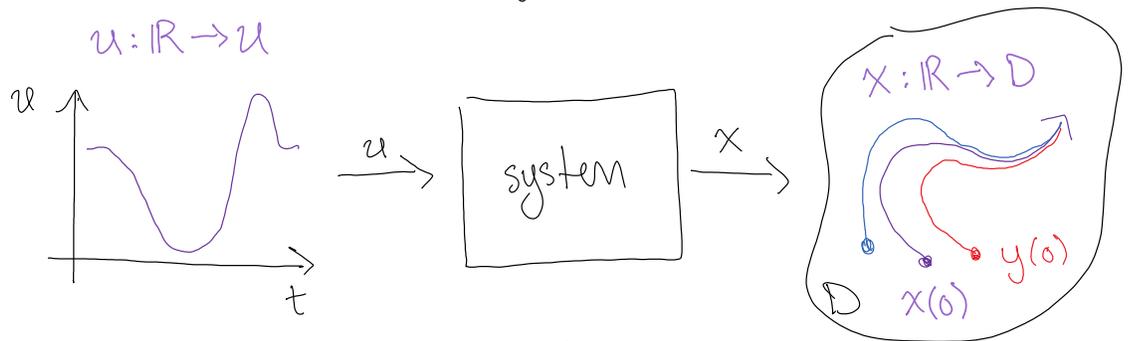


conceptual framework

◦ suppose: feedforward input yields stable behavior:



◦ then trajectories forget initial conditions: $\lim_{t \rightarrow \infty} d(x(t), y(t)) = 0$

◦ if forgetting happens at an exponential rate,

$d(x(t), y(t)) \leq e^{-ct} \cdot d(x(0), y(0))$, call the system contractive

- Lohmiller, Slotine Automatica 1998

- Aminzare, Sontag CDC 2014

classical contractivity

◦ classical (smooth) differential / difference equations:

(globally) contractive if (and only if*) locally contractive

$$d(x(t), y(t))$$

$$\leq e^{ct} \cdot d(x(0), y(0)) \quad \dot{x} = F(t, x) \quad \lambda_{\max} \frac{1}{2} (D_x F + D_x F^T) < c$$

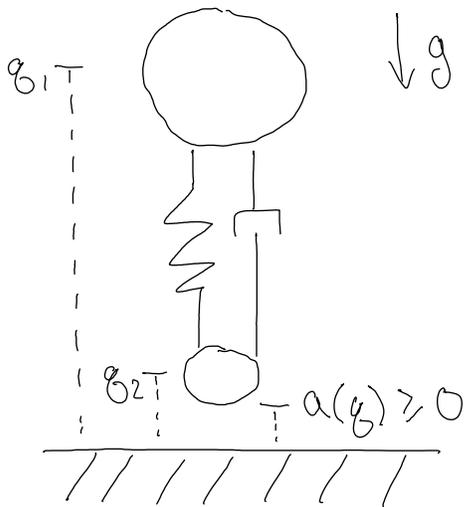
$$\leq K^t \cdot d(x(0), y(0)) \quad x^+ = R(t, x) \quad \sigma_{\max}(D_x R) < K$$

takeaway: global property (feedforward inputs yield stable behaviors)
is intimately connected to local design properties
(does your system behave locally like a spring-mass-damper?)

* in the right coordinates / with the right distance metric

mechanical systems subject to unilateral constraints

ex:



• unfortunately, classical contraction doesn't apply to legs, since dynamics are hybrid (piecewise-defined):

$$M(q) \ddot{q} = f(t, q, \dot{q}, u) + \lambda \cdot Da(q)$$

$$\dot{q}^+ = \Delta(q) \dot{q}^-, \quad a(q) = 0$$

q, \dot{q} : positions, velocities

$M(q)$: mass matrix

f : forces (applied & Coriolis)

$a(q) \geq 0$: nonpenetration constraints

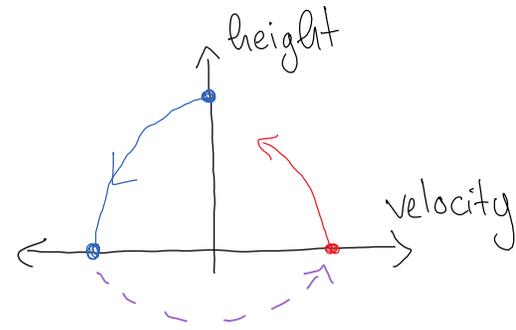
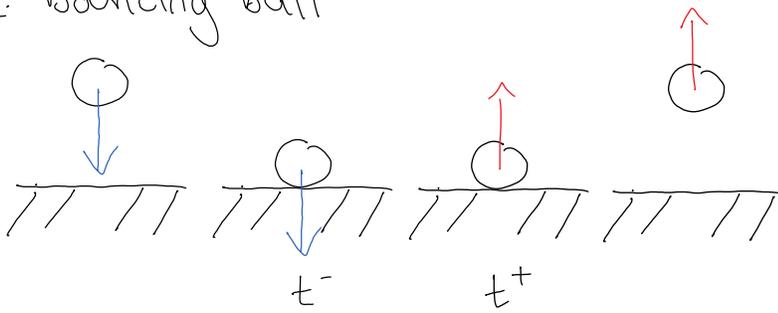
λ : contact forces

$\Delta(q)$: impact law

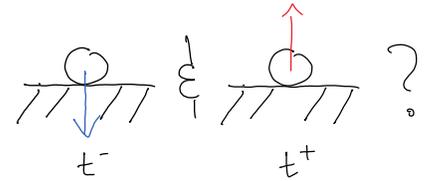
Ballard Arch. Rat. Mech. Anal. 2000

aside: distance in mechanical systems

ex: bouncing ball



Question: what is the distance between



(my) Answer: $d \left(\begin{array}{c} \text{ball} \\ \text{at } t^- \end{array}, \begin{array}{c} \text{ball} \\ \text{at } t^+ \end{array} \right) = 0$

- Schatzman Math. Comput. Modelling 1998
- Burden, Gonzalez, Vasudevan, Bajcsy, Sastry IEEE TAC 2015

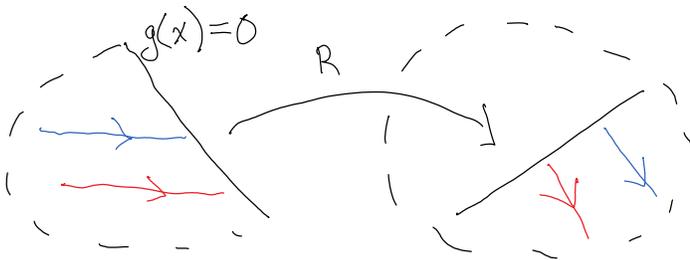
generalizing contractivity to hybrid systems

- mechanical systems mix continuous-time (CT) $\dot{x} = F(t, x)$, $g(x) > 0$
and discrete-time (DT) $x^+ = R(x)$, $g(x) \leq 0$

so it makes sense that these hybrid systems are contractive if they are locally contractive in both:

$$(CT) \lambda_{\max} \frac{1}{2} (D_x F^T + D_x F) < 0 \quad \& \quad (DT) \sigma_{\max} (D_x R) < 1$$

* DT condition must be modified to account for discontinuity in F across g:



$$S = D_x R + (F^+ - D_x R \cdot F^-) \cdot \frac{Dg}{Dg \cdot F^-}$$

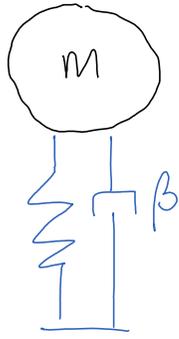
(saltation matrix)

$$- DT \quad \sigma_{\max} (S) < 1$$

- Aizerman, Gantmacher Quart. Journ. Mech. and Applied Math. 1958
- Burden, Coogan arXiv:1804.04122

limb impact is NOT contractive (!)

ex:

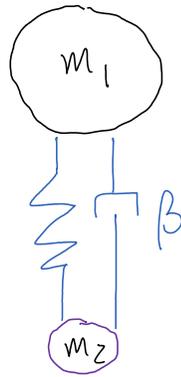


elastic limb
massless foot

$$S = \begin{bmatrix} 1 & 0 \\ \pm \frac{\beta}{m} & 1 \end{bmatrix}$$

$$\sigma_{\max}(S) > 1$$

ex:

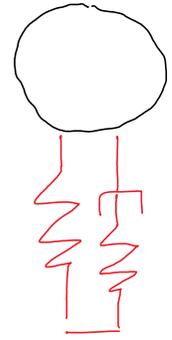


elastic limb
massed foot

$$S_{TD} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & \beta/m_1 & 1 & 0 \\ 0 & 0 & 0 & 0 \end{bmatrix}$$

$$\sigma_{\max}(S_{TD}) > 1$$

ex:



viscoelastic limb
massless foot

$$S = \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ \alpha & 0 & 1 + \delta \cdot \alpha \end{bmatrix}$$

$$\sigma_{\max}(S) > 1$$

o based on the vignettes, I did not expect this...