

Today Computational Methods for Legged Robots

Simple models Rimless wheel

Compass gait

SLIP

Limit cycles

Hybrid dynamics of contact

Smooth

Fixed points / local stability

Local stabilization (e.g. LQR)

Lyapunov analysis

Traj optimization

Smooth systems

$$\dot{x} = f(x)$$

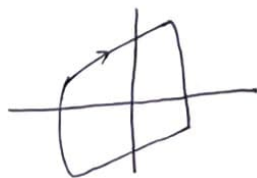
fixed pt is $f(x^*) = 0$

find s.t. $f(x^*) = 0$ search problem
 x

Periodic solutions

Find by : Traj optimization

Ex van der Pol oscillator



find s.t. $\dot{x}(t) = f(x)$

$x(t_0), t(t_0)$

↖ e.g. direct collocation

knots in spline

rep ~~x(t_0)~~ $x(t_0)$

$$x(t_0) = x(t_f)$$

knock out origin

$$q(t_0) = 0$$

point

$$\dot{q}(t_0) \geq .1$$

Code demo to find periodic solution

Ex. RW cycle w/ dircol

$$m l^2 \ddot{\theta} - m g l \sin \theta = 0$$

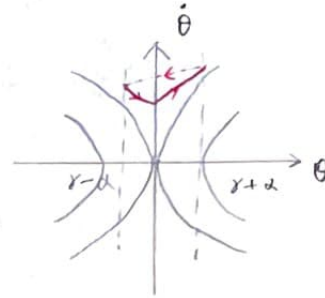
$$\dot{\theta}^+ = \cos(2\alpha) \dot{\theta}^-$$

find s.t. $\dot{x} = f(x)$ via dircol
 $x(\cdot), t(\cdot)$

$$\theta(0) = \gamma - \alpha$$

$$\theta(t_f) = \gamma + \alpha$$

$$\dot{\theta}(0) = \cos(2\alpha) \dot{\theta}(t_f)$$

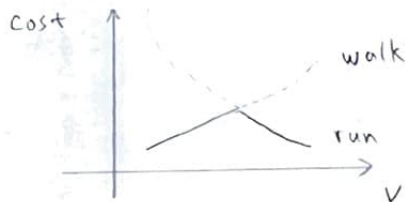


in RW, a unique solution found

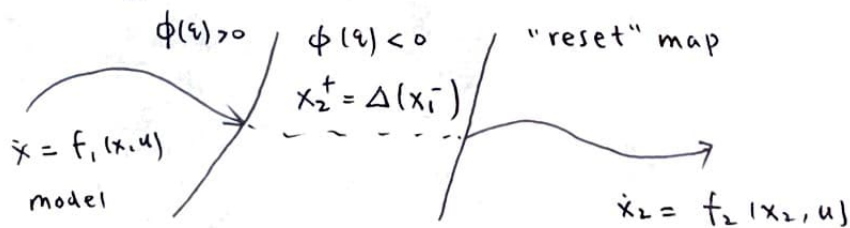
in Compass Gait, solution changes as system param changes

may be multiple solutions (walk & run)

speed \uparrow running better than walking



More general (autonomous hybrid systems)



$$\phi(q) = 0$$

"guard"

"witness function"

modes



mode 1 foot in air

mode 2 heel on ground

mode 3 heel + toe on ground

mode 4 toe on ground

If you prescribe a "mode schedule"

$$x[0] \dots x[k] \quad x[n+1] = f_1(x[n], u[n])$$

$$x[k+1] \dots x[n] \quad x[n+1] = f_2(x[n], u[n])$$

$$\forall i < k \quad \phi(x[i]) > 0$$

$$\phi(x[k]) = 0$$

$$x[k+1] = \Delta(x[k])$$

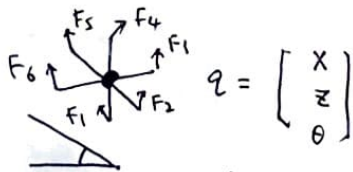
$$\forall i > k \quad \phi(x[i]) < 0 \quad \leftarrow ?$$

problem:

write "minimal coordinate" difficult in



"maximal coordinates"



$$foot_i(q) \geq \text{ramp}$$

Contact Jacobian

Contact forces

$$M(q) \ddot{q} + c(q, \dot{q}) \dot{q} = T_g(q) + Bu + \sum_i J_i^T(q) F_i$$

$$\text{if } \phi_i(q) > 0, F_i = 0$$

$$\text{if } \phi(q) = 0$$

$$\dot{\phi}(q) = 0 \quad \ddot{\phi}(q) = 0 \Rightarrow \text{solve for } F_i \text{ impose constraints}$$

$$\frac{\partial \phi(q)}{\partial q}$$

find $\dot{x} = f(x, u, F)$

$x(0), u(0), F(0)$

$\phi(q) = 0$

$\rightarrow \dot{\phi}(q) = 0$

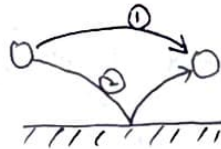
but hand designed contact sequence became impossible for more complicated systems

Idea #1: Soft contact

$F_i = \text{soft-spring-model}(x)$

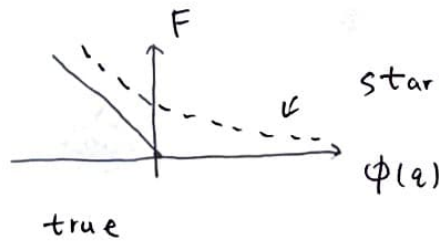
$= -k\phi_i(x) - \text{damping} \dots$

problem: contact modes are stiff, different modes



cannot discover ② traj
start initial ① traj

method



start with relaxation

Idea #2: Time-stepping approximation

$x[n+1] = f(x[n], u[n], \overset{\text{forces}}{\lambda[n]})$

backward Euler update

$x[n+1] = x[n] + dt f(x[n+1], u[n+1], \lambda[n+1])$

$\phi(q) \geq 0, \lambda[n] \geq 0$

Complementary $\phi(q[n]) \cdot \lambda[n] = 0$

constraint

$\phi(q) = 0 \text{ OR } \lambda = 0$

Surprisingly effective solns via LCP