TX$
  - A reset condition  $f: X \to \mathcal{P}(X)$
- We allow vector fields which are not everywhere defined.
- At any point *x*, there may be many possible resets, or none at all.



- An event time sequence  $(t_n)_{n=1}^N$  with  $N \in \mathbb{Z}^+ \cup \{\infty\}$  is a monotone sequence  $t_n \leq t_{n+1}$ .
- The *hybrid time set* for the event time sequence  $(t_n)$  is the set  $\tau = \{(n,t) : t \in [t_n,t_{n+1}]\} \subset \mathbb{Z}^+ \times \mathbb{R}^+$ .



- A hybrid time set gives a natural domain for a trajectory of a hybrid system..
- Note that we allow more than one reset to occur at a given time. [Ref: Lygeros et al.]

• A *trajectory* or *execution* of  $\mathcal{H}$  is a function  $x: \tau \to X$  such that

$$\dot{x}(n,t) = F(x(n,t)) \text{ for } t \in (t_n, t_{n+1});$$

$$x(n,t_n) \in f(x(n-1,t_n)).$$

- Note that
  - A reset *must* happen if there is no further continuous trajectory; otherwise it *may* occur.
  - There may be more than one possible trajectory for a given initial condition.



## **Continuous and discrete dynamics**

• The *continuous dynamics* of a trajectory x is given by the function  $x : \mathbb{R}^+ \to X$  with

$$x(t) = x(n, t)$$
 for  $t \in [t_n, t_{n+1})$ .

• The discrete dynamics of x is given by the sequence  $(x_n)_{n=0}^N$  with

$$x_n = x(n, t_n).$$

• The *return map*  $r: X \to \mathcal{P}(X)$  is given by  $x_1 \in r(x_0)$  if there is a trajectory x with

$$x(0,t_0) = x_0$$
 and  $x(1,t_1) = x_1$ 



- The natural topology for the space of trajectories is the *compact-open hybrid Skorohod topology*.
- A trajectory  $\tilde{x}$  is  $(N, T, \epsilon)$ -close to x if there is a map  $h: \tau \to \tilde{\tau}$  such that whenever  $n \leq N$  and  $t \leq T$ , then

• 
$$h(n,t) = (n,\tilde{t})$$
 with  $|t - \tilde{t}| < \epsilon$ .

- $d(x(n,t), \tilde{x}(h(n,t))) < \epsilon$ .
- The  $(N, T, \epsilon)$  neighbourhoods of trajectories form a basis of open sets for the topology.
- An equivalent metric description of the topology can also be formulated.



- A set-valued function *f* : *X* → *P*(*Y*) is *upper-semicontinuous* if *f*(*K*) is compact whenever *K* is compact.
- If f is upper-semicontinuous, and  $x_i \to x_\infty$  and  $y_i \to y_\infty$  are sequences with  $y_i \in f(x_i)$ , then also  $y_\infty \in f(x_\infty)$ .
- A hybrid system  $\mathcal{H}$  is *upper-semicontinuous* if its reset map *f* is upper semicontinuous.
- An example of an upper-semicontinuous hybrid system is a system with events e, and continuous reset maps  $f_e: X_e \to X$  defined on closed subsets  $X_e$  of X.



- The fundamental property of upper-semicontinuous hybrid systems is that limits of trajectories are also trajectories:
- **Theorem** Let  $\mathcal{H}$  be an upper-semicontinuous hybrid system with compact state space, and  $\xi_n$  a sequence of trajectories of  $\mathcal{H}$  converging to  $\xi_{\infty}$  in the compact-open hybrid Skorohod topology. Then  $\xi_{\infty}$  is a trajectory of  $\mathcal{H}$ .
- It follows that if H has an upper-semicontinuous reset map, then its return map is also upper-semicontinuous.



- An execution x of a hybrid system is Zeno if infinitely many transitions occur in finite time T.
  (i.e. lim<sub>n→∞</sub> t<sub>n</sub> = T < ∞)</li>
- An execution x is instantaneously Zeno if t<sub>n</sub> = 0 for all n ∈ N. (i.e. infinitely many resets can occur without any continuous dynamics.)
- A hybrid system is *uniformly non-Zeno* if there is an integer N and a time T such that for any execution x, there are at most N discrete transitions in any time interval of length T.



- An instantaneously Zeno execution can be thought of as a chattering behaviour, and is usually due to a modelling error.
- If a hybrid system is uniformly non-Zeno (and non-blocking), then all trajectories are defined for all t ∈ R<sup>+</sup>.
- The following result shows that an upper-semicontinuous hybrid system is either very well-behaved or very nasty:



• **Theorem** An upper-semicontinuous hybrid system with compact state space is either uniformly non-Zeno or has an instantaneously Zeno execution.

- Try to give a probabilistic description of a hybrid system by finding an invariant probability measure for its return map.
- If f : X → X is a single-valued map, a measure μ on X is *invariant* under f if μ(f<sup>-1</sup>(A)) = μ(A) for all measurable sets A.
- Any continuous map on a compact metric space has an invariant probability measure. Does an analogous result hold for upper-semicontinuous maps?



- The orbit space  $\Sigma$  of a map  $f: X \to \mathcal{P}(X)$  is the set of sequences  $(x_i)$  with  $x_{i+1} \in f(x_i)$ .
- The shift map on  $\Sigma$  is the map  $\sigma$  such that

 $\sigma(x_0, x_1, x_2, \ldots) = (x_1, x_2, \ldots)$ 

- If *f* is upper-semicontinuous, then  $\Sigma$  is compact. Since  $\sigma$  is continuous, it has an invariant measure  $\mu_{\sigma}$ .
- The measure  $\mu$  on X given by  $\mu(A) = \mu_{\sigma}(\pi^{-1}(A))$ , where  $\pi : \Sigma \to X$  is projection onto the first factor, is a *shift-invariant measure* for f.



## Invariant measures for hybrid

systems

- The return map for an upper-semicontinuous hybrid system is also upper semicontinuous. Therefore:
- **Theorem** Let  $\mathcal{H}$  be an upper-semicontinuous hybrid system with compact state space. Then the return map r of  $\mathcal{H}$  has a shift-invariant measure.
- From an invariant measure for the return map, we can construct an invariant measure for the continuous dynamics.



- Let  $R_1, \ldots R_k$  be compact subsets of X (not necessarily disjoint or covering).
- A sequence (s<sub>i</sub>) is a *itinerary* for a sequence (x<sub>i</sub>) if x<sub>i</sub> ∈ R<sub>s<sub>i</sub></sub> for all i. Note that a sequence (x<sub>i</sub>) may have many itineraries, or none at all.
- If f: X → P(X), then the shift space of f on R<sub>1</sub>,...R<sub>k</sub> is the set of all possible itineraries of orbits of f.
- If *f* is upper-semicontinuous, the shift space of *f* is compact.



# Symbolic dynamics for hybrid

#### systems

- Symbolic dynamics can be used to obtain an approximate description of the return map r of an upper-semicontinuous hybrid system.
- Since *r* is upper-semicontinuous, the shift space of *r* is compact.
- The sets  $R_k$  can often be chosed in a natural way depending on the reset map.
- Computing the shift space exactly is usually impossible, but some methods exist for computing lower bounds.



- Bifurcation theory for hybrid systems is not highly developed.
- Grazing bifurcations caused by a tangency with the guards are well-studied in the context of impact oscillators and give *period-adding* behaviour.



 Local bifurcations occur when a fixed point crosses a guard.





# Example-filling tanks



- Tanks  $T_1$ ,  $T_2$  and  $T_3$  with constant outflows  $\rho_1$ ,  $\rho_2$  and  $\rho_3$ .
- Single filler with inflow  $\rho_{in} = \rho_{out} := \rho_1 + \rho_2 + \rho_3$ .
- Volume of fluid in tank i is given by  $x_i$ .
- CWI
- Total volume is preserved, so  $x_1 + x_2 + x_3 = x_{tot}$ .
- Switching law as soon as a tank T<sub>i</sub> empties, switch to filling T<sub>i</sub>.

- Zeno executions if two tanks empty at the same time.
- Invariant measure  $\mu$  for return map with

$$\mu(\{x_1=0\}) = \frac{1}{2} \frac{\rho_1(\rho_2 + \rho_3)}{\rho_1\rho_2 + \rho_2\rho_3 + \rho_3\rho_1}$$

- Symbolic dynamics of reset map any sequence of switches possible.
- Bifurcation sequence stabilising a periodic orbit on altering switching behaviour.



## Conclusions

- Upper-semicontinuity is a useful and natural property to impose on hybrid systems.
  - existence of limiting executions
  - natural treatment of Zeno executions
  - existence of shift invariant measures for the return map
  - simple construction of symbolic dynamics
- Hybrid systems can be expected to have a *much* richer bifurcation structure than continuous systems.



- Possible directions for further research
  - Use statistical methods to find optimal controls for chaotic systems.
  - Use symbolic dynamics with controls to stabilise some desired behaviour.
  - Use bifurcation theory to analyse and detect catastrophic system failures.
- Should be driven by practical problems.
- Very few examples in the literature chaotic dynamics is hard to analyse and often unwanted anyway!

