

不连续控制系统的未来发展与挑战

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报告提纲

1. 不连续控制系统的定义
2. 不连续控制系统的类别
3. 不连续控制系统的性质
4. 不连续控制系统中存在的问题
5. 不连续控制系统的未来发展及挑战

1. 不连续控制系统的定义

Consider the following Ordinary Differential Equation (ODE) that describes a typical control system

$$\dot{x} = f(x) + b(x)u$$

where commonly, $x \in R^n, u \in R^m, m < n$. In here, $f(x)$ and $b(x)$ are smooth, and the control $u(x)$ is smooth as well.

AND

The term $f(x) + b(x)u(x)$ satisfies the **Lipschitz condition** to ensure the *existence and uniqueness of the solutions*.

For discontinuous control, it is of the form (simplest form)

$$u = \begin{cases} u^+ & s(x) > 0 \\ u^- & s(x) < 0 \end{cases}$$

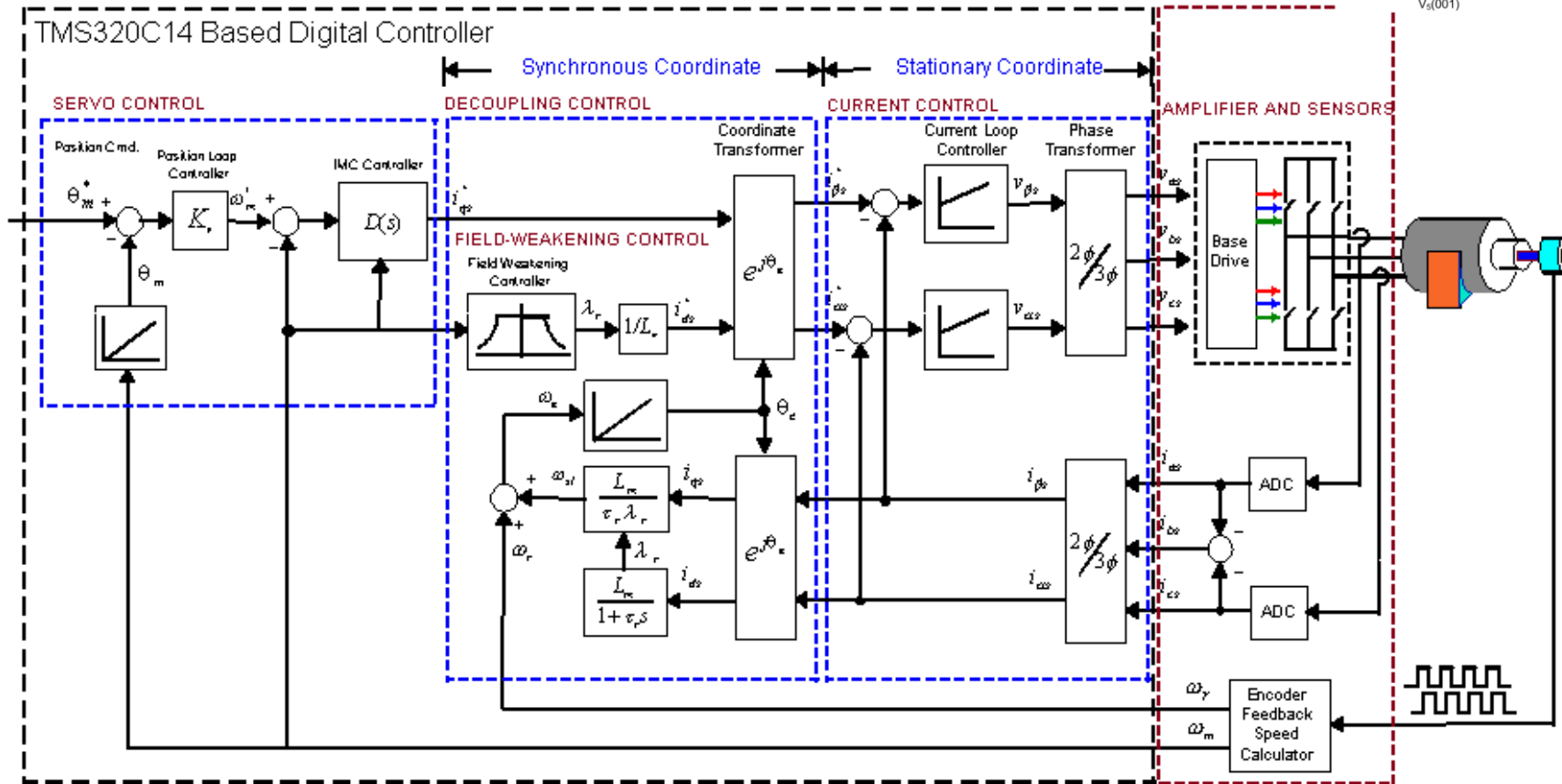
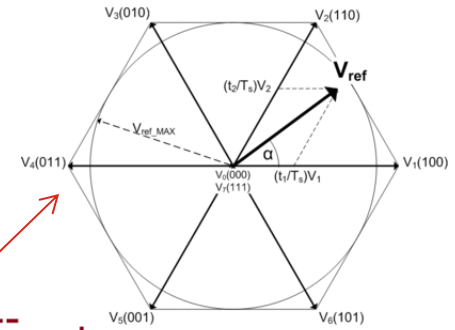
where $u^+ \neq u^-$.

2. 不连续控制系统的类别

- Discontinuous control is everywhere ...typical types are
 - *Sliding mode control*
 - *Switching control*
 - *Fuzzy control*
 - *Optimal control*
 - *State vector control*
 - *Impulsive control*
 - *Control in event-triggered systems*

Vector control

- *Vector control of AC Induction Motor*



Fuzzy control

A typical fuzzy control system

For $\dot{x} = f(x) + b(x)u(x)$

Rule 1: IF x_1 is A_{11} and x_2 is A_{12} x_n is A_{1n} THEN $u = u_1$

Rule 2: IF x_1 is A_{21} and x_2 is A_{22} x_n is A_{2n} THEN $u = u_2$

.

.

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Rule m: IF x_1 is A_{m1} and x_2 is A_{m2} x_n is A_{mn} THEN $u = u_m$

where A_{ij} is fuzzy value

Optimal control

Consider the 2nd order dynamical system

$$\dot{x}_1 = x_2, \quad \dot{x}_2 = u; \quad |u| \leq 1$$

The time optimal control is

$$u = \operatorname{sgn}[\Xi(x)]$$
$$\Xi(x) = \begin{cases} \xi(x) = x_1 + \frac{1}{2}x_2|x_2|; & \xi(x) \neq 0 \\ x_2; & \xi(x) = 0 \end{cases}$$

Impulsive control

A typical Impulsive control system

$$\dot{x} = f(x) + b(x, t) \quad t \in (t_{k-1}, t_k]$$

$$\Delta x = cu(t_k), \quad t = t_k, \quad k = 0, 1, 2, \dots$$

The impulsive control occurs at $t = t_k$.

Control in event-triggered systems

A typical event triggered system

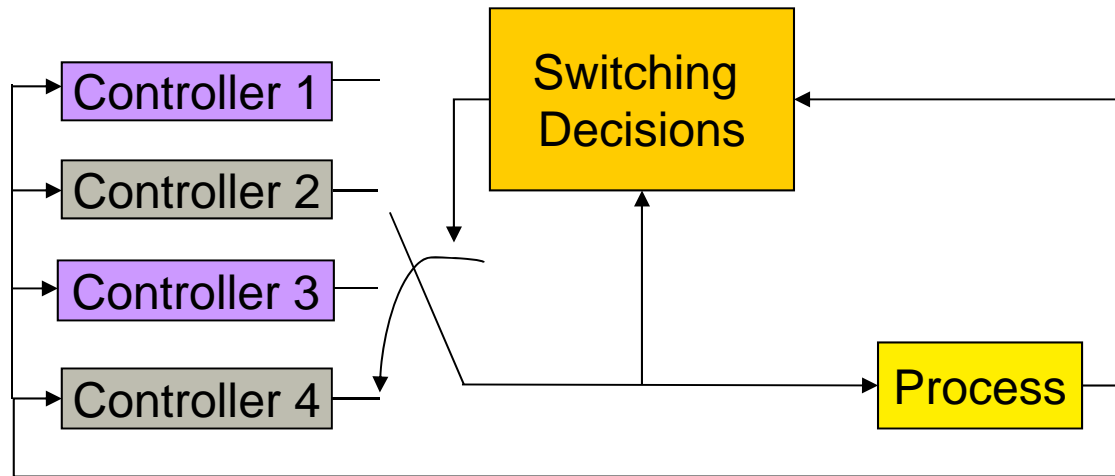
For $\dot{x} = Ax + bu$, $x \in R^n$, $u \in R^m$

$$u = kx(t_k), t \in [t_k, t_{k+1})$$

The event time $t = t_k$ is determined by an event-trigger $e(t) = x(t_k) - x(t)$.

If $\gamma^2 \|e\|^2 = \|x\|^2$, then $x(t_k^+) = x(t)$ such that $e(t_k^+) = 0$.

Switching control



For $\dot{x} = f(x) + b(x)u(x)$

$u = u_i(x)$ if condition i is satisfied

Sliding mode control

Consider single-input control system

$$\dot{x} = f(x) + b(x)u$$

1. Define a switching manifold which prescribe the desirable properties $s(x)$
2. Design a discontinuous control $u(x)$

$$u = \begin{cases} u^+ & s(x) > 0 \\ u^- & s(x) < 0 \end{cases}$$

such that

$$\lim_{s \rightarrow 0^+} \dot{s} < 0, \quad \text{and} \quad \lim_{s \rightarrow 0^-} \dot{s} > 0$$

Note: This is not the same as $s\dot{s} < 0$ which is often wrongly used!

Robustness in SMC systems

- Consider a single input single output (SISO) system

$$\dot{x} = f(x) + g(x)u + \xi(x, t)$$

- where x is the state, u is the control and ξ represents uncertainties and disturbance, f and g are smooth functions.
- When **an ideal sliding mode** is created, we have

$$\dot{s} = 0, s = 0$$

- There exists a virtual control, called equivalent control,

$$u_{eq} = -\left(\frac{\partial s}{\partial x} g(x)\right)^{-1} \left(\frac{\partial s}{\partial x} (f(x) + \xi(x, t))\right)$$

- When the **matching condition** is satisfied

$$\dot{x} = \left(I - g(x) \left(\frac{\partial s}{\partial x} g(x)\right)^{-1} \frac{\partial s}{\partial x} \right) f(x)$$

No uncertainty nor disturbance is involved!

3. 不连续控制系统的性质 – 可利用的优势

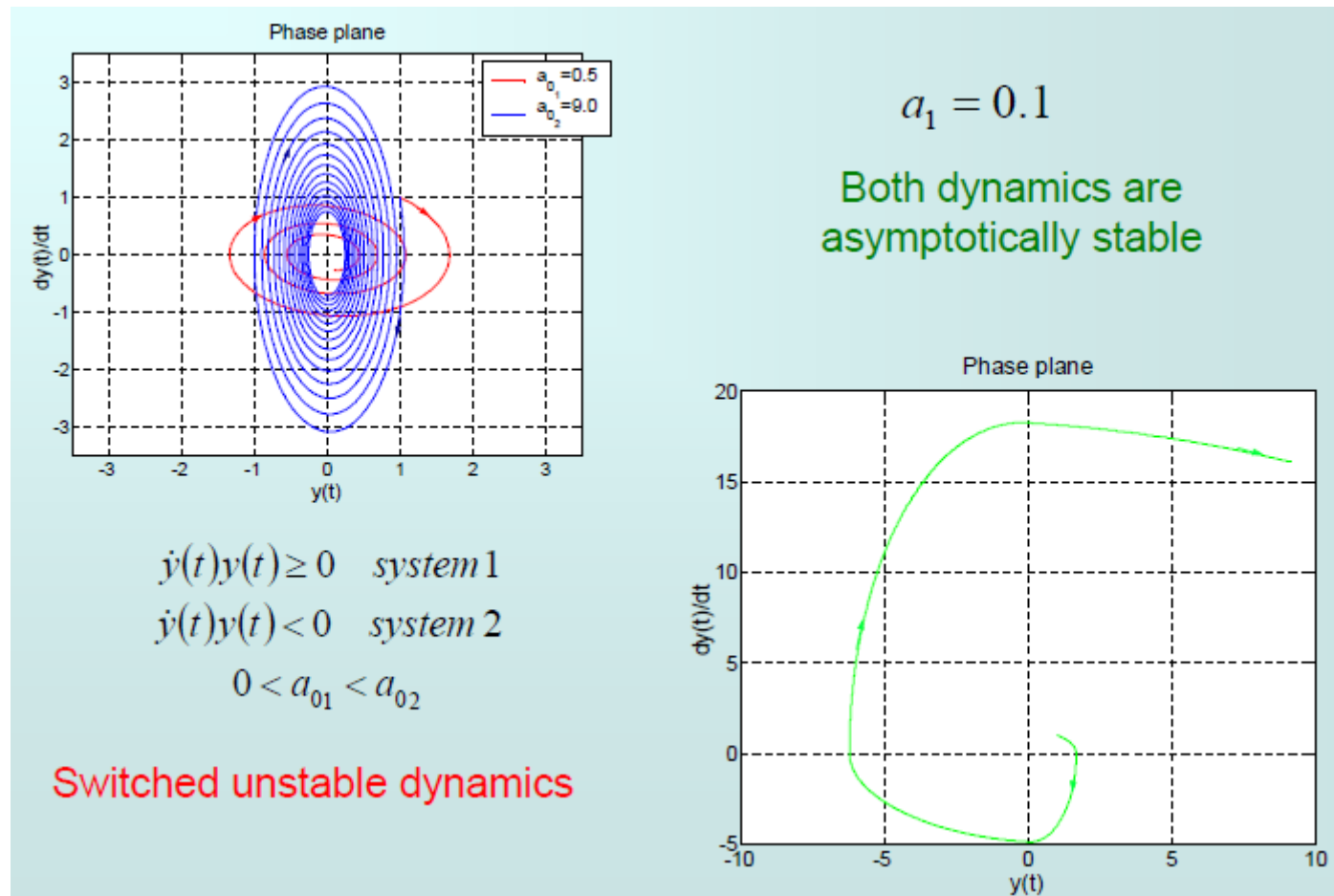
- The benefits of switching are enormous ... for example,

$$\ddot{y} + a_1\dot{y} + a_{01}y = 0 \quad \text{system 1}$$

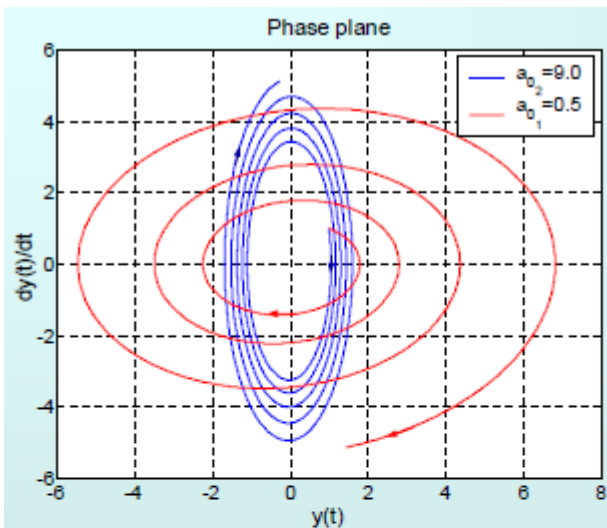
$$\ddot{y} + a_1\dot{y} + a_{01}y = 0 \quad \text{system 2}$$

- $a_1 > 0$ the systems are both asymptotically stable.
- $a_1 = 0$ the systems are both marginally stable.
- $a_1 < 0$ the systems are both unstable.

稳定系统可切换成不稳定系统



不稳定系统可切换成稳定系统



$$\dot{y}(t)y(t) < 0 \quad \text{system 1}$$

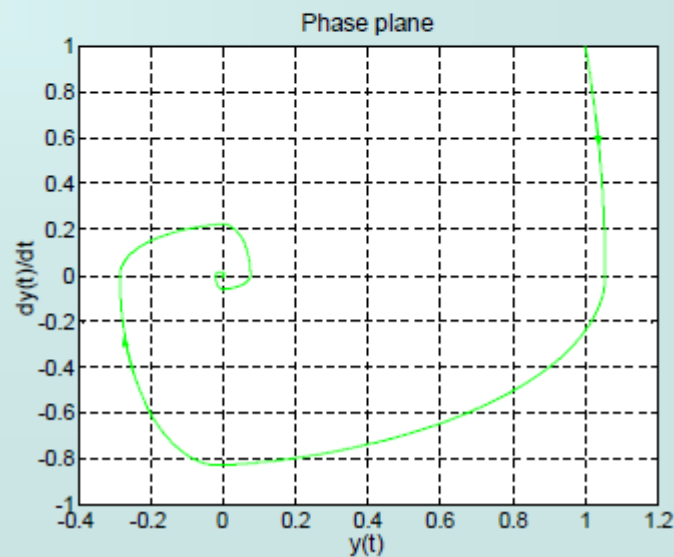
$$\dot{y}(t)y(t) \geq 0 \quad \text{system 2}$$

$$0 < a_{01} < a_{02}$$

Switched asymptotically stable dynamics

$$a_1 = -0.1$$

Both dynamics are unstable



不连续控制类别之间的关系

- The relationship between these various discontinuous controls is ambiguous ...

Consider a double integrator given by

$$\ddot{y} = u(t)$$

Consider the feedback control

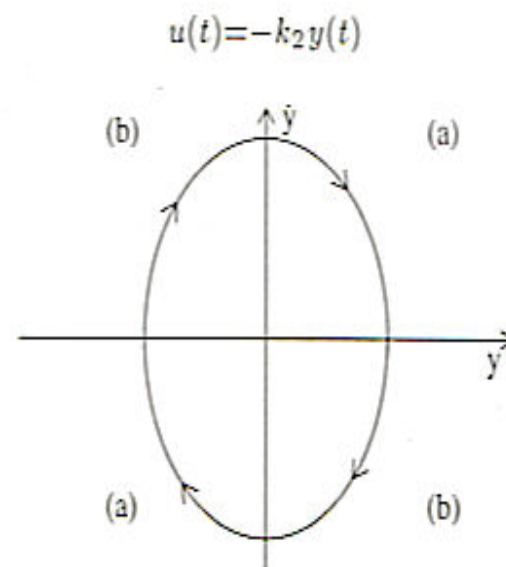
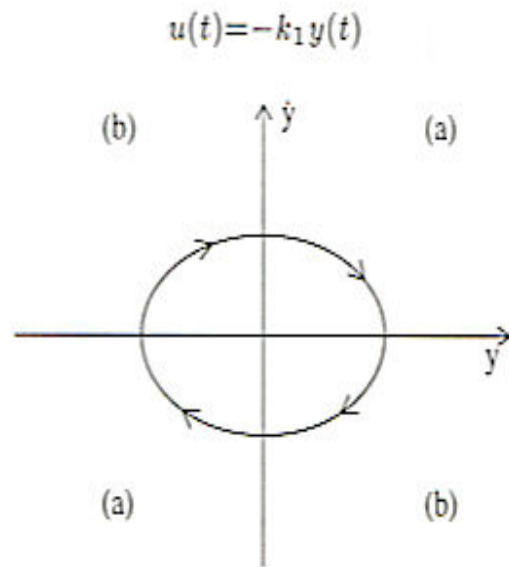
$$u = -ky(t)$$

where $k > 0$. If we take the Lyapunov function

$$V(y) = \frac{1}{2}(\dot{y}^2 + ky^2)$$

Then

$$\dot{V} = 0 \Rightarrow V = c, c > 0$$



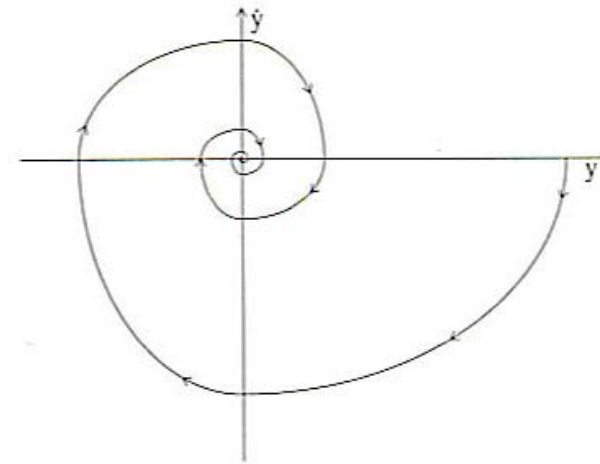
For $0 < k_1 < 1 < k_2$

However, if we choose

$$u = \begin{cases} -k_1 y & \text{if } y\dot{y} < 0 \\ -k_2 y & \text{otherwise} \end{cases}$$

and a new Lyapunov function

Then
$$V(y) = \frac{1}{2}(\dot{y}^2 + y^2)$$



$$\dot{V} = y\dot{y} + \dot{y}\ddot{y} = \dot{y}(y + u) = \begin{cases} y\dot{y}(1 - k_1) & \text{if } y\dot{y} < 0 \\ y\dot{y}(1 - k_2) & \text{if } y\dot{y} > 0 \end{cases}$$

It is a switching control!

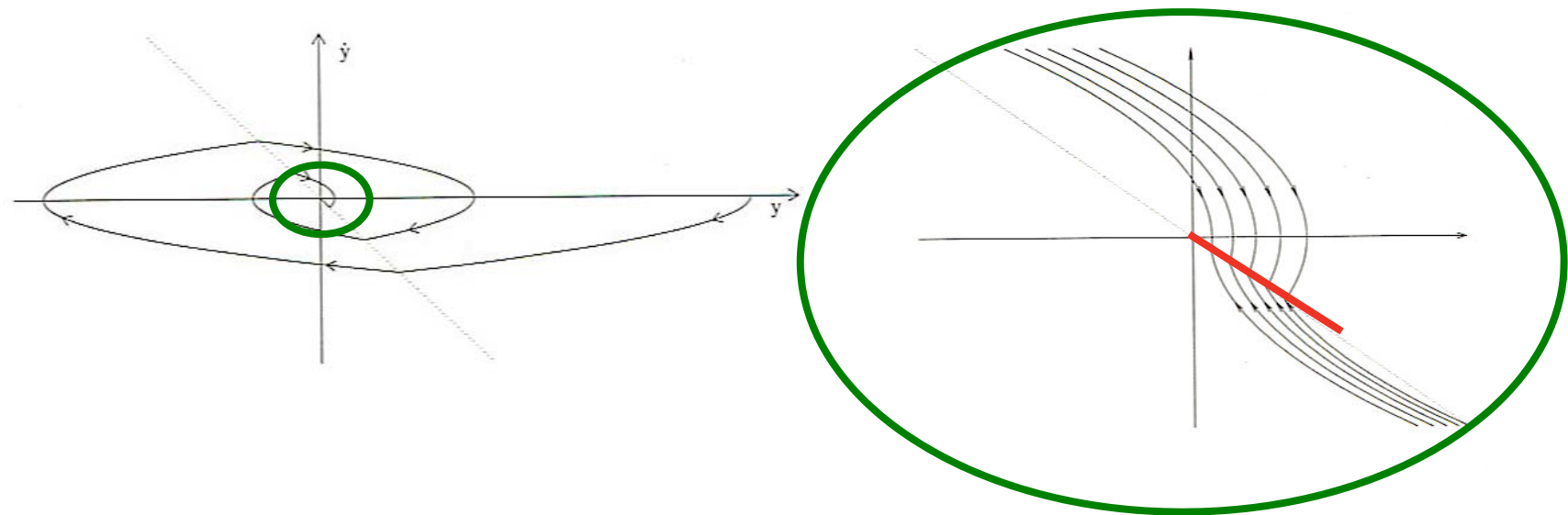
However, if we choose a switching line $s = \dot{y} + cy$

The control is chosen as

$$u = -\text{sgn}(s) = \begin{cases} -1 & \text{if } s > 0 \\ 1 & \text{if } s < 0 \end{cases}$$

Then, when $c|\dot{y}| < 1$

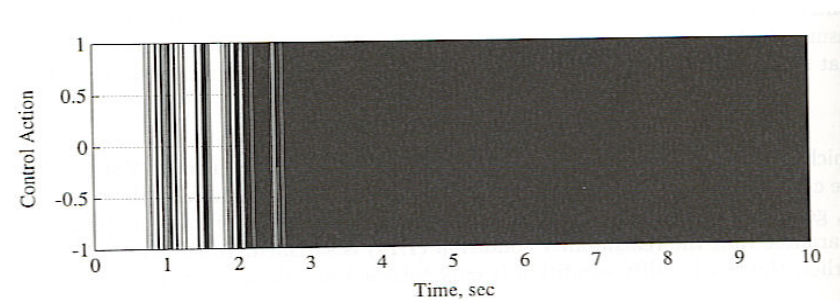
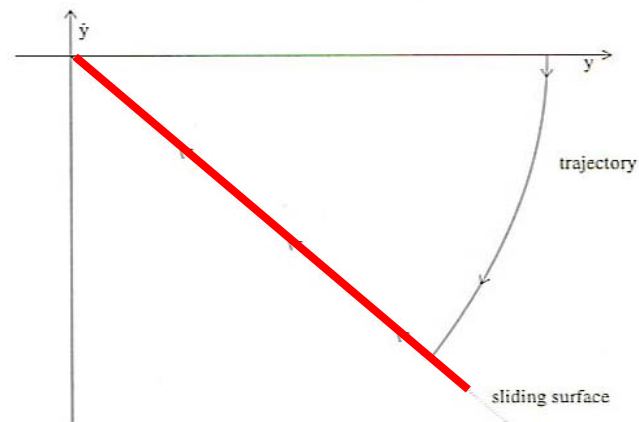
$$s\dot{s} = s(c\dot{y} + \ddot{y}) = s(c\dot{y} - \text{sgn}(s)) = |s|(c|\dot{y}| - 1) < 0$$



When $s=0$ is reached,

That is,

$$\dot{y} = -cy, \quad c > 0 \quad y(t) = \exp(-ct)y(0) \rightarrow 0, \quad \text{for } t \rightarrow \infty$$



It is a local sliding mode control inside a global switching control!

Relation between discontinuous control and finite time control ...

Consider the 2nd dynamical system

$$\dot{x}_1 = x_2, \quad \dot{x}_2 = u; \quad |u| \leq 1$$

Time optimal control

$$u = \text{sgn}[\Xi(x)]$$
$$\Xi(x) = \begin{cases} \xi(x) = x_1 + \frac{1}{2}x_2|x_2|; & \xi(x) \neq 0 \\ x_2; & \xi(x) = 0 \end{cases}$$

Take very large odd integer q and p, we have

$$x_1 + \frac{1}{2}x_2^{p/q} \approx x_1 + \frac{1}{2}x_2|x_2| = \xi(x).$$

Switching control can approximate finite time control!

Finite control versus linear control (asymptotical convergence)

- For the 1st order dynamics

$$\dot{x}_1 = -\alpha x_1 - \beta x_1^{q/p}$$

- The Jacobian is

$$J = \frac{\partial \dot{x}_1}{\partial x_1} = -\alpha - \frac{\beta q}{p x_1^{q/p}} \quad J \rightarrow -\infty \quad \text{when} \quad x_1 \rightarrow 0^+$$

- Exact reaching time

$$t^s = \frac{p}{\alpha(p-q)} (\ln(\alpha x_1(0)^{(p-q)/p} + \beta) - \ln \beta)$$

- With $\alpha=1, \beta=1$, at $t^s = 1.039699999999990$,
- For $p=3, q=1$, $x_1(t^s) = 0.00000009178540$ *finite control!*
- For $p=1, q=1$, $x_1(t^s) = 0.12500519281775$ *linear control!*

Finite time stability versus asymptotical time stability

- Continuous-Time ODE based
- Many new methods: e.g. Hinf,
- Fundamentally the Lipschitz condition must be satisfied
- Asymptotical stability
- The **problem** with asymptotical stability ...
 - It requires ‘enormous’ control efforts to improve precision
 - Lets take a very simple example:

$$\dot{x} = u, \quad u = \begin{cases} -\lambda x \\ -\lambda x^{1/3} \end{cases}, \quad \lambda > 0$$

- Asymptotical stability

x_0

y_0

$$\frac{dx}{dt} = -\lambda x, \quad \lambda > 0, \quad x(t) = e^{-\lambda t}$$

$$x(t) - y(t) = e^{-\lambda t}(x_0 - y_0) \rightarrow 0 \text{ when } t \rightarrow \infty$$

$t \rightarrow +\infty$

- Finite-time Stability

x_0

y_0

$$\frac{dx}{dt} = -\lambda x^{\frac{1}{3}}, \quad \lambda > 0, \quad x^{\frac{2}{3}}(t) - x_0^{\frac{2}{3}} = -\frac{2\lambda}{3}t.$$

$$\text{When } t = \frac{3}{2\lambda} x_0^{\frac{2}{3}}, \quad x(t) = 0!$$

$t \rightarrow +\infty$

Precision and robustness properties - 1

- If there is a disturbance, $|\xi| < \varepsilon > 0$, such that

- $\dot{x} = u + \xi, u = \begin{cases} -\lambda x \\ -\lambda x^{1/3}, \lambda > 0 \end{cases}$

- Then

For $u = -\lambda x, |x(\infty)| < \frac{\varepsilon}{\lambda}$.

For $u = -\lambda x^{1/3}, |x(\infty)| < \left(\frac{\varepsilon}{\lambda}\right)^3$

So, for $\lambda > \varepsilon, \frac{\varepsilon}{\lambda} \ll \left(\frac{\varepsilon}{\lambda}\right)^3$. **Less steady state error if using a non-smooth control!**

Precision and robustness properties - 2

- If implemented digitally with a sample period h , and assuming we use Euler approximation, then

- $x(k + 1) = x(k) + hu(k), u(k) = \begin{cases} -\lambda x(k) \\ -\lambda x^{\frac{1}{3}}(k) \end{cases}, \lambda > 0$

- Then

For $u = -\lambda x, |x(\infty)| < h.$

For $u = -\lambda x^{1/3}, |x(\infty)| < \max\left(\left(\frac{\lambda h}{2}\right)^{3/2}, h\right)$ so to maintain the required fast convergence speed while retaining the required accuracy, $\lambda < 2h^{-1/2}$

Some typical finite-time control systems

- (Bhat & Bernstein, 2001)

$$\dot{x}_1 = x_2, \quad \dot{x}_2 = u, \quad u = -x_2^{\frac{1}{3}} - \left(x_1 + \frac{3}{5}x_2^{5/3}\right)^{1/3}$$

- (Levant, 2001)

$$\dot{x}_1 = x_2, \quad \dot{x}_2 = u, \quad u = -\alpha \operatorname{sgn}(x_2 + |x_1|^{\frac{1}{2}} \operatorname{sgn}(x_1))$$

- (Yu & Man, 1996; Feng, Yu & Man, 2002)

$$\dot{x}_1 = x_2, \quad \dot{x}_2 = u, \quad u = -\alpha \operatorname{sgn}(s) - c\gamma \dot{x}_2^{2-\frac{1}{\gamma}},$$

$$s = x_1 + \frac{1}{c}x_2^{\frac{1}{\gamma}}, \quad 0 < \gamma < 1$$

- (Hong, Xu & Huang, 2002)

$$\dot{x}_1 = x_2, \quad \dot{x}_2 = -c_1 \operatorname{sgn} x_1 |x_1|^{\alpha_1} - c_2 \operatorname{sgn} x_2 |x_2|^{\alpha_2}$$

The terminal sliding mode concept

- The dynamical performance of a SMC system is determined by the prescribed switching manifolds. The most commonly used switching manifolds are **linear hyperplanes** which guarantee only asymptotic stability.
- Nonlinear switching manifolds can be created purposefully to improve performance. **Terminal sliding mode** (TSM) is a nonlinear dynamics that provides finite time mechanism (Man & Yu 1994, Yu and Man, 1996, Feng et al, 2001).



Singularity problem ...

Consider $s = \beta x_1^{q/p}(t) + \dot{x}_1(t)$, $\beta > 0$ Take $V=0.5s^2$. Then

$$\dot{V} = s\dot{s} = s\left(\ddot{x}_1 + \frac{q}{p}\beta x_1^{q/p-1}\dot{x}_1\right)$$

Since $q/p < 1$, singularity occurs *before sliding mode realised!*

$$\dot{x}_1(t) = -\beta x_1^{q/p}(t)$$

$$\dot{V} = s\dot{s} = s\left(\ddot{x}_1 + \frac{q}{p}\beta x_1^{q/p-1}\dot{x}_1\right) = s\left(\ddot{x}_1 - \frac{q}{p}\beta^2 x_1^{2q/p-1}\right)$$

During the sliding mode,

No singularity during the sliding mode if

$$\boxed{\frac{1}{2} < q/p < 1}$$

Nonsingular TSM

In order to overcome the singularity problem during the reaching phase, a nonsingular TSM is proposed

$$s(t) = x_1(t) + \frac{1}{\beta} \dot{x}_1^{p/q}(t)$$

Take $V=0.5s^2$. Then

$$\dot{V} = s\dot{s} = s\left(\dot{x}_1 + \frac{p}{q} \dot{x}_1^{p/q-1} \ddot{x}_1\right)$$

Since $p/q > 1$, there is **NO singularity**.

3. 不连续控制系统的性质 – 从空间(状态) 的角度看

- Typical discontinuities are
 - *Switching between different dynamics*
 - *Sliding mode control*
 - *Fuzzy control*
 - *Time optimal control*
 - *Bang-bang control*
 - *Jumping in systems states*
 - *Impulsive control*
 - *Control in event-triggered systems*

3. 不连续控制系统的性质 – 从时间（切换频率）的角度看

- **Zeno Phenomena**

- The Zeno phenomenon appears when the execution of the discontinuous control system is such that

$$\lim_{i \rightarrow \infty} \tau_i = \sum_{i=0}^{\infty} (\tau_{i+1} - \tau_i) = \tau_{\infty} < \infty$$

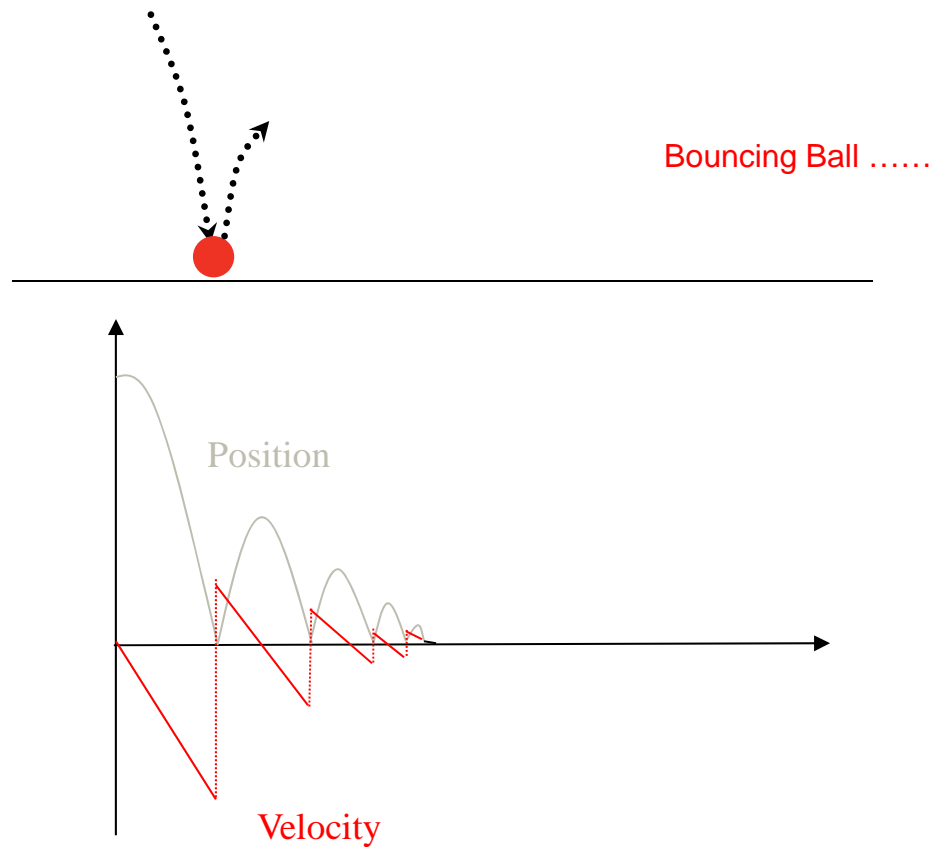
- where τ_{∞} (the Zeno time) is a right accumulation point for the time constants sequence

$$(\tau_{i+1} - \tau_i) \xrightarrow{i \rightarrow \infty} 0$$

- The switching frequency tends to be infinite!
- Definitions
 - Chattering Zeno: $\exists J > 0, \forall j > J, (\tau_{i+1} - \tau_i) = 0$
 - Genuinely Zeno: $\exists J > 0, \forall j > J, (\tau_{i+1} - \tau_i) > 0$

Bouncing ball ...

Zeno behavior occurs when there are an infinite number of discrete transitions in a finite amount of time.



(Liberzon, 2003)

Impact of switching frequency ...

The frequency influences significantly the behaviour of dynamics – even methodology may differ significantly due to frequency range

- **Low frequency** - many existing methodologies can be used by ‘piecing-together’ various ‘smooth’ subsystems – in time or in state.
- **Medium frequency** – same as Low frequency though presents challenges of using Lyapunov theory, e.g. piece-wise Lyapunov function. Various causes: deliberate medium frequency such as switched control systems; time-delay due to digitization, etc.
- **High frequency** – tends to violate usual ‘smooth’ dynamics based approaches, may need to use drastically different method such as Fillipov theory!

Low/Medium frequency – impact on discontinuous control systems

Consider a second order system

$$\begin{aligned} \dot{x}_1 &= x_2 \\ \dot{x}_2 &= -bx_2 + u \end{aligned} \quad u = \begin{cases} a^+ x_1 & x_1 s > 0 \\ a^- x_1 & x_1 s < 0 \end{cases}$$

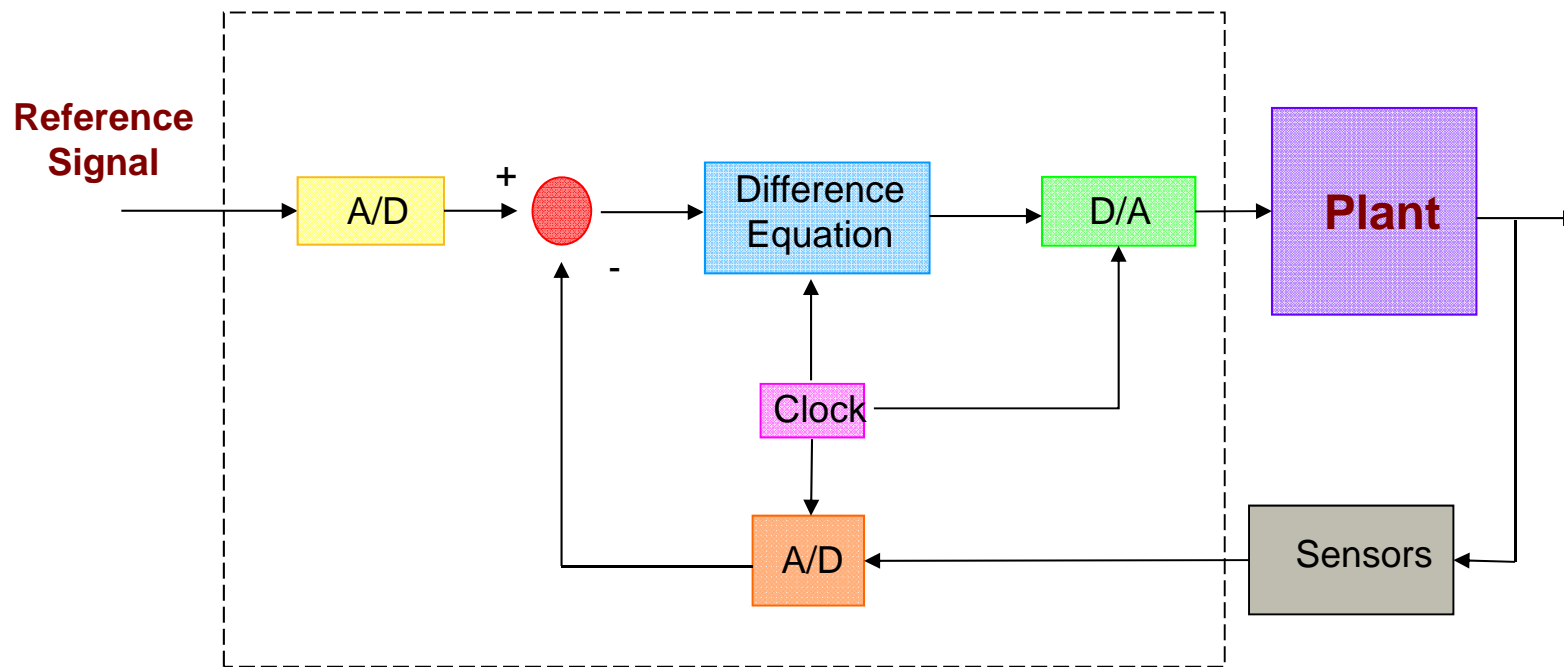
where

$$b > 0, c > 0, s = cx_1 + x_2$$

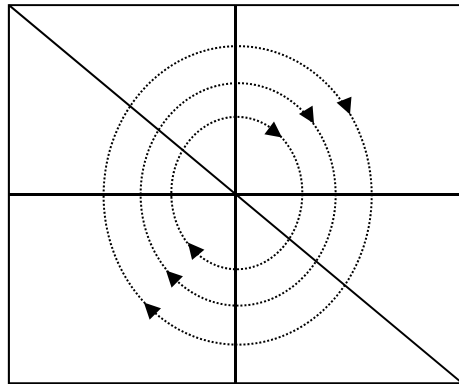
Equivalently,

$$\ddot{x} + b\dot{x} + a^\mp x = 0$$

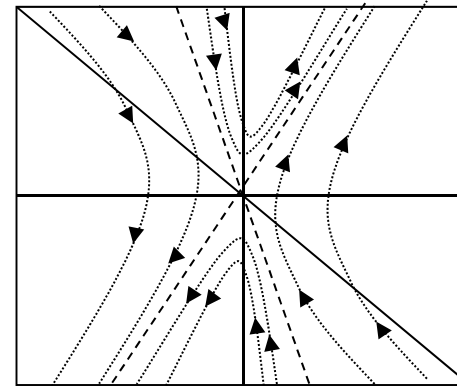
Discretization for control



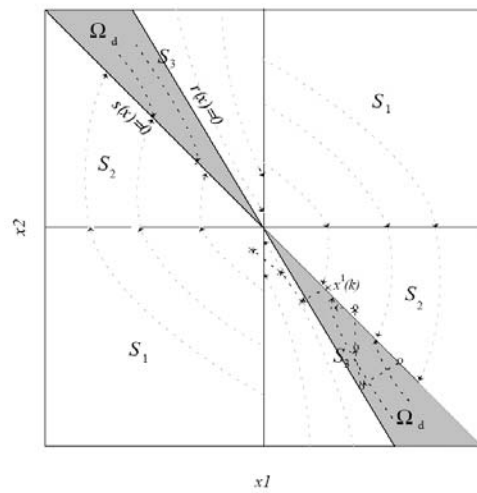
- **Discretization (emulation) design**
 - Controller designed based in continuous-time systems then digitized for implementation
- **Discrete-time design**
 - Controller design in discrete-time based on discrete-time system models



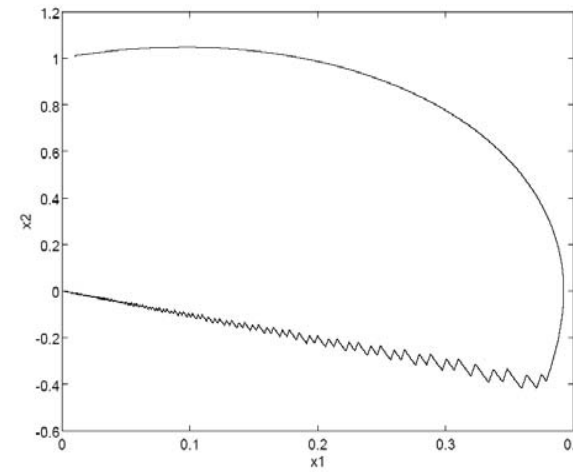
Phase plane portrait for '+' ($s>0, a^+>0$)



Phase plane portrait for '-' ($s<0, a^-<0$)

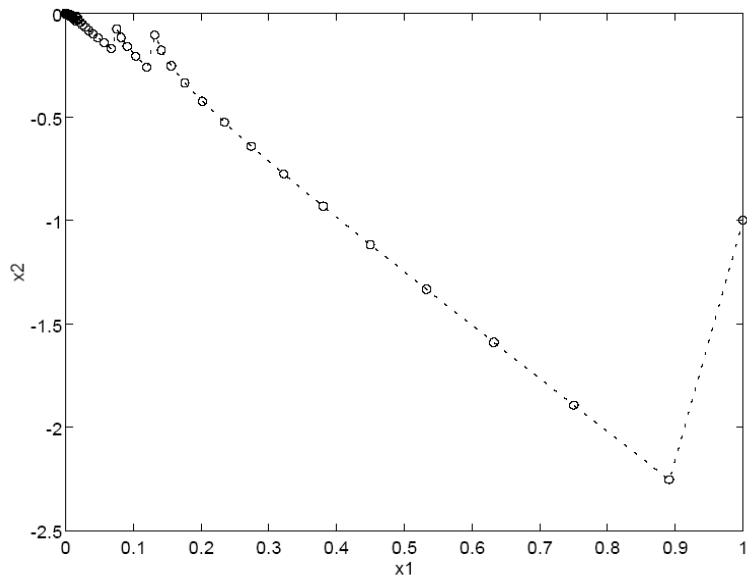


Phase plane portrait

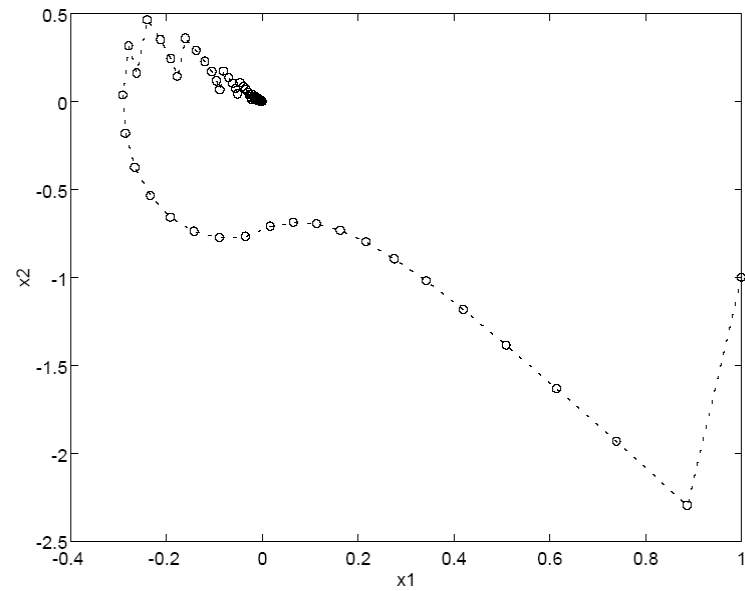


Near continuous-time behavior ...

Some interesting discretization behaviors

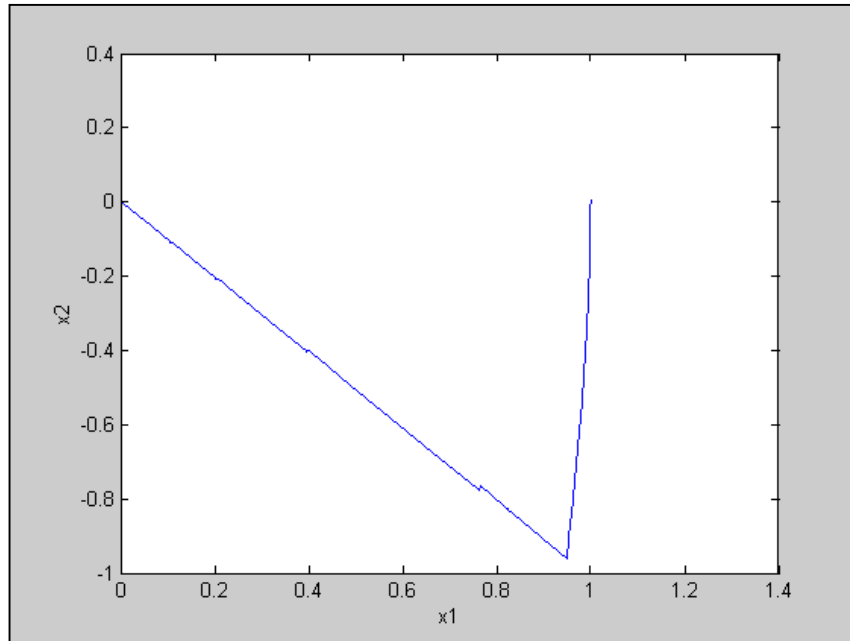


Discrete-time behavior...

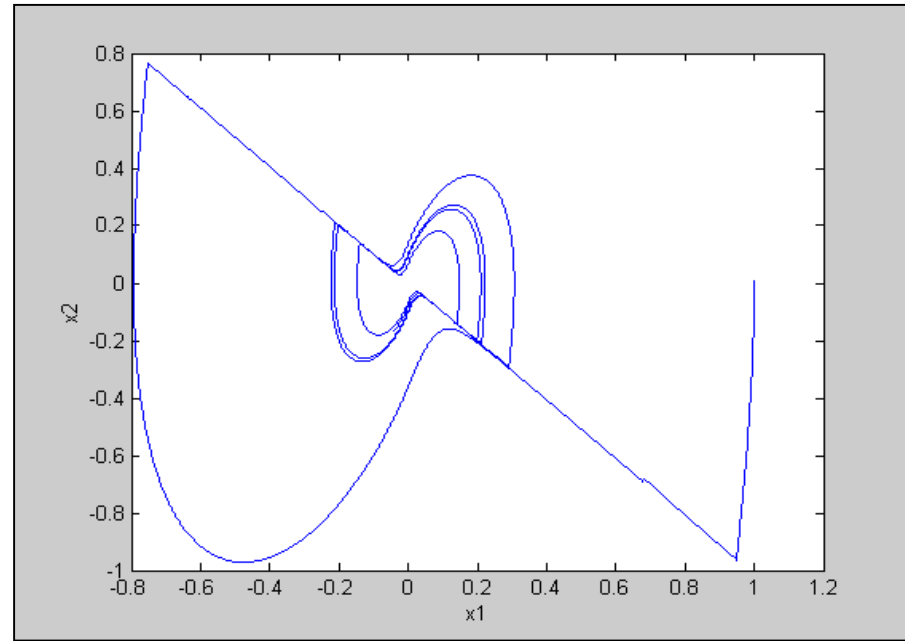


Discrete-time bifurcating behavior...

Is it true that a **'small enough'** sampling period will not cause chaotic motions in control systems?



$h=0.00158$



$h=0.00165$

With $b=-4.1$, $\alpha=4.1$, $c=1$, according to the upper bound formulae (Potts & Yu, 1991), the maximum H is **0.0016!**

Another example

$$\dot{x}_1 = x_2 \quad u = -\text{sgn}(s)$$

$$\dot{x}_2 = u$$

where $c > 0$, $s = cx_1 + x_2$ Equivalently, $\ddot{x} \pm 1 = 0$

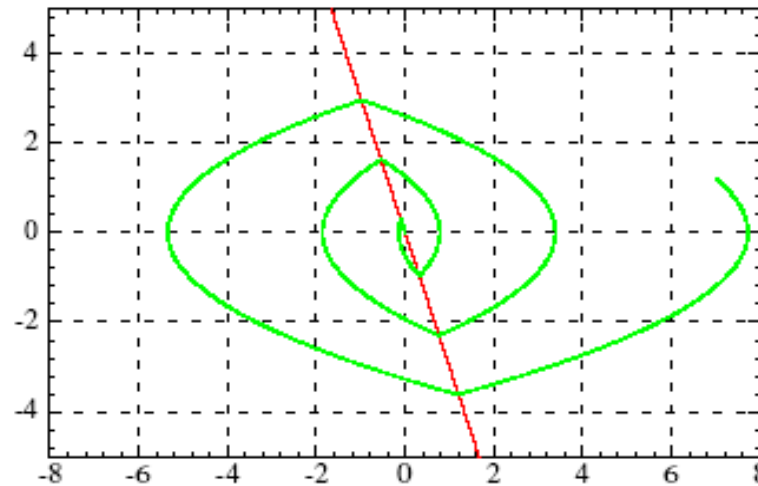


Fig. 1. Continuous time system, $c_1 = 3$, initial point $(x_1, x_2) = (7, 1.2)$.

Some interesting behaviors

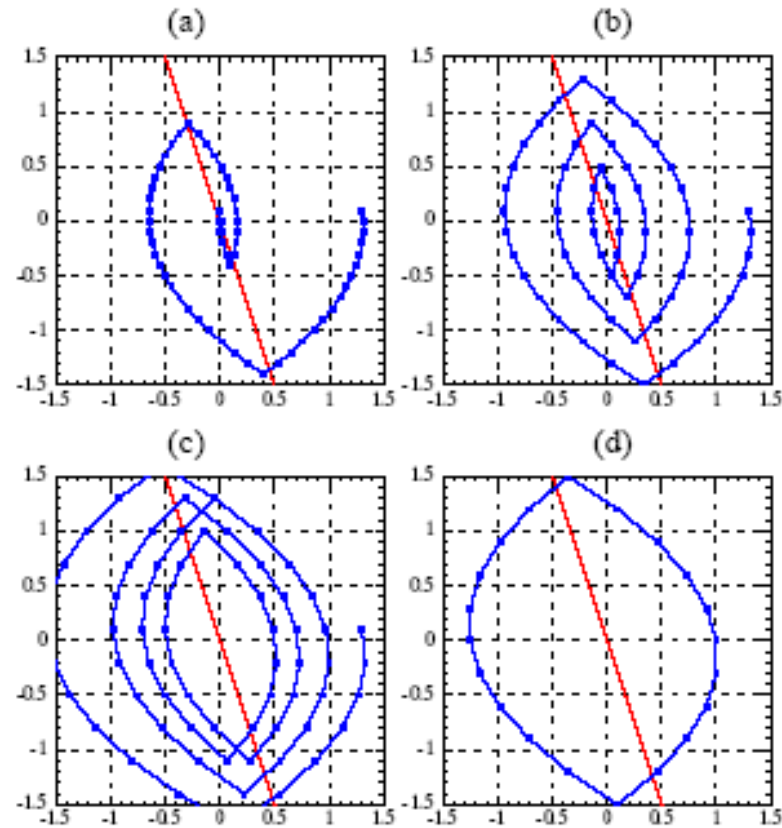


Fig. 4. Effects of discretization with different time steps, $c_1 = 3$, (a) $h = 0.1$, trajectory converges to a period-4 orbit, (b) $h = 0.2$, trajectory converges to a period-10 orbit, (c) $h = 0.3$, trajectory converges to a complex period-48 orbit, (d) $h = 0.3$, period-24 orbit of type (19), $(x_1, x_2) = (0.1, -1.5)$

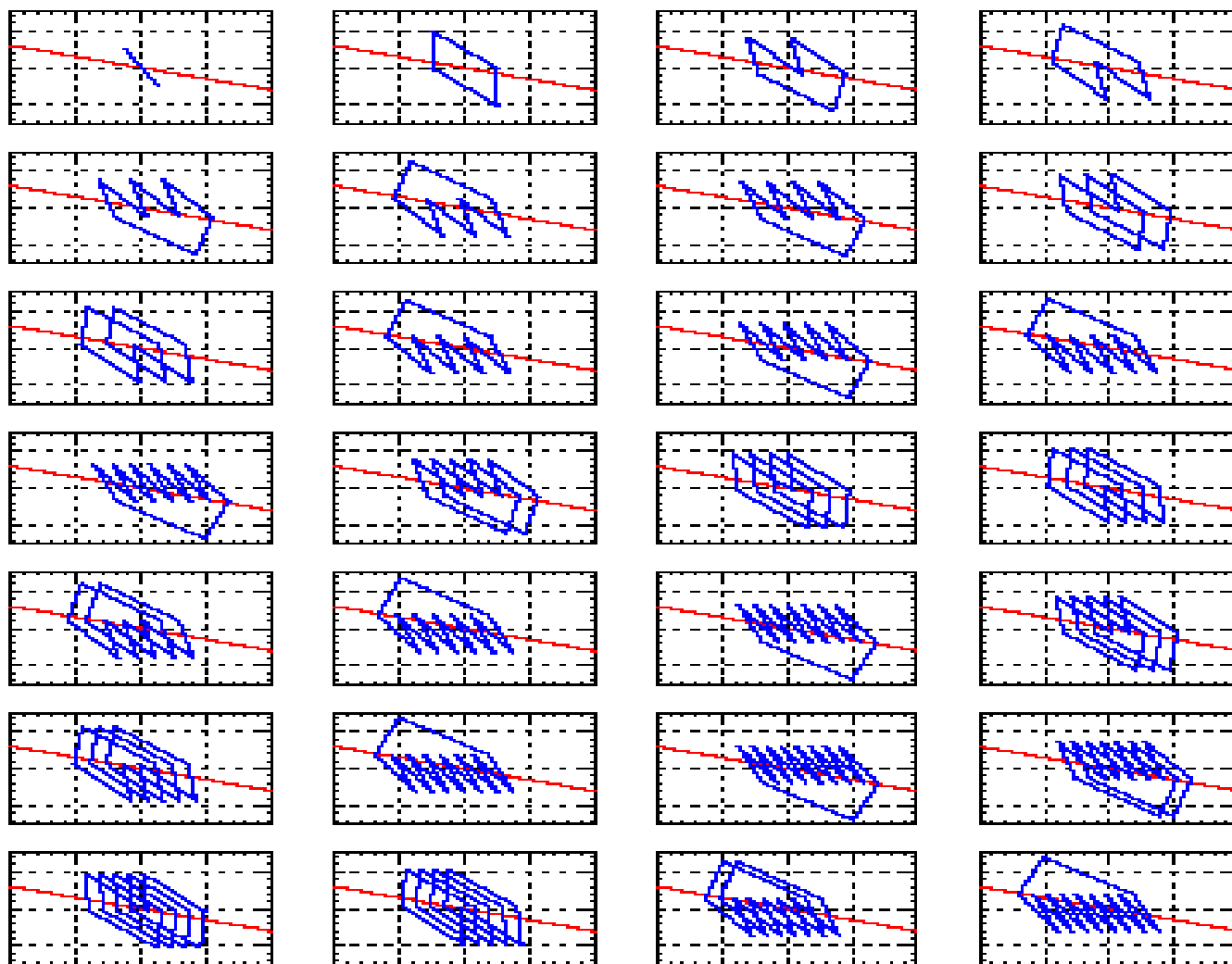
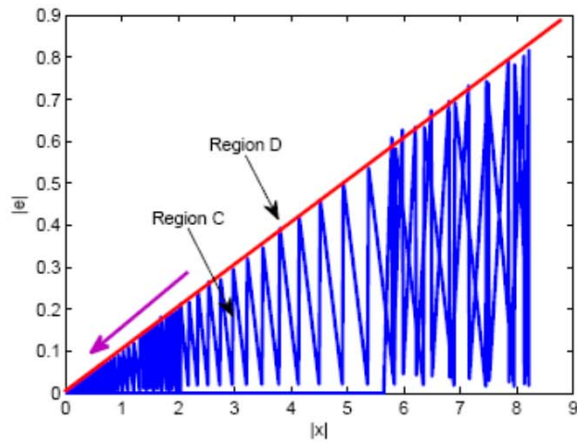


Fig. 2. Short cycles for $h = 0.1$, $c_1 = 3$

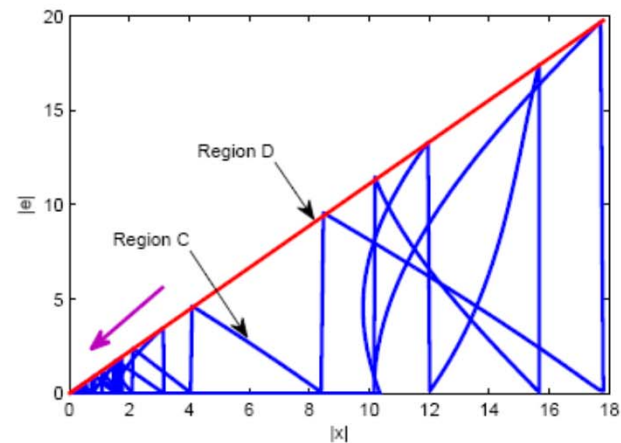
n	s	x_2	x_1
2	-+	-1/20	[-7/600, 1/60)
4	--++	-1/10	[0, 1/100)
6	---+--++	-7/60	[7/1800, 19/1800)
6	---++-+	-1/12	[-7/1800, 1/360)
8	---+-+--++	-1/8	[7/1200, 13/1200)
8	---++-+--+	-3/40	[-7/1200, -1/1200)
10	---+-+--+-++	-13/100	[7/1000, 11/1000)
10	---+-+--+-++	-11/100	[7/3000, 19/3000)
10	---++-+-+++	-9/100	[-7/3000, 1/600)
10	---++-+-+++	-7/100	[-7/1000, -3/1000)
12	---+-+--+-+--++	-2/15	[7/900, 1/90)
12	---+-+--+-+--++	-1/15	[-7/900, -1/225)
14	---+-+--+-+--+-++	-19/140	[1/120, 47/4200)
14	---+-+--+-+--+-++	-17/140	[1/200, 11/1400)
14	---+-+--+-+--+-++	-3/28	[1/600, 19/4200)
14	---+-+--+-+--+-++	-13/140	[-1/600, 1/840)
14	---+-+--+-+--+-++	-11/140	[-1/200, -3/1400)
14	---+-+--+-+--+-++	-9/140	[-1/120, -23/4200)
16	---+-+--+-+--+-+--++	-11/80	[7/800, 9/800)
16	---+-+--+-+--+-+--++	-9/80	[7/2400, 13/2400)
16	---+-+--+-+--+-+--++	-7/80	[-7/2400, -1/2400)
16	---+-+--+-+--+-+--++	-1/16	[-7/800, -1/160)
18	---+-+--+-+--+-+--+-++	-5/36	[49/5400, 61/5400)
18	---+-+--+-+--+-+--+-++	-23/180	[7/1080, 47/5400)
18	---+-+--+-+--+-+--+-++	-19/180	[7/5400, 19/5400)
18	---+-+--+-+--+-+--+-++	-17/180	[-7/5400, 1/1080)
18	---+-+--+-+--+-+--+-++	-13/180	[-7/1080, -23/5400)
18	---+-+--+-+--+-+--+-++	-11/180	[-49/5400, -37/5400)

TABLE I
SHORT CYCLES FOR $h = 0.1$, $c_1 = 3$

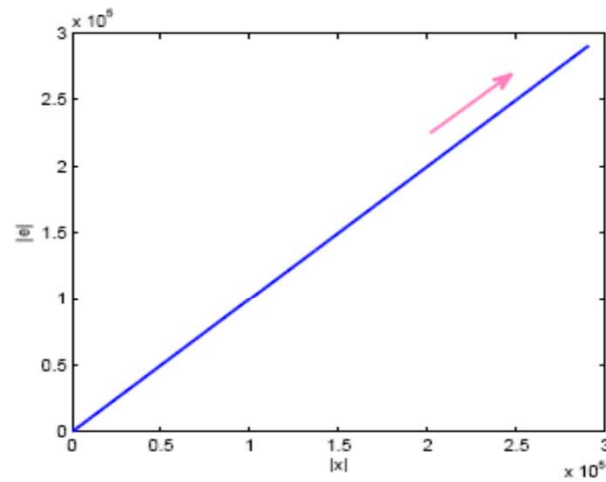
Event triggered systems also have complex behaviors ...



(a)



(b)



(c)

Phase-plane portraits of an event triggered system (a) $\gamma = 10.2$; (b) $\gamma = 0.9$; (c) $\gamma = 0.82$.

Low frequency - Stability of switching control systems

For $\dot{x} = f(x) + b(x)u(x)$, If there exist Lyapunov function $V_p, p \in P$, two class K_∞ functions α_1 and α_2 , and a positive number ρ_0 , such that

$$\begin{aligned}\alpha_1(|x|) &\leq V_p \leq \alpha_2(|x|) \\ \frac{\partial V_p}{\partial x}(f(x) + b(x)u(x)) &\leq -2\rho_0 V_p(x) \\ V_p(x) &\leq \mu V_q(x), \forall p, q \in P\end{aligned}$$

Then switched control system is globally asymptotically stable for every switching signal with average dwell time

$$\tau > \frac{\log \mu}{2\rho_0}$$

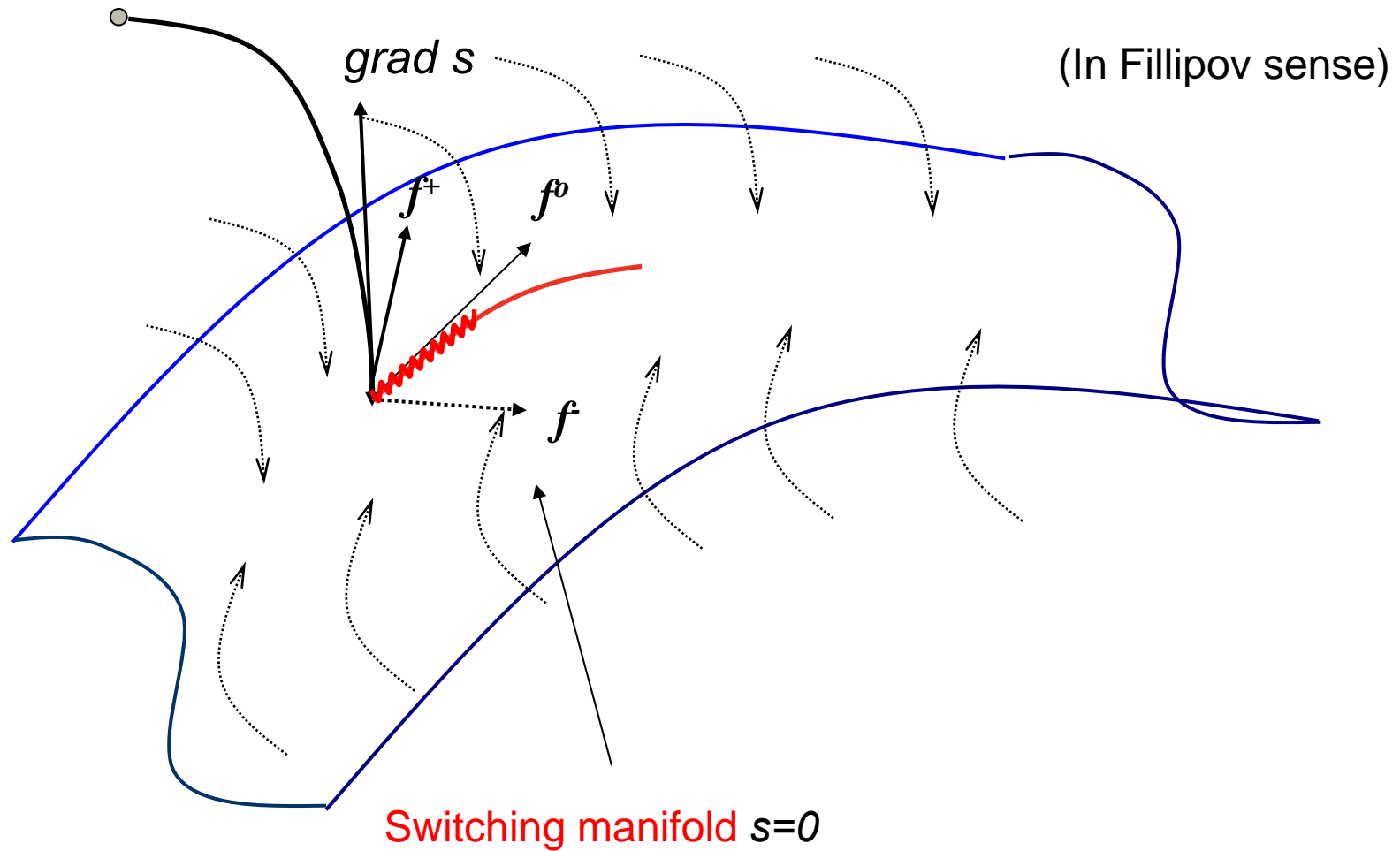
[Daniel Liberzon, Switching in Systems and Control, 2003]

High frequency – impact on discontinuous control systems

$$\dot{x} = f(x, t) \text{ is equivalent to } \dot{x} = f^0(x, t)$$

Trajectory

$$f^0 = \alpha f^+ + (1 - \alpha) f^-, \quad 0 < \alpha < 1$$



4. 不连续控制系统中存在的问题

- Gaps between methodologies dealing with discontinuous control systems
 - *How to analyze and design discontinuous control systems using a unified theoretical framework which can deal with switching frequencies ranging from low to very high?*
- Impact of time delay type element on dynamics
 - *Lack of effective tools to study rich dynamics of ‘periodical’ nature of steady states (e.g. limit cycle and finite state cycle)*
 - *The gap between continuous-time and digitized time-delayed discontinuous control systems ...*
- Multiple time scales: *Inherent response speeds at different levels*
- Chattering is still a problem especially for sliding mode control types

5. 不连续控制系统的未来发展及挑战

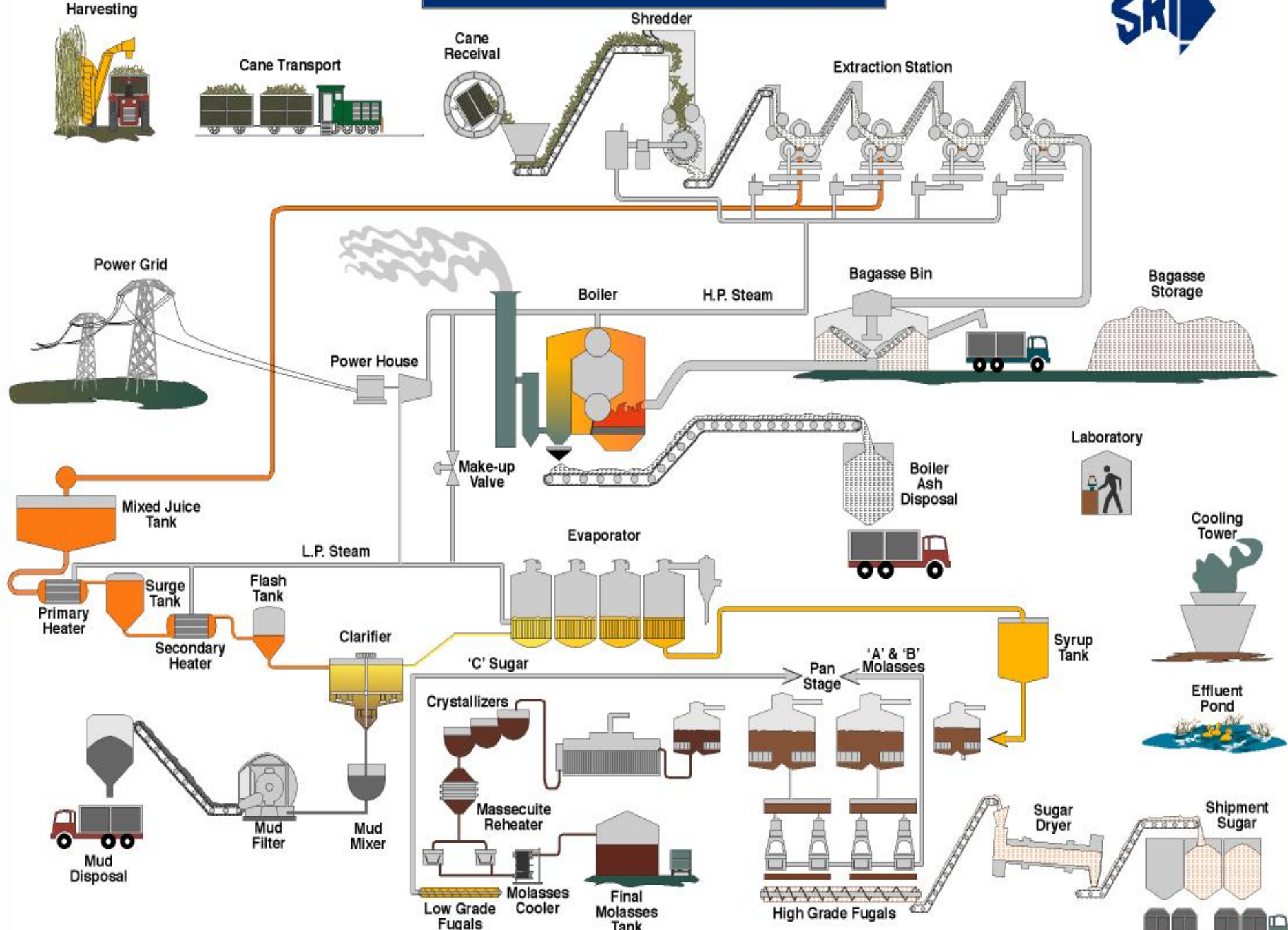
The scale and complexity of the industrial systems are growing exponentially

- *Big data environments*
- *Network environments*
- *Ever increasing complexity*
- *Time-scale issues: Inherent response speeds at different levels*
- *The impact of scale and complexity on control theories*
- *Human and machine interactions*
- *Switching in complex systems may result in much richer behaviors*

即便是传统的工业系统也面临严重的挑战。。。

- ❑ Dynamic (temporal/real-time) nature
- ❑ Different data/model platforms
- ❑ Influenced by resources and demands
- ❑ Interactions between machines and people
- ❑ Continuous-time and discrete-time
- ❑ Embedded, semi-automation
- ❑ Different kinds of decisions (non-structured, semi-structured, structured)

PRODUCTION OF RAW SUGAR



未来智能电网是一个典型的例子。。。

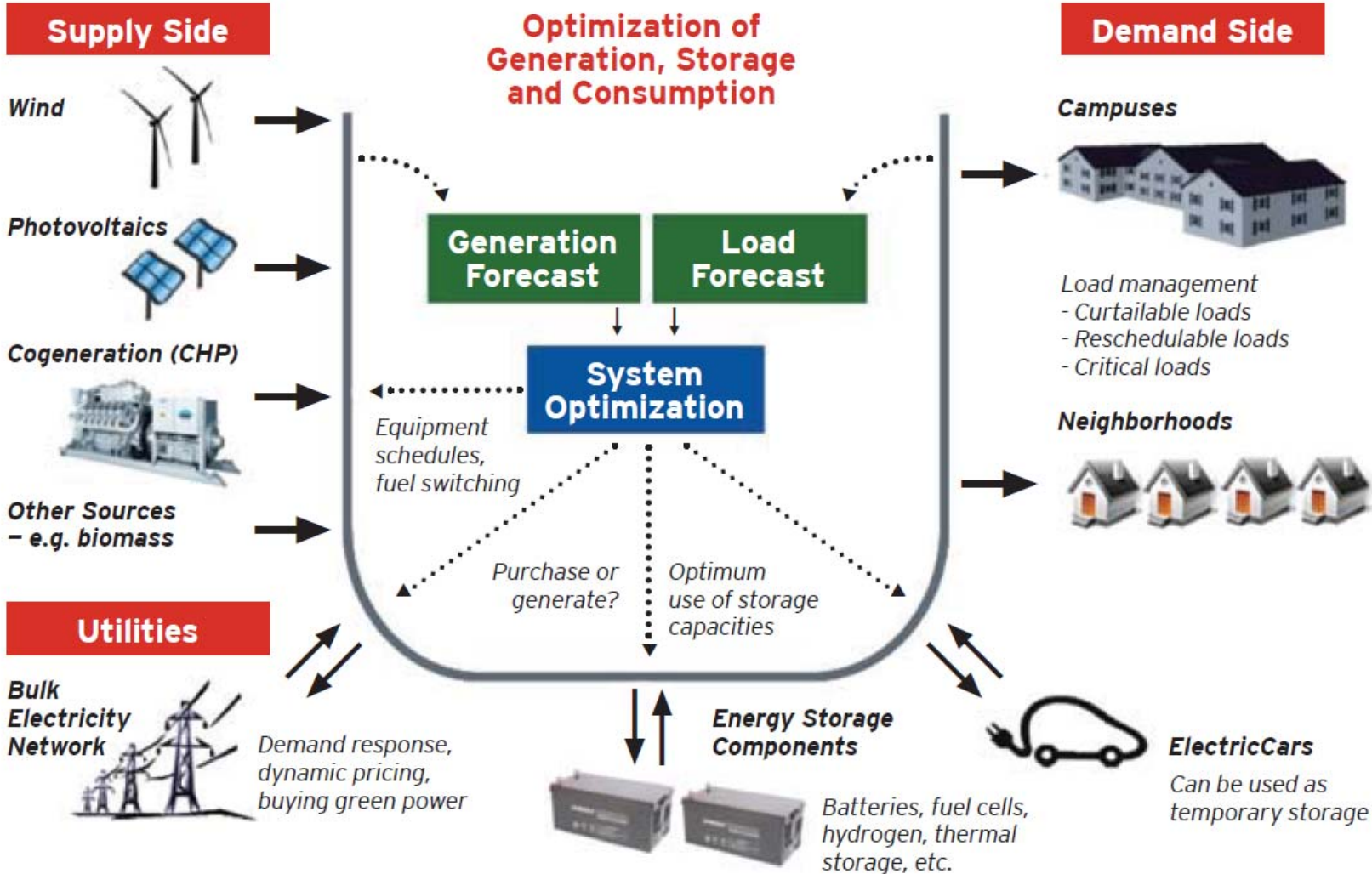
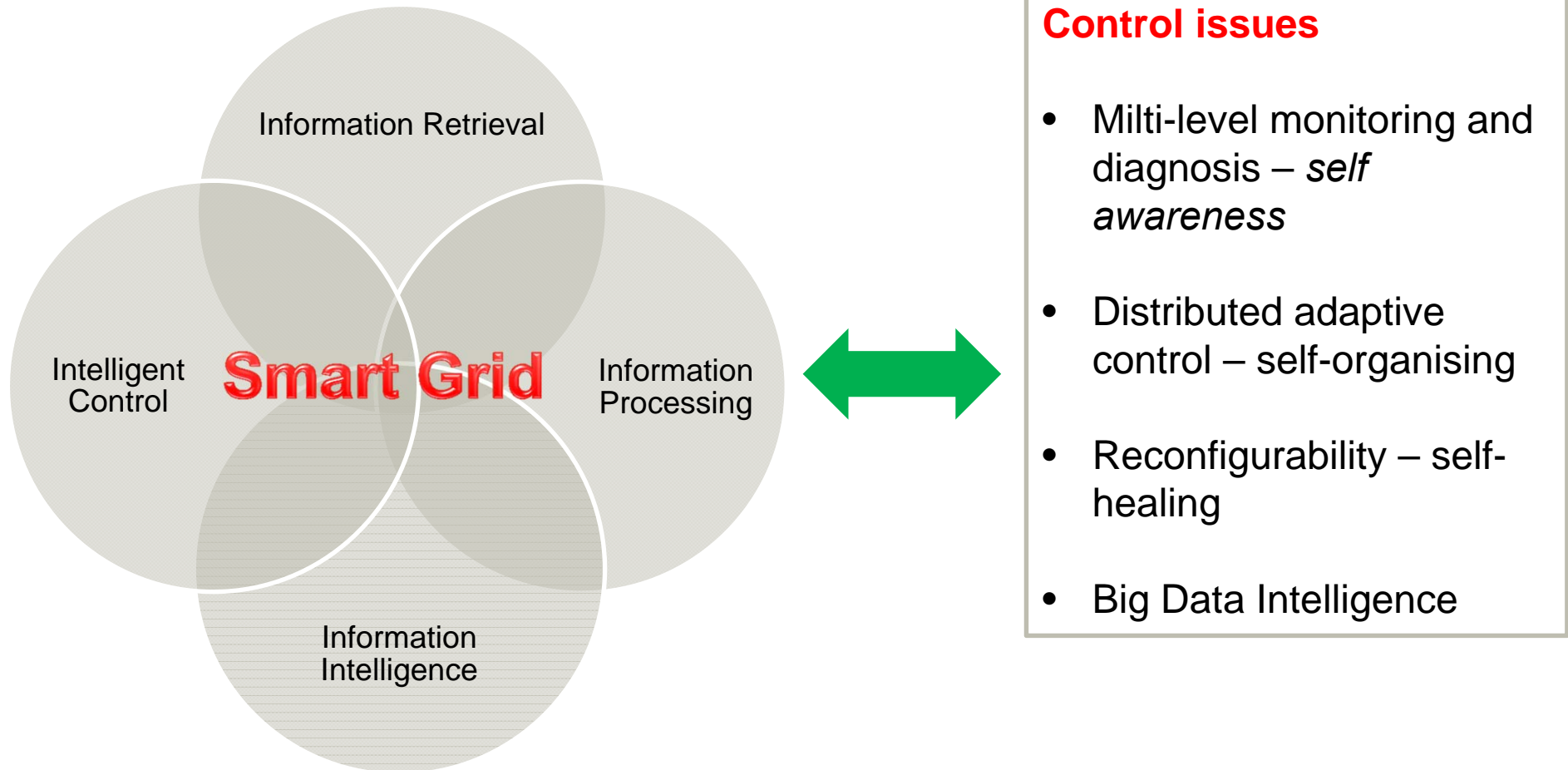


Figure courtesy of Petr Stluka, Honeywell

智能电网的高度复杂性。。。。

- High complexity: large-scale, nonlinear, switched, uncertain, networked, multi-agent, multi-objective, inertial versus non-inertial mechanisms
- Bidirectional electricity flows
- Intermittent availability
- Randomness (e.g. Electric Vehicle charging behaviours)
- Massive nodes (e.g. renewable energy sources, smart meters)
- Smart metering data stream mining applications
- Different time scales in operations
- Power quality monitoring and control
- Security and safety issues
- Integration within the Cyber-Physical mega-system framework
- Social behaviours (flocking, swarming, human psychological behaviors)

智能电网的信息与控制问题。。。



The key question is how to handle the sheer size and complexity of smart grids effectively in real time?

Thank you!