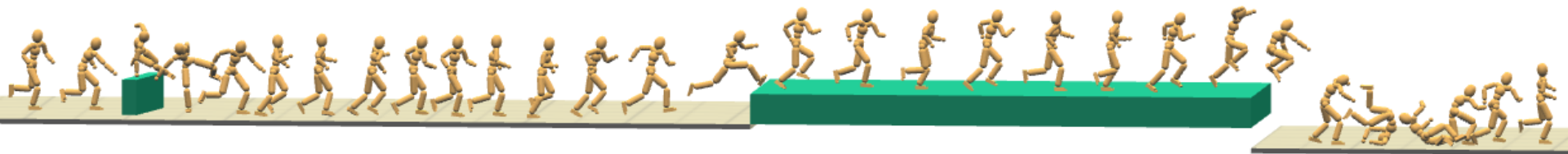


# Terrain Runner: Control, Parameterization, Composition, and Planning for Highly Dynamic Motions

Libin Liu\*    KangKang Yin†    Michiel van de Panne‡    Baining Guo§

\*Tsinghua University    †National University of Singapore

‡University of British Columbia    §Microsoft Research Asia



# Motivation

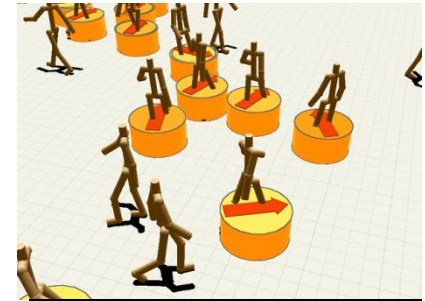
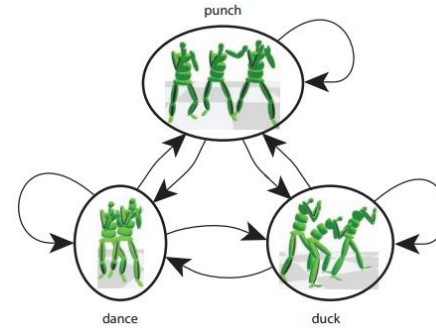


[clips are from YouTube, uploaded by 3runTube, l1consolable, ParkourGenerations, rubenparkour, traceurelements]

# Outline

- Motivation
- Related work
- Controller synthesis pipeline + results
- Conclusion

# Related Work

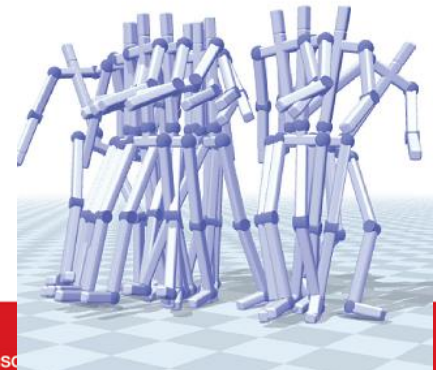
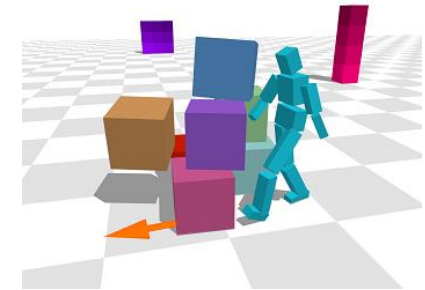


- Kinematic Methods

- [Kovar et al. 2002; Heck and Gleicher 2007; Min et al. 2009; Treuille et al. 2007; Lee et al. 2009]

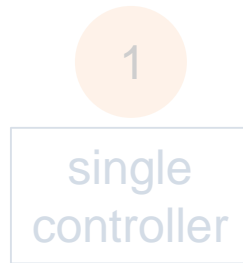
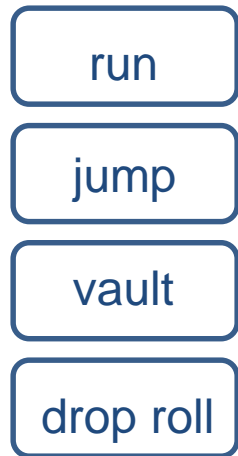
- Physics-based Methods

- Single controllers: [Hodgins et al. 1995; Zhao and van de Panne 2005; Muico et al. 2009; Coros et al. 2010; Lee et al. 2010; Wang et al. 2009]
- Control Composition: [Faloutsos et al. 2001, Sok et al. 2007, da Silva et al. 2009, Muico et al. 2011, Coros et al. 2011]

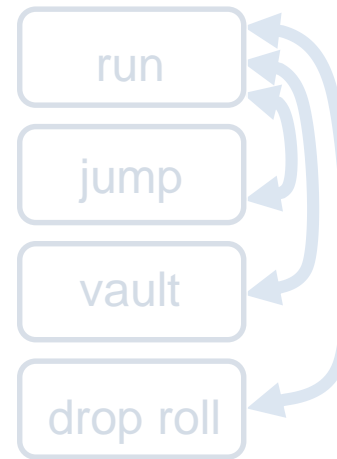


# System Overview

single example  
motion clips



parameterized  
controllers



# Motion Examples

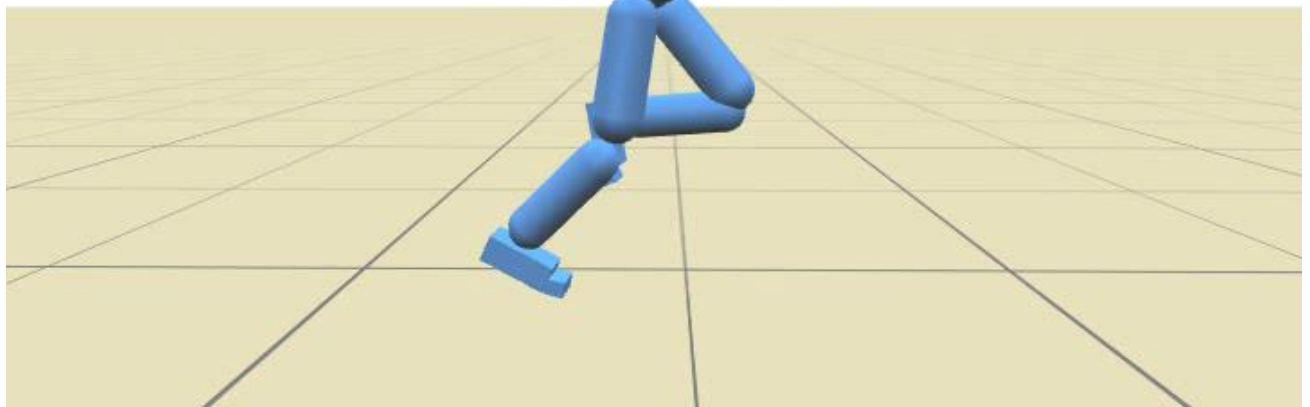
single example  
motion clips

run

jump

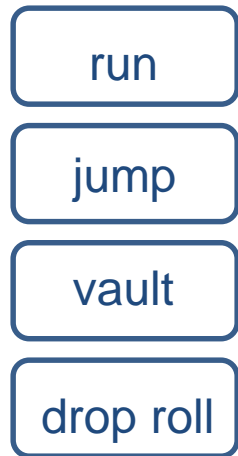
vault

drop roll



# System Overview

single example  
motion clips



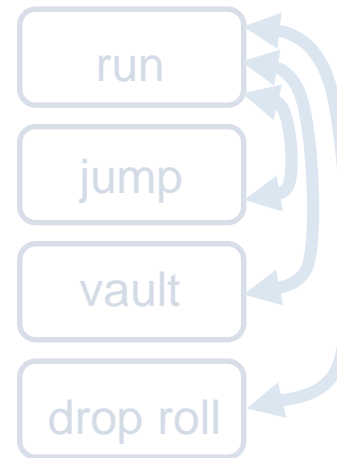
1



2



parameterized  
controllers



3



4



# Stage 1: Single Controller Construction

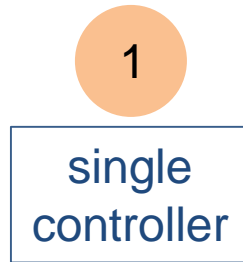
single example  
motion clips

run

jump

vault

drop roll



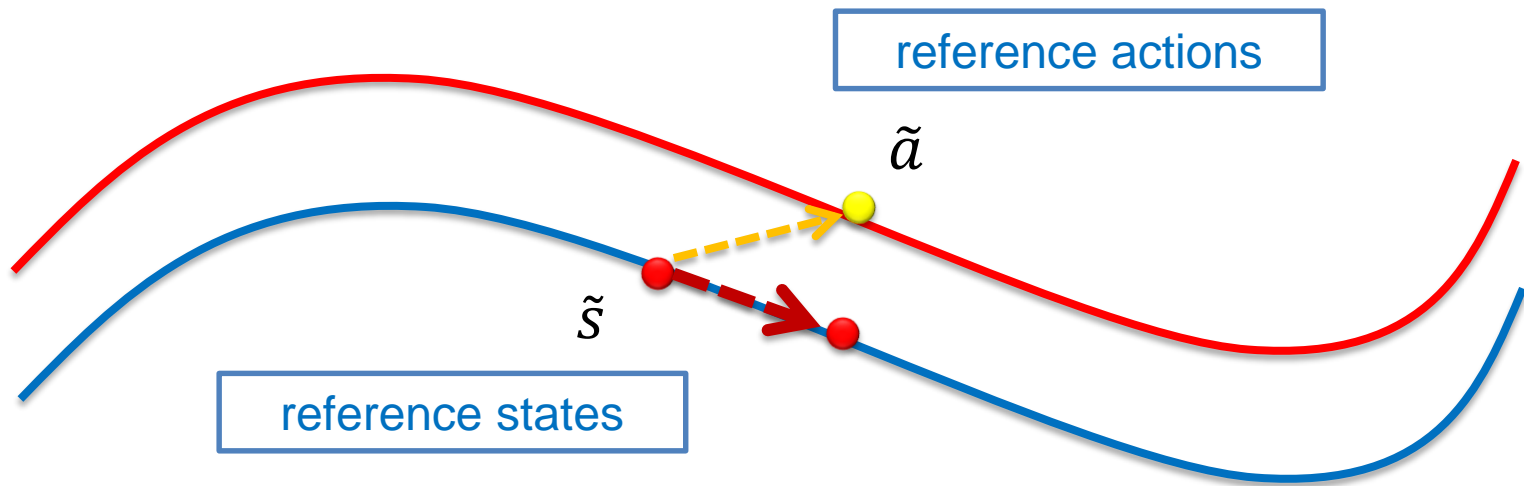
a: Open loop policy  
[Liu et al. 2010]

b: Reduced-order closed-loop  
policy [Ding et al. 2012]



# Stage 1a: Open-loop Policy

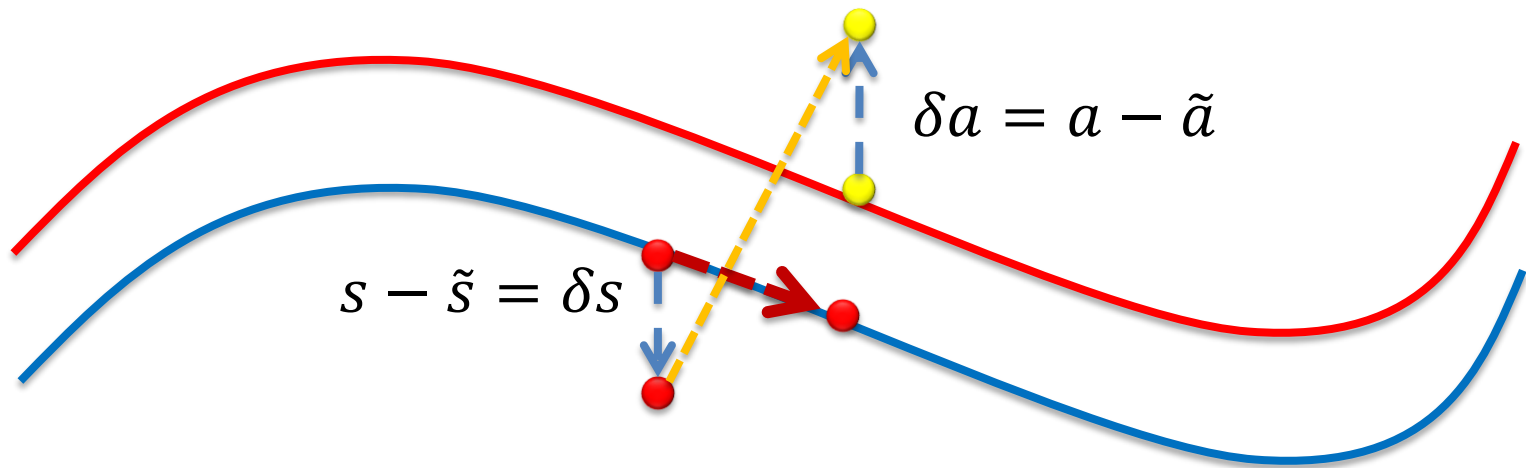
[Liu et al. 2010]: Sampling-based Contact-rich Motion Control, SIGGRAPH 2010



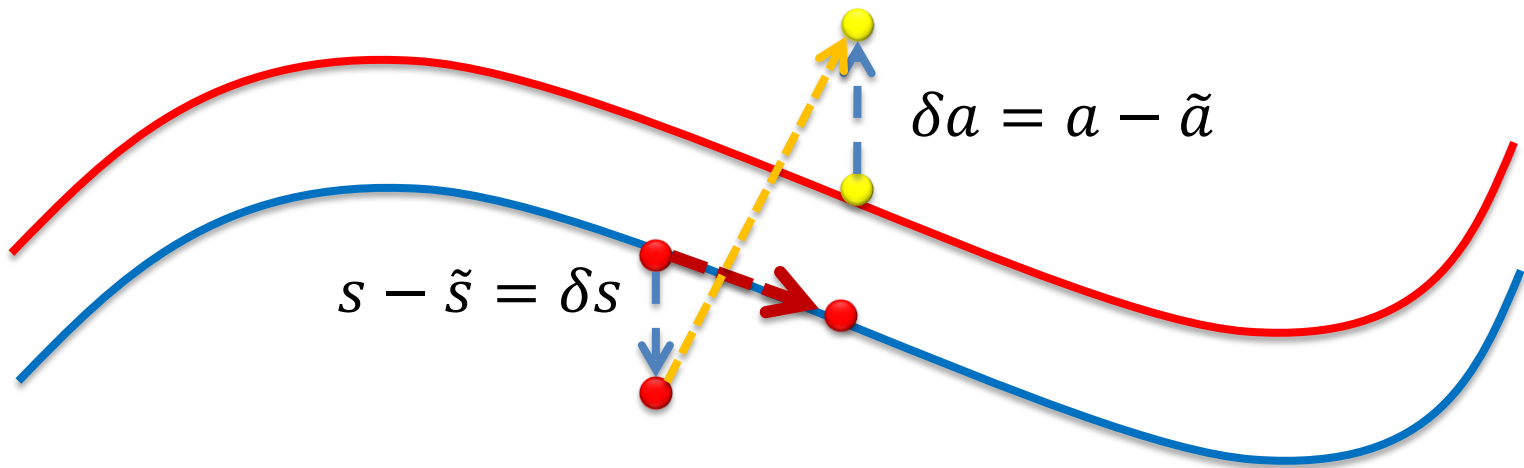
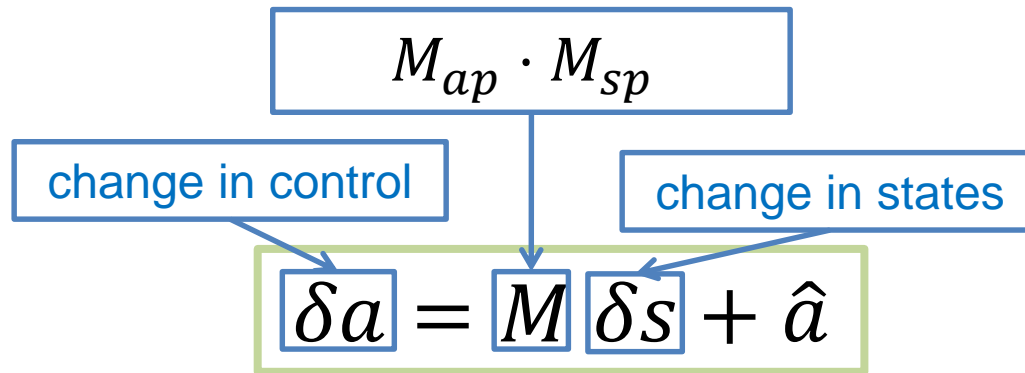
# Stage 1b: Reduced-order Closed-loop Policy

[Ding et al. 2012]: Learning reduced-order feedback policies for motion skills. Tech. Rep. University of British Columbia.

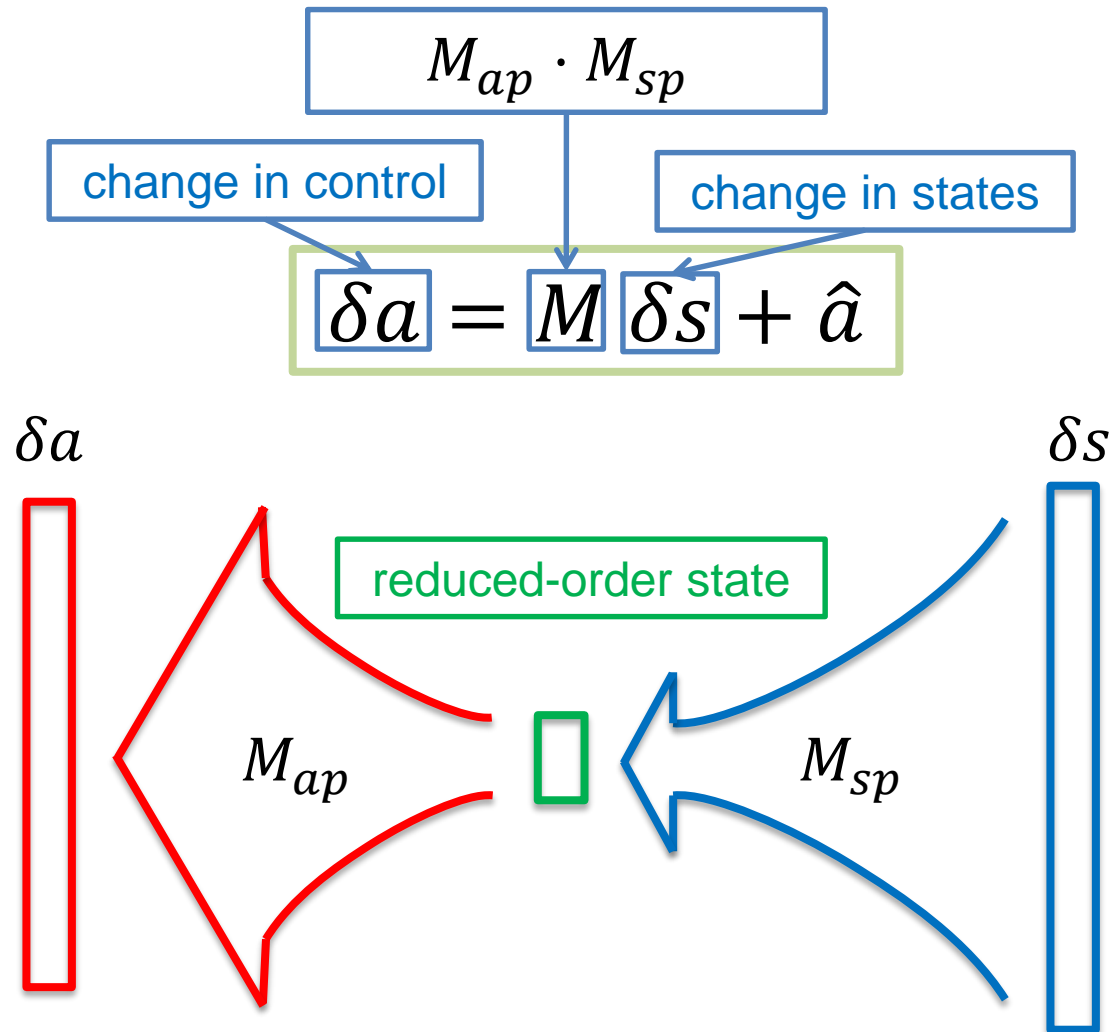
$$\delta a = M \delta s + \hat{a}$$



# Stage 1b: Reduced-order Closed-loop Policy



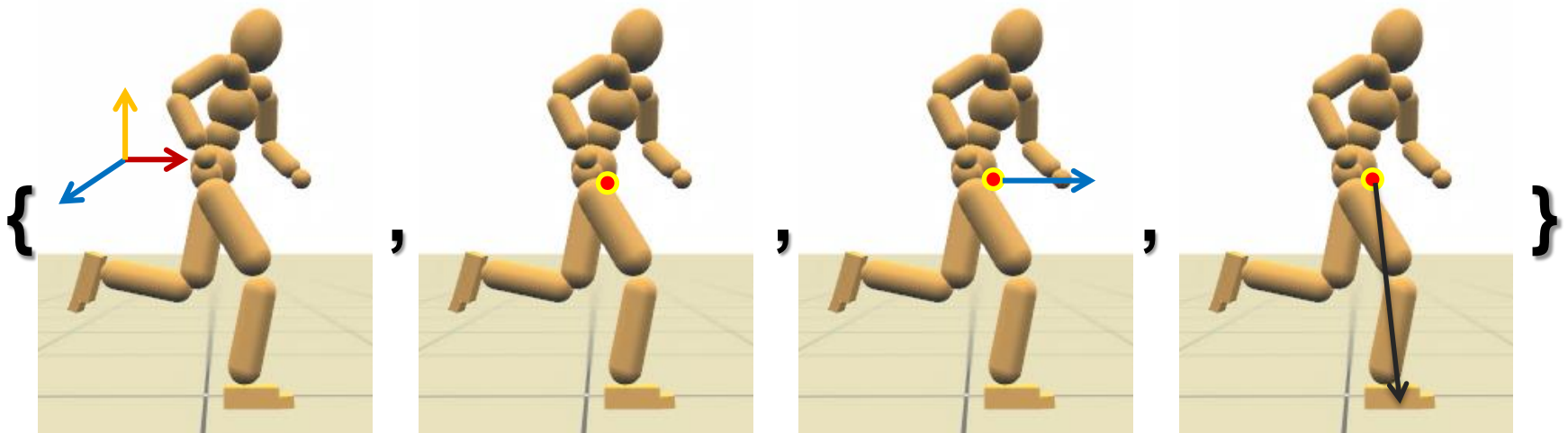
# Stage 1b: Reduced-order Closed-loop Policy



## Stage 1b: Feedback Policy

# Manually-selected States: $s$

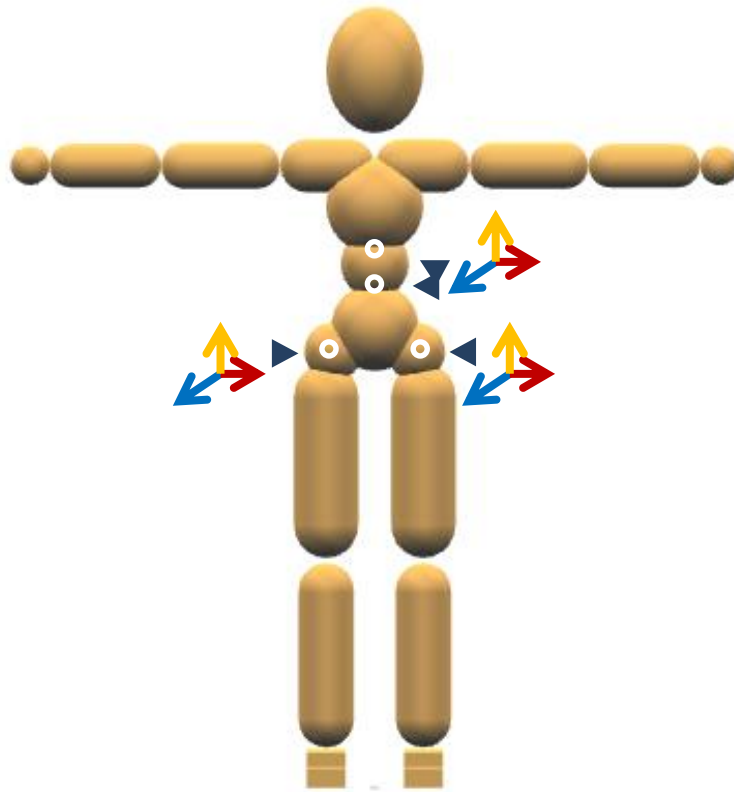
- Running: 12 dimensions



## Stage 1b: Feedback Policy

# Manually-selected Controls: $a$

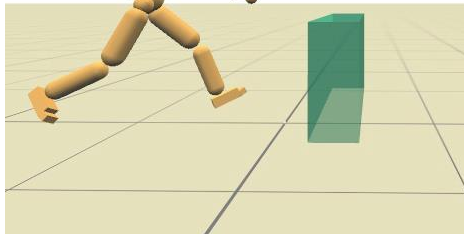
- for all skills: 9 dimensions



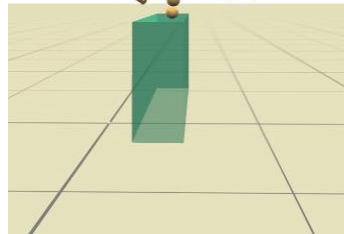
## Stage 1b: Feedback Policy

# Multi-phase Skills

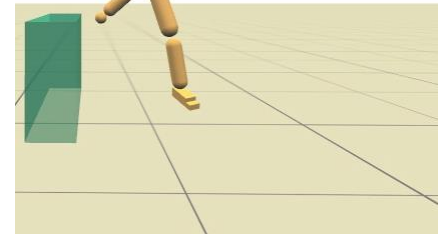
- Vaulting



phase 1: raising



phase 2: dropping

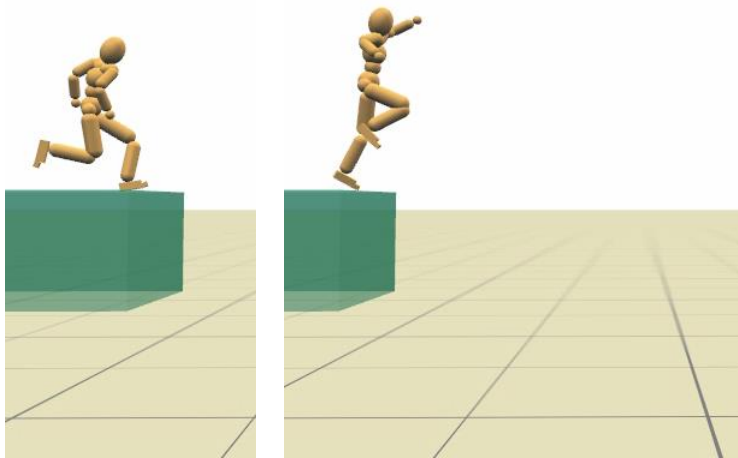


phase 3: landing

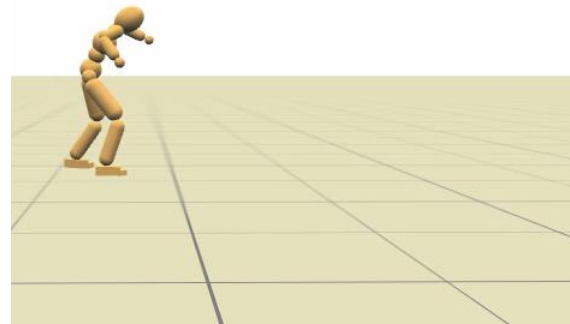
## Stage 1b: Feedback Policy

# Multi-phase Skills

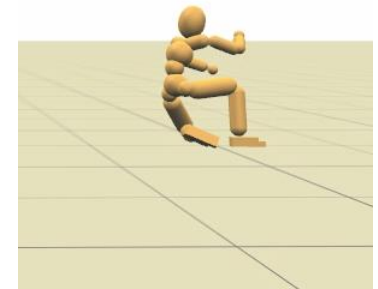
- Drop-rolling



phase 1: jumping    phase 2: dropping



phase 3: rolling



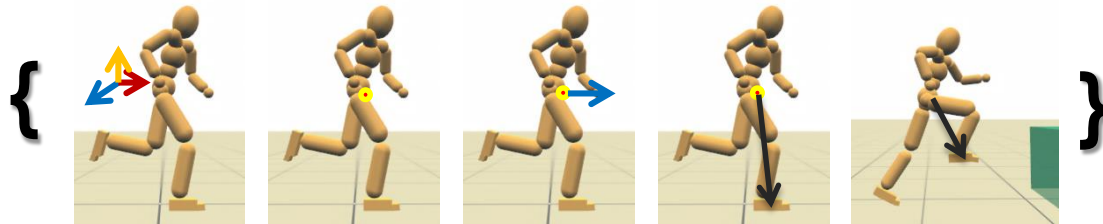
phase 4: standing-up



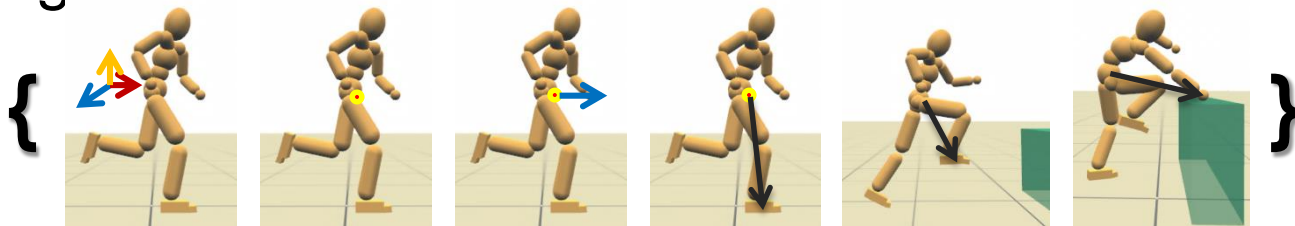
## Stage 1b: Feedback Policy

# Manually-selected States: $s$

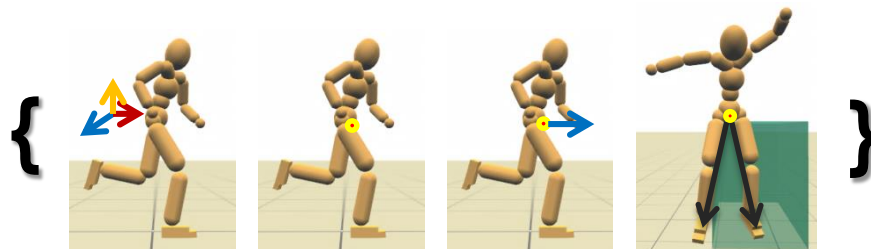
- Jumping



- Vaulting



- Drop-rolling

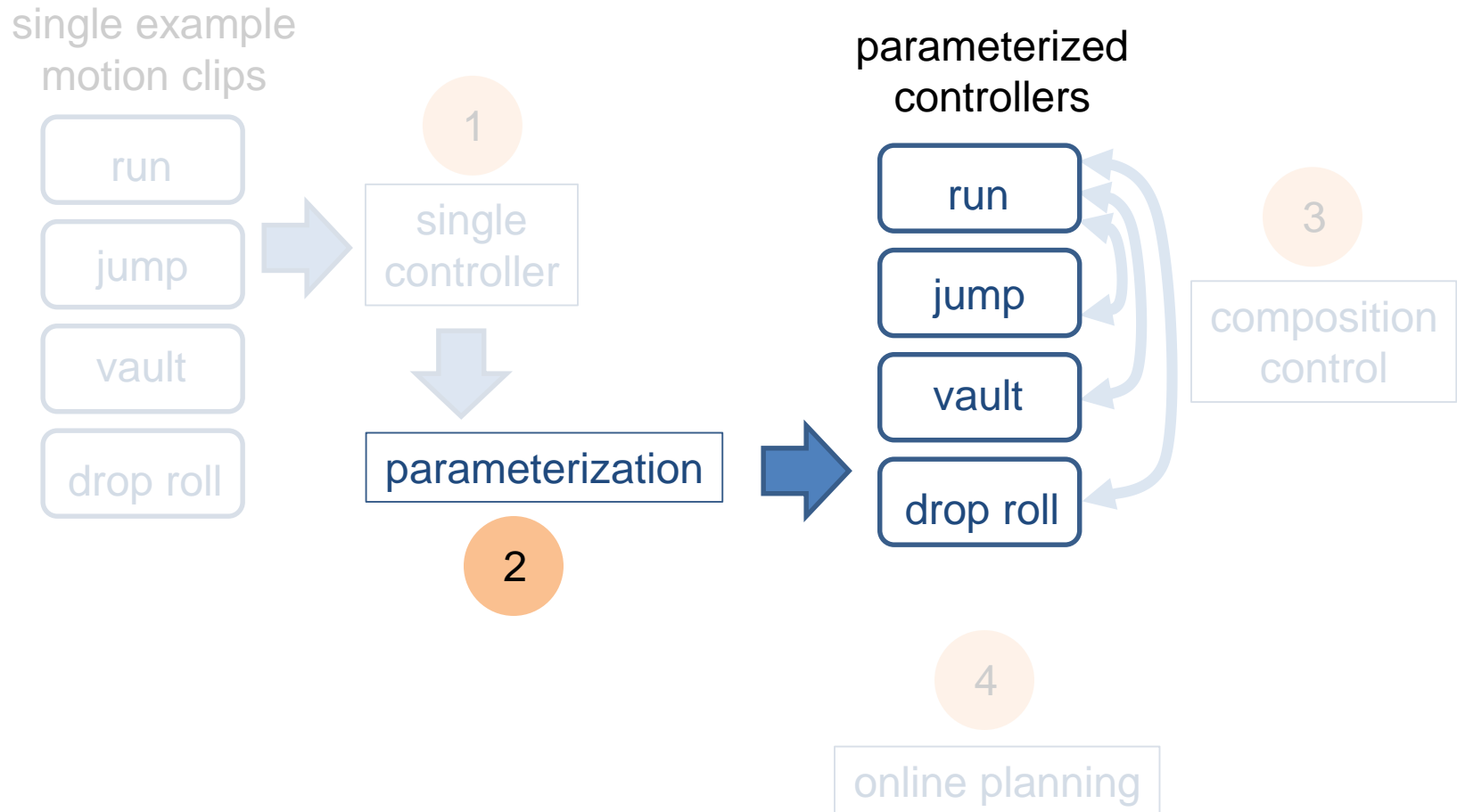


## Stage 1b: Feedback Policy Optimization

$$\delta a = M\delta s + \hat{a}$$

- Optimize  $M$ 
  - CMA, Covariance Matrix Adaption ([Hansen 2006])
  - Running:
    - Objective function
$$E = w_t(N_d T_c - T_s) + w_s E_s + w_p E_p + w_\tau E_\tau$$
    - 12 minutes on 24 cores
    - more details in paper and [Ding et al. 2012]

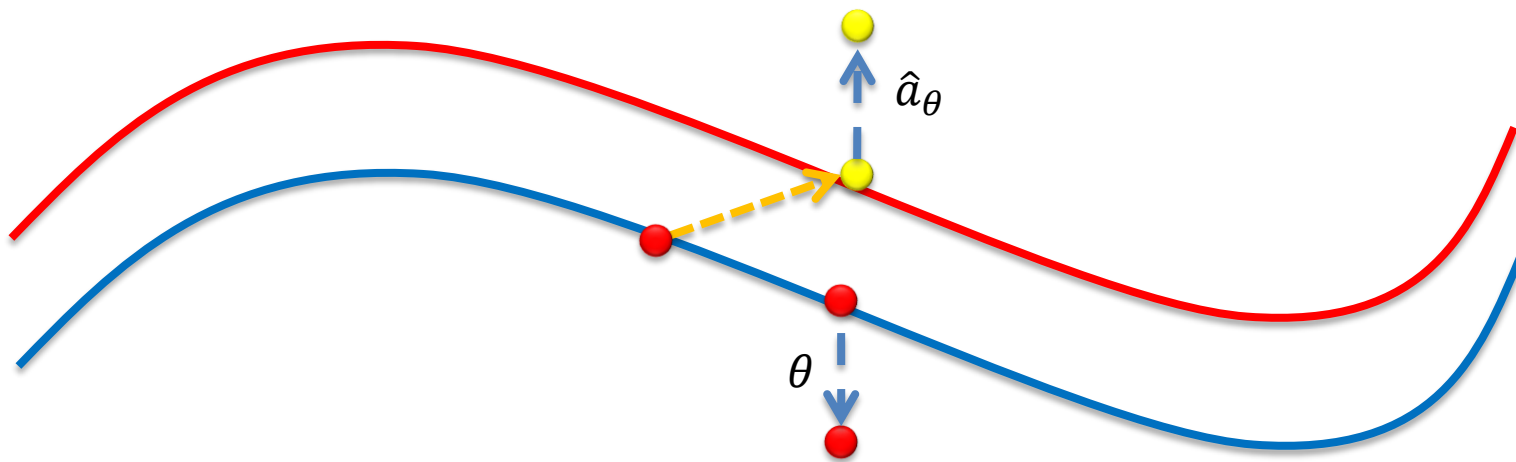
# System Overview



## Stage 2: Parameterization

$$\delta a = \boxed{M_\theta} \delta s + \boxed{\hat{a}_\theta}$$

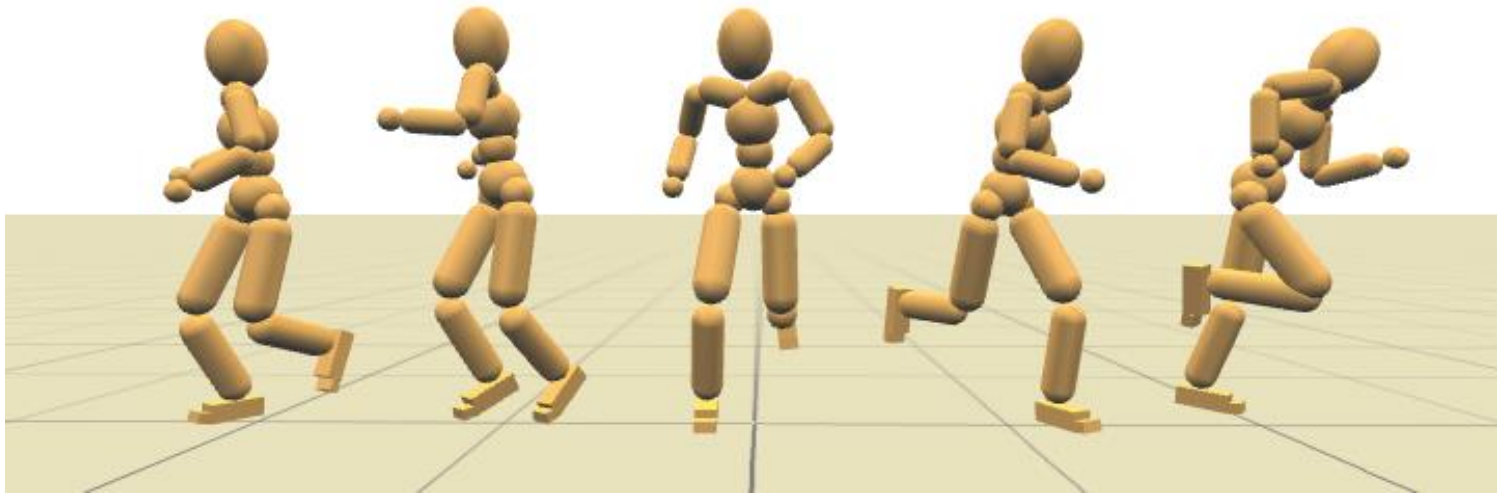
$$\delta a = \boxed{M} \delta s + \boxed{\hat{a}}$$



## Stage 2: Parameterization

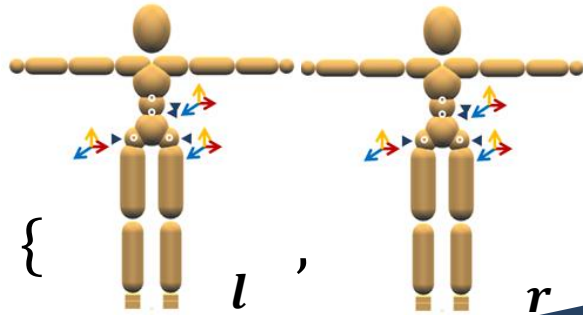
# Running: parameter space

- $\theta = (v, \phi)$ 
  - speed, turning rate
  - $[2\text{m/s}, 5\text{m/s}] \times [-6^\circ, 6^\circ]/\text{step}$

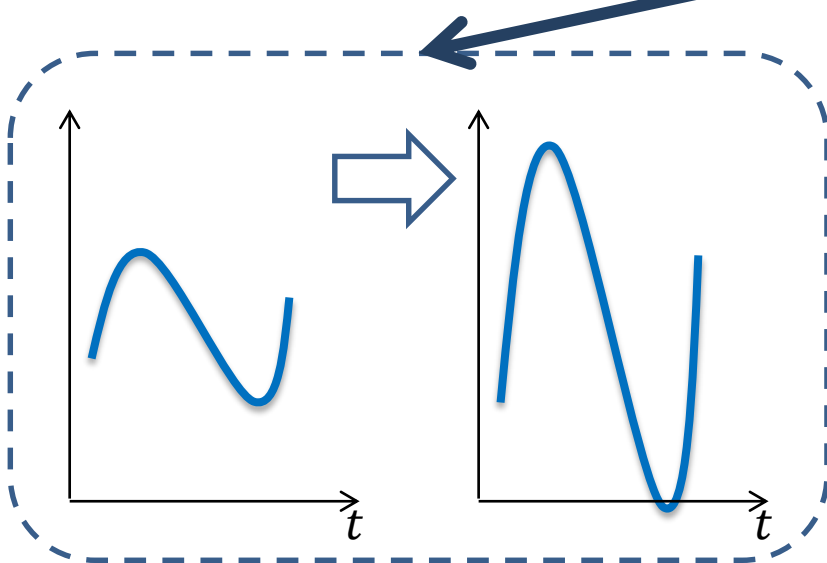


## Stage 2: Parameterization

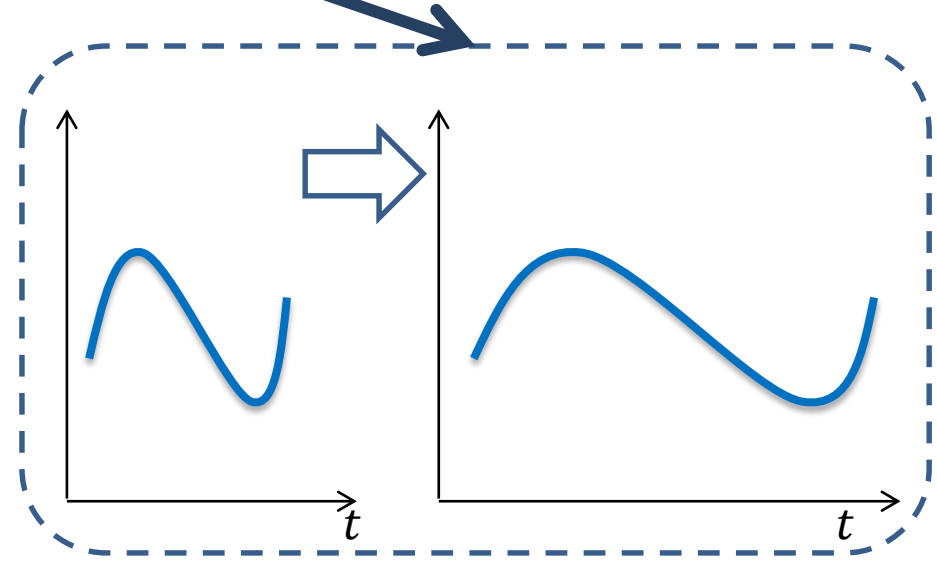
# Running: Action Set Augmentation



- $\hat{a}_\theta = \{ l, r, \alpha, \beta \}$



space scaling



time scaling

## Stage 2: Parameterization

# Running: optimization

- $M_\theta, \hat{a}_\theta$

$$E = \underbrace{w_t(N_d T_c - T_s)}_{\text{success}} + \underbrace{\frac{w_h}{T_s} \int \|\mathbf{d}_h - \bar{\mathbf{d}}_h\| dt}_{\text{head's stability}}$$
$$+ \frac{1}{N_s} (w_\phi |\phi_i - \phi^*| + w_v |v_i - v^*| + w_f |f_i - f^*|)$$

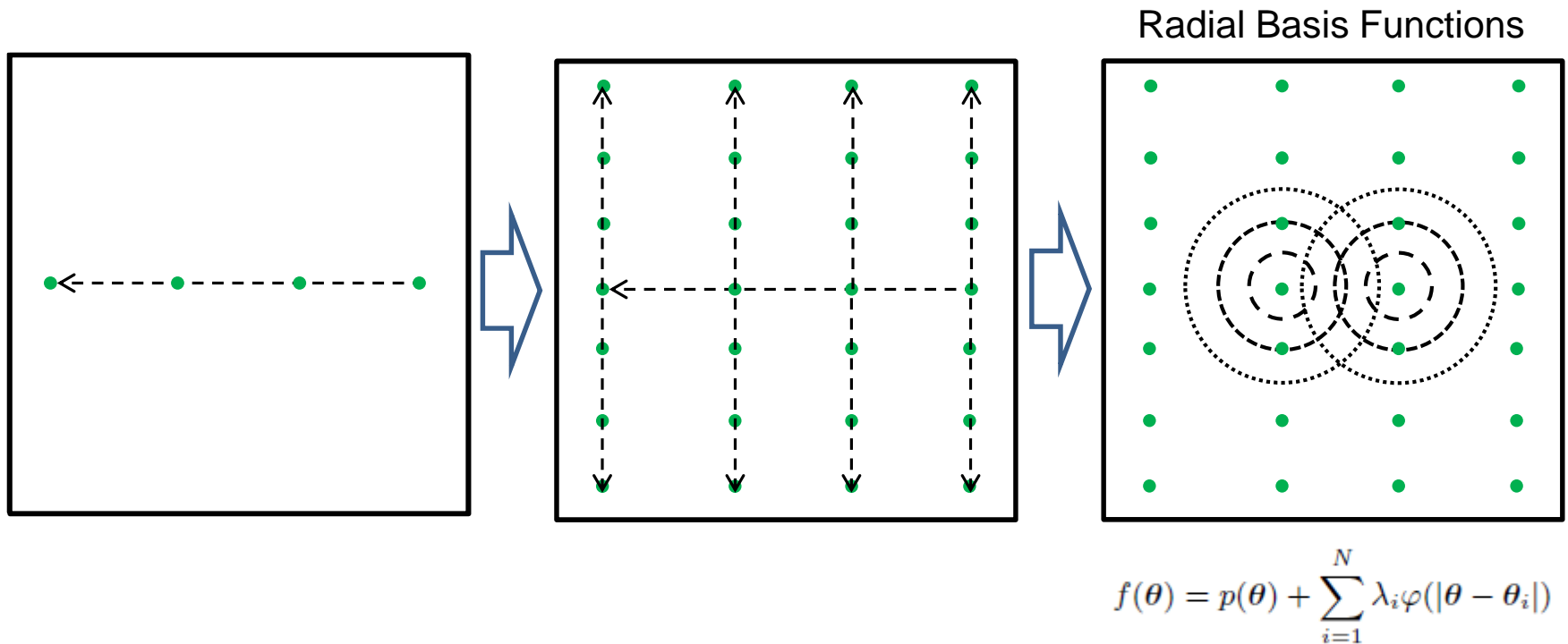
---

desired parameters

## Stage 2: Parameterization

# Continuation

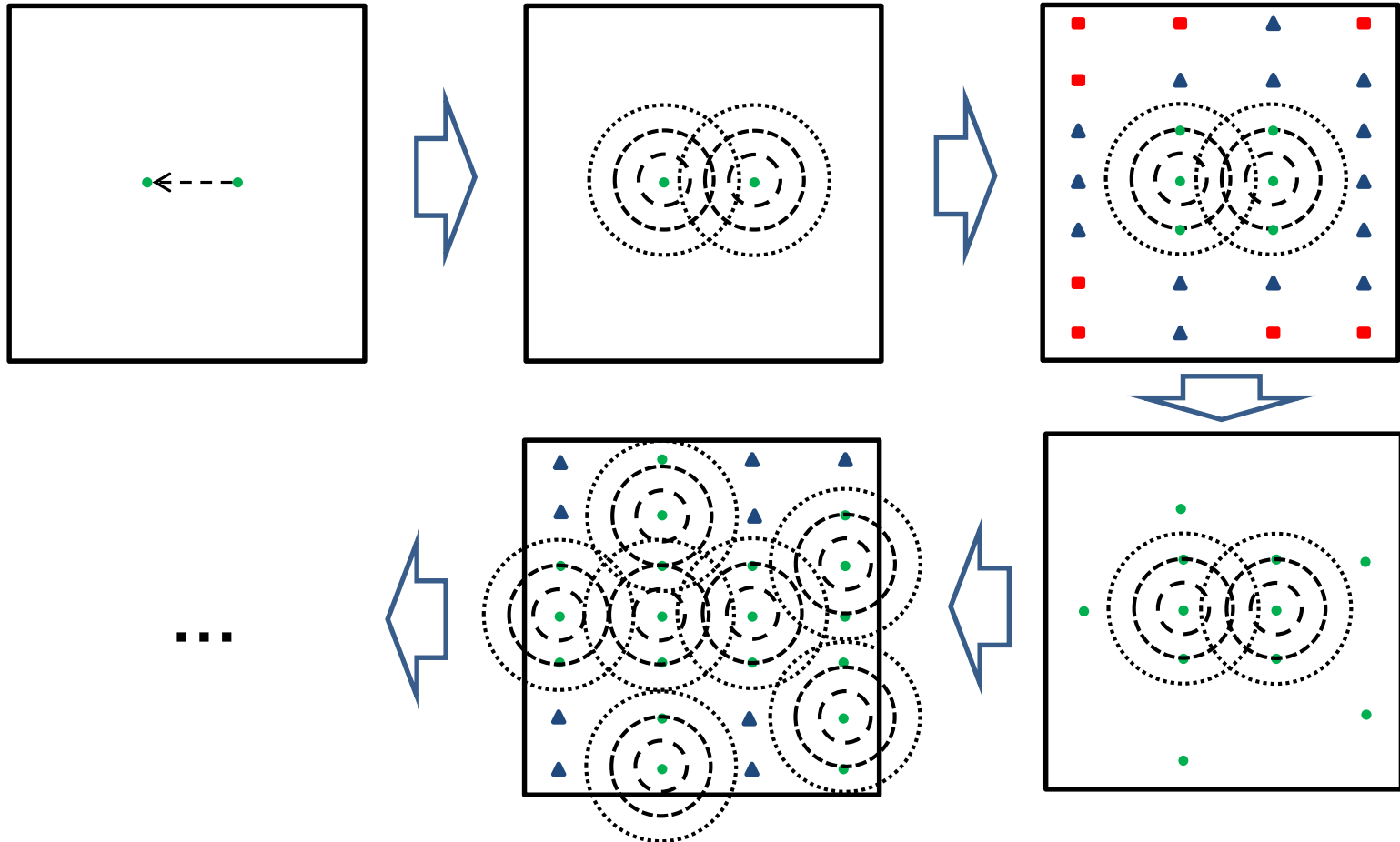
- [Yin et al. 2008]: Continuation methods for adapting simulated skills. SIGGRAPH 2008





## Stage 2: Parameterization Continuation

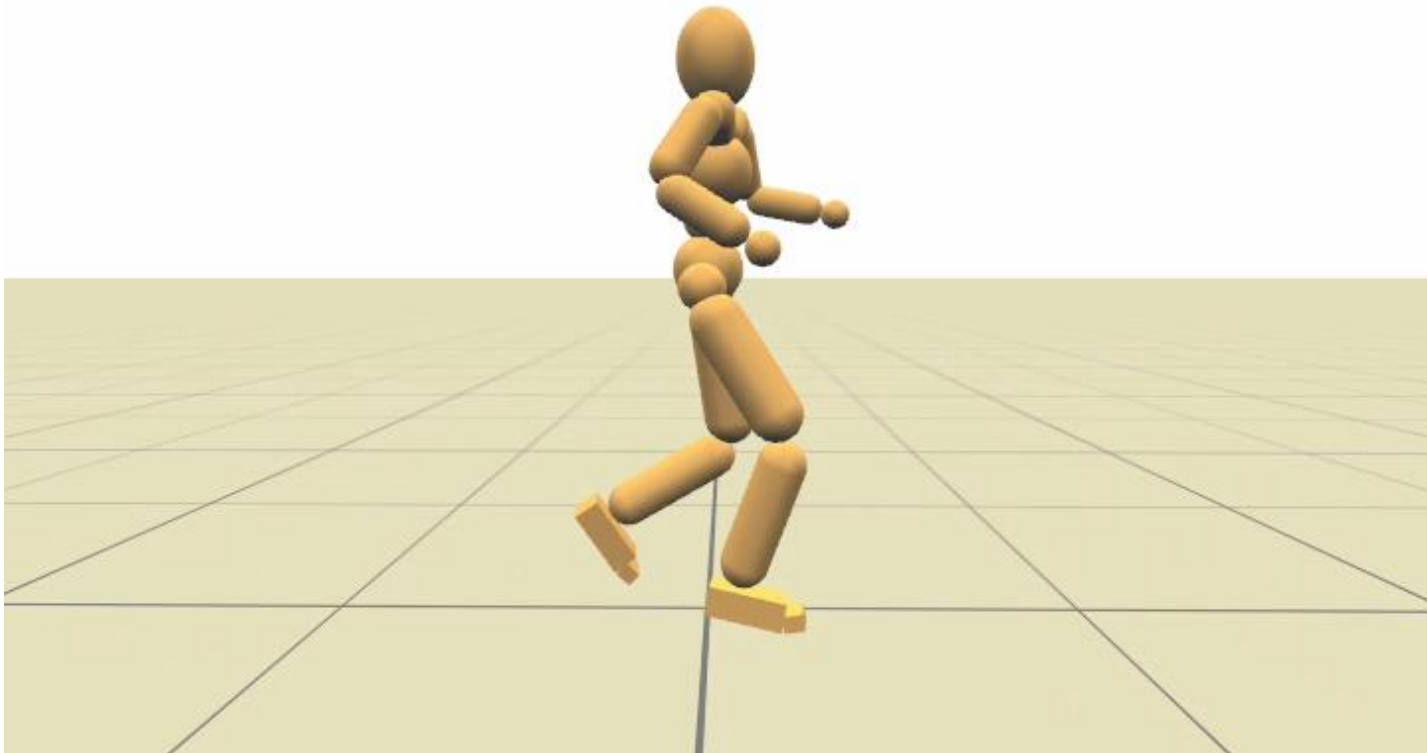
- Predictor-corrector



## Stage 2: Parameterization

# Running Results

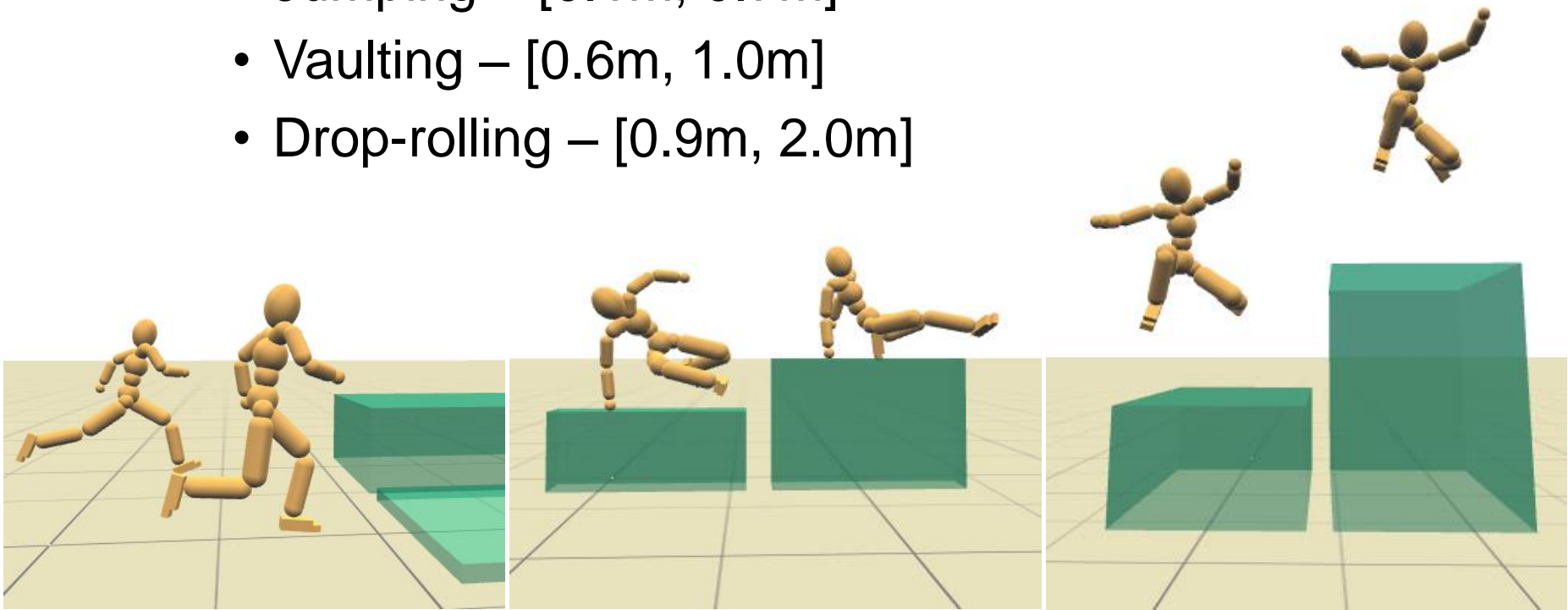
Run - (0°, 2.0m/s)



## Stage 2: Parameterization

# Obstacle Clearing Maneuvers

- $\theta = h$ 
  - Obstacle height
    - Jumping – [0.1m, 0.7m]
    - Vaulting – [0.6m, 1.0m]
    - Drop-rolling – [0.9m, 2.0m]

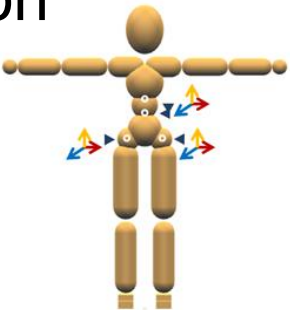


## Stage 2: Parameterization

# Obstacle Clearing Maneuvers

- Optimization

–  $\hat{a}_h = \{$



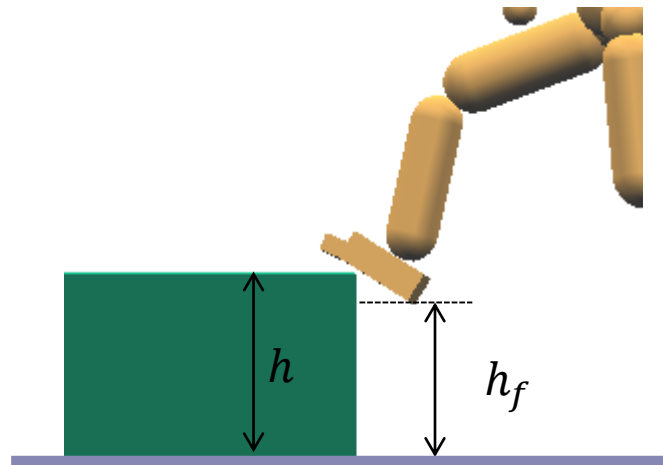
$\}, \alpha, \beta \}$

$$E_h = w_c \underbrace{E_c}_{\text{contact}} + w_b \underbrace{E_b}_{\text{balance}} + w_p \underbrace{E_p}_{\text{pose}}$$

## Stage 2: Parameterization

# Obstacle Clearing Maneuvers

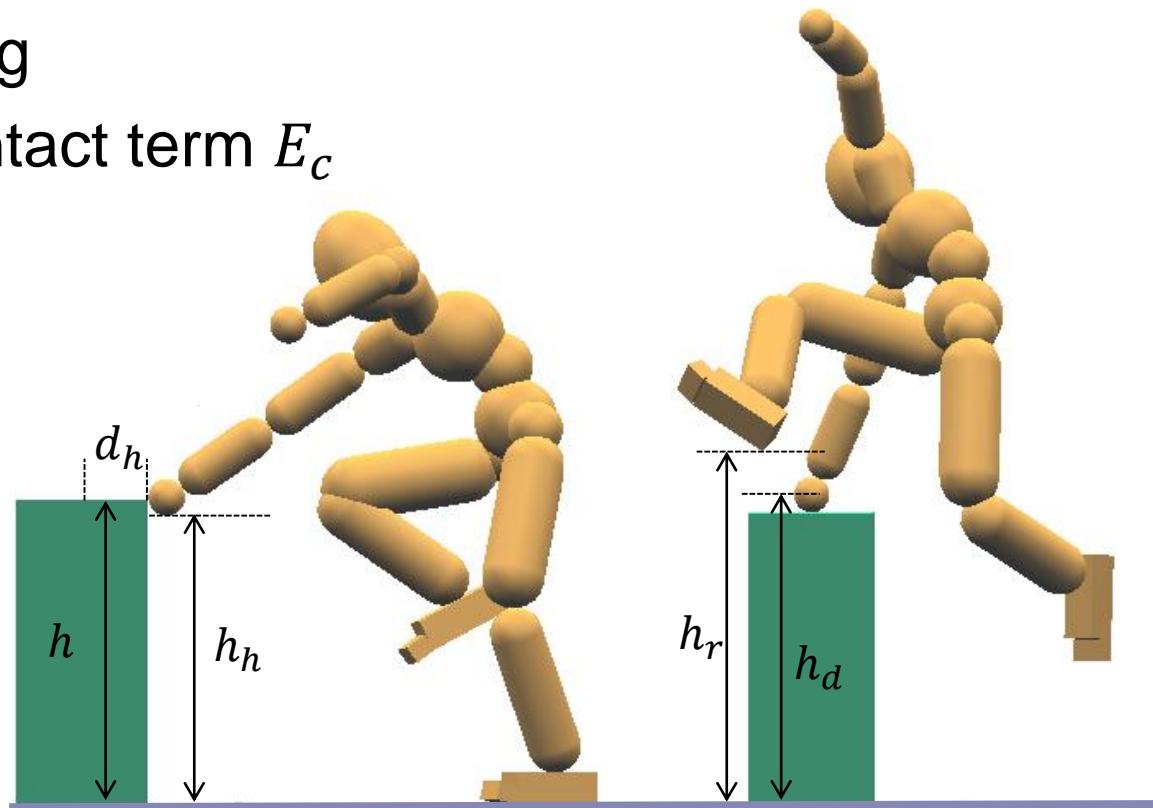
- Jumping
  - Contact term  $E_c$



## Stage 2: Parameterization

# Obstacle Clearing Maneuvers

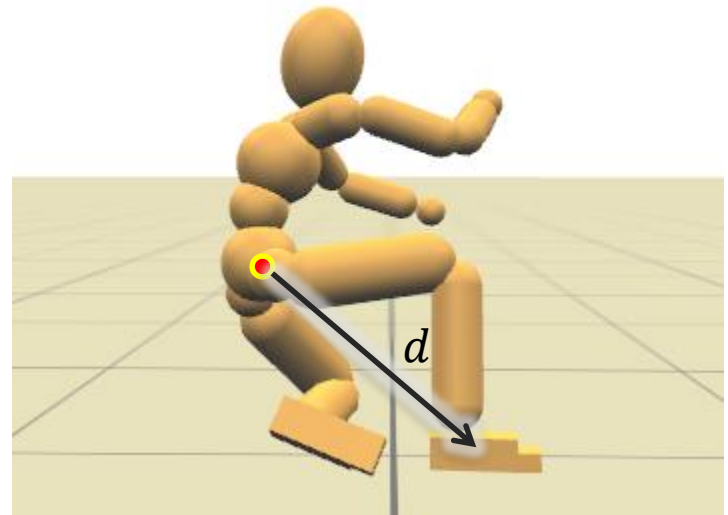
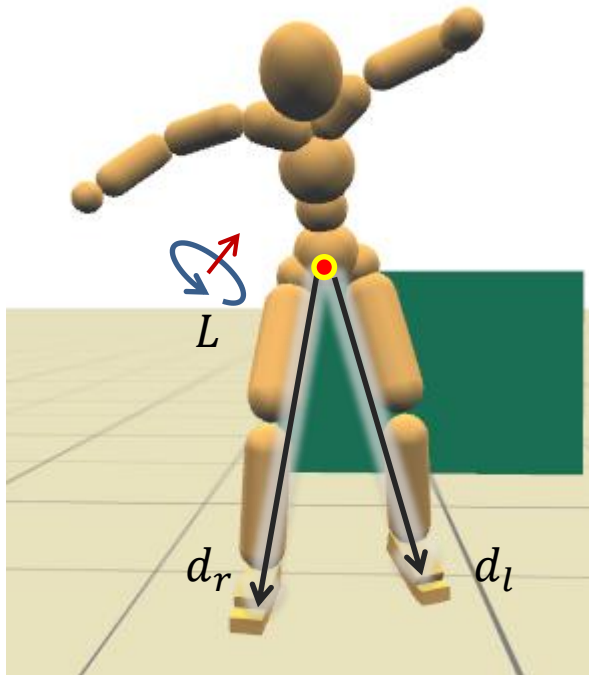
- Vaulting
  - Contact term  $E_c$



## Stage 2: Parameterization

# Obstacle Clearing Maneuvers

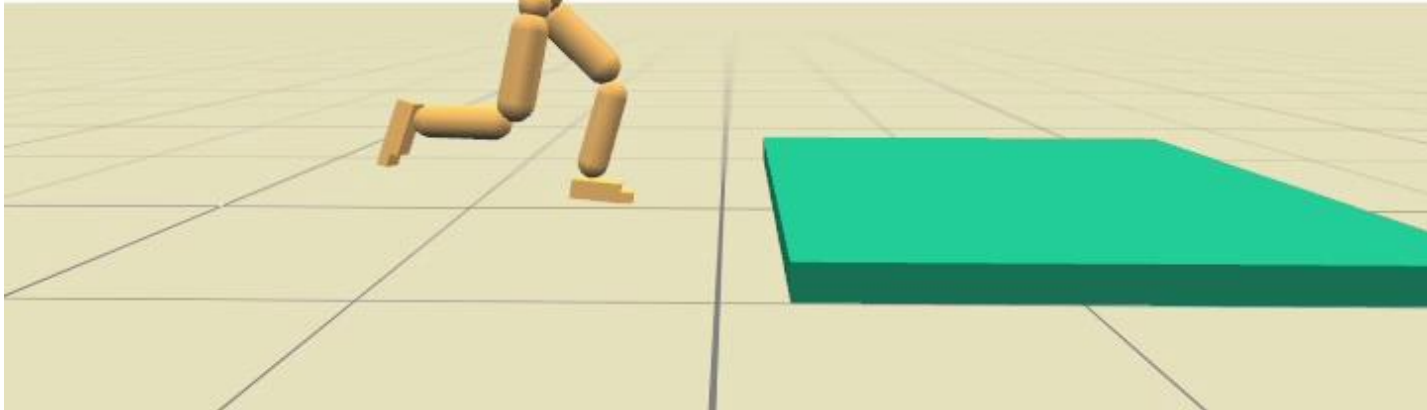
- Drop-rolling
  - Balance term  $E_b$



## Stage 2: Parameterization

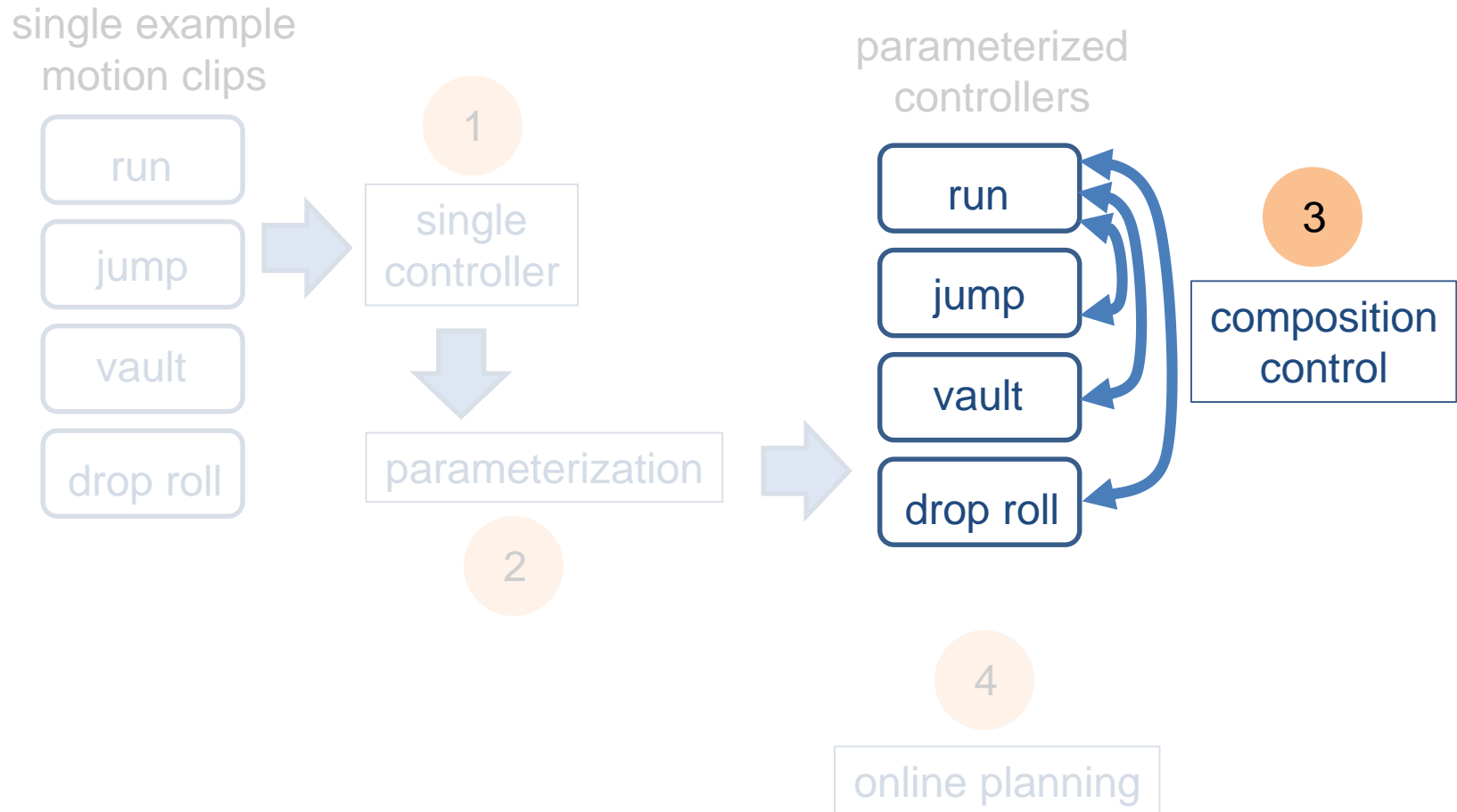
# Obstacle Clearing Results

Jump - 10cm



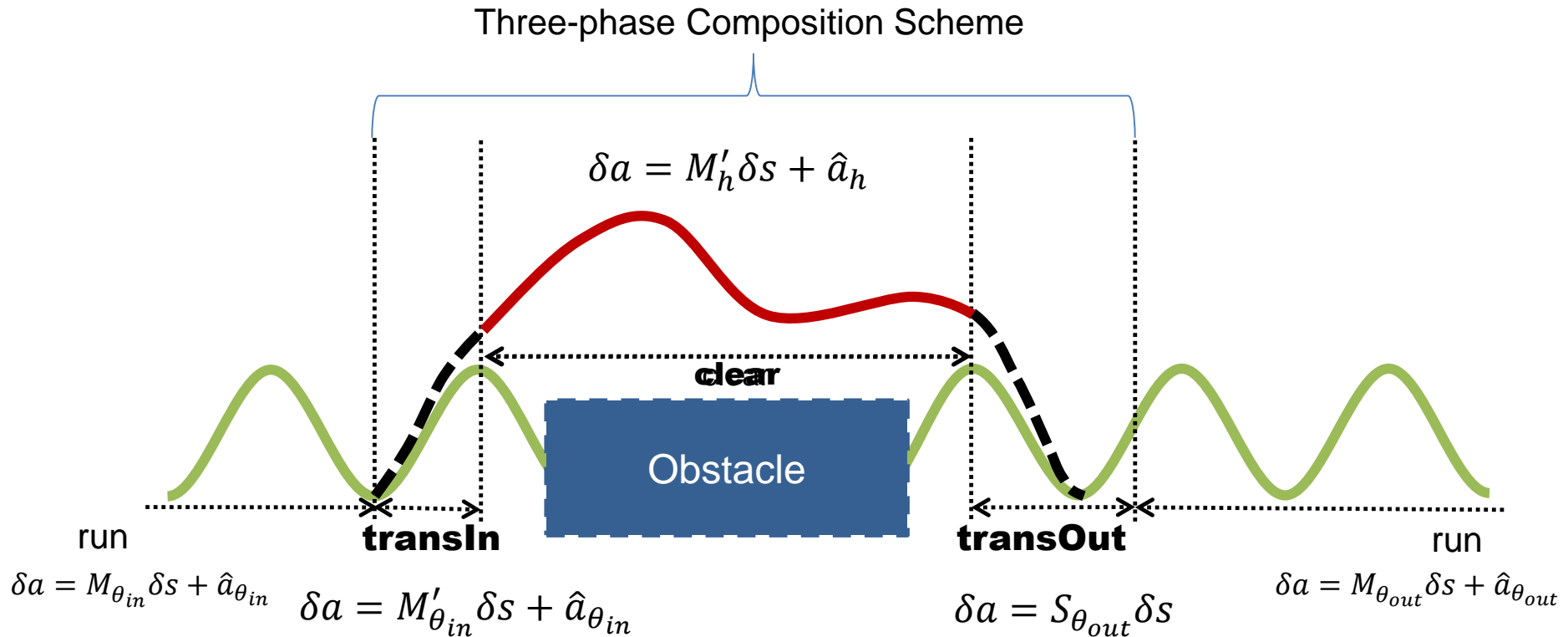


# System Overview



## Stage 3: Composition

# Three-phase Composition Scheme

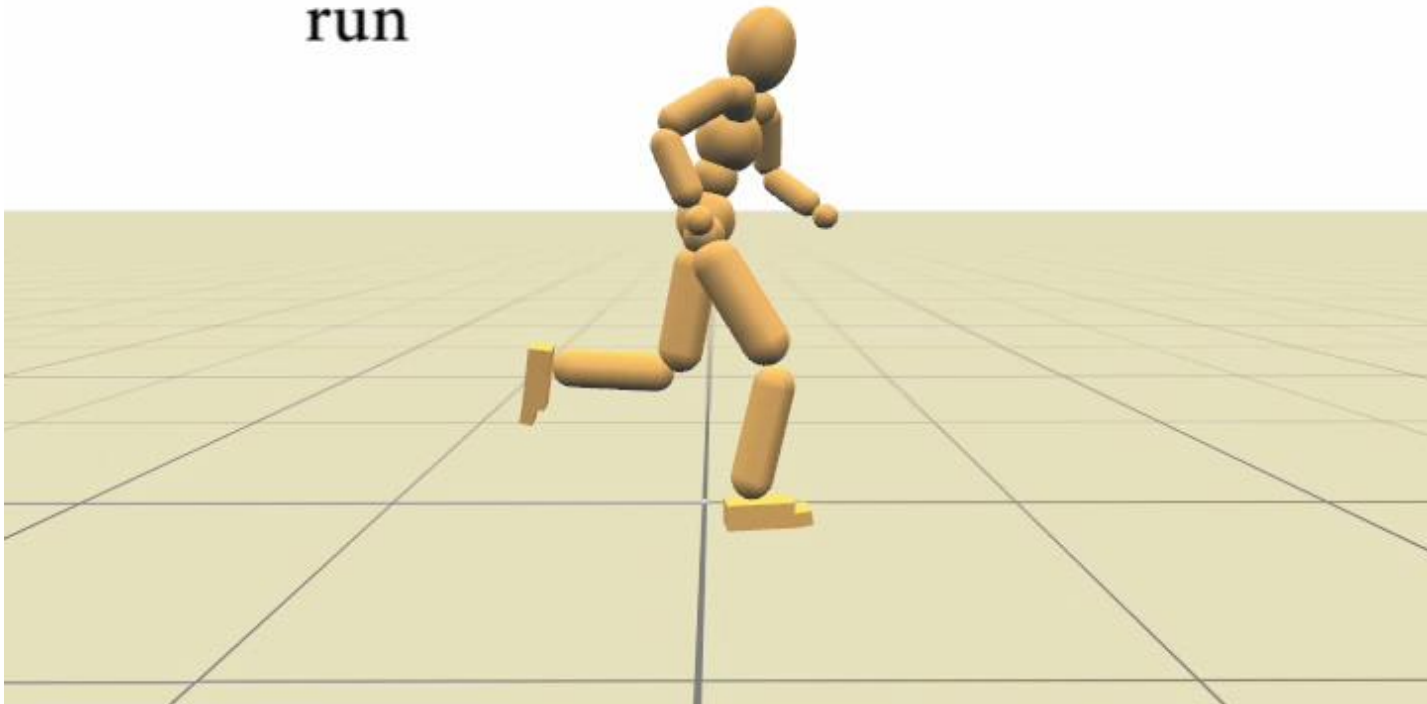


## Stage 3: Composition

# Three-phase Composition Scheme

Three-phase Composition Scheme

run

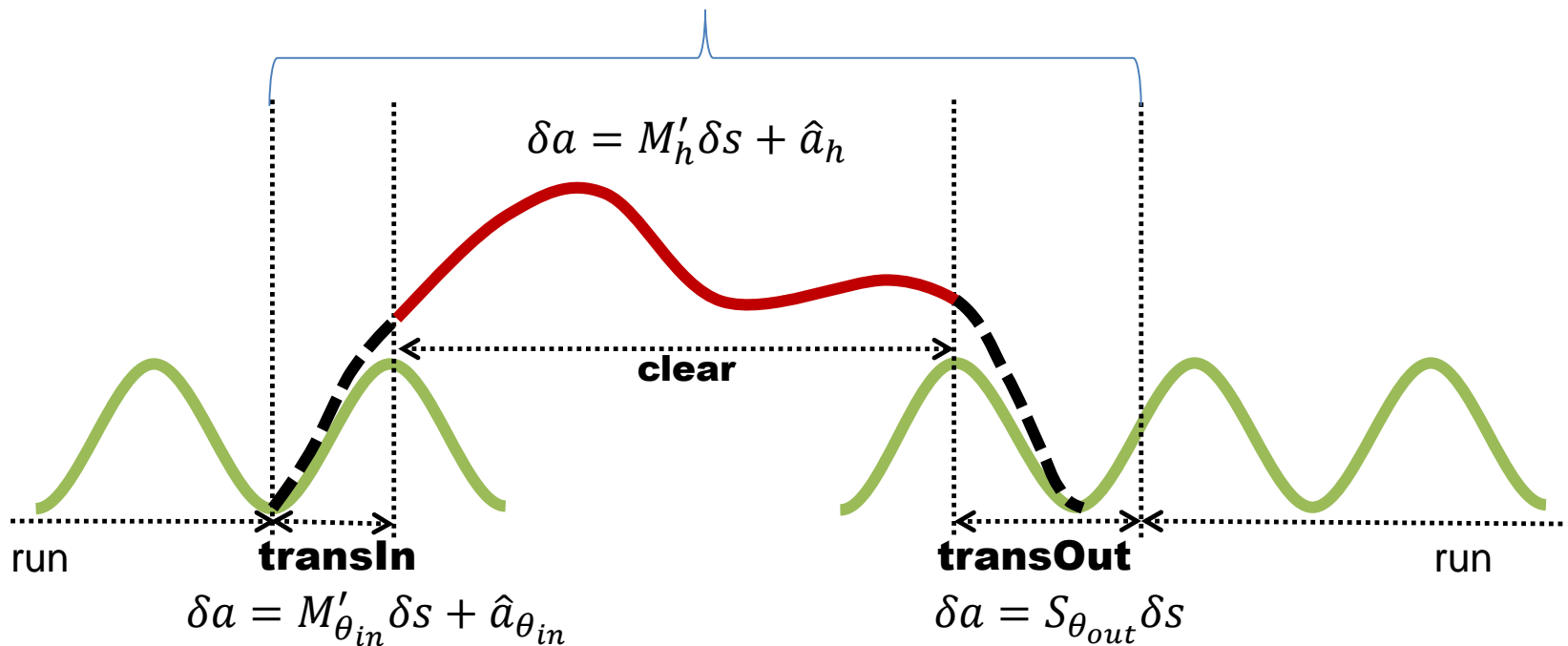


# Stage 3: Composition Optimization

- Parameters

- $$- \{ \theta_{in}, M'_{\theta_{in}}, M'_h, S_{\theta_{out}} \}$$

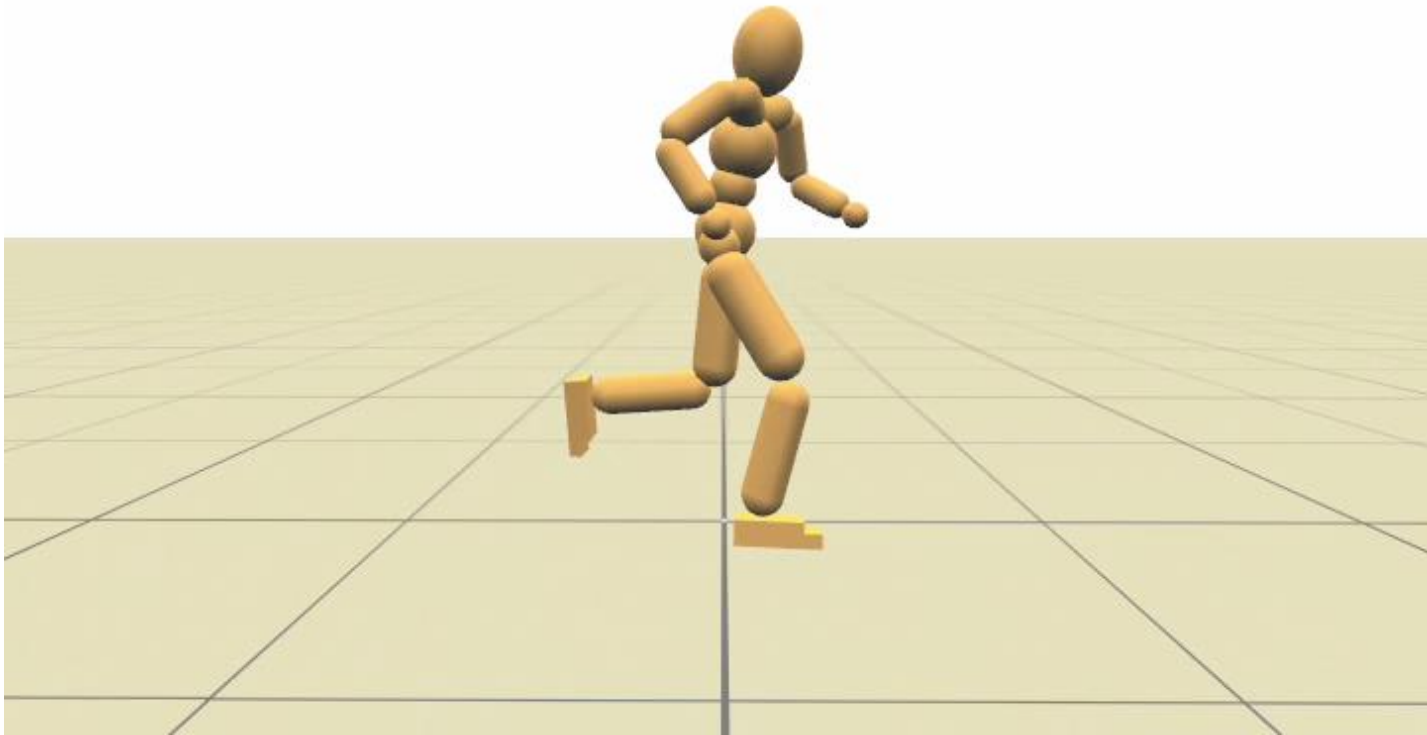
Three-phase Composition Scheme



## Stage 3: Composition

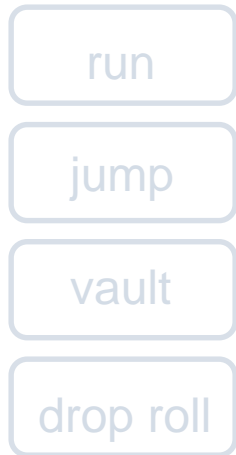
# Results

Jump - 30cm



# System Overview

single example motion clips



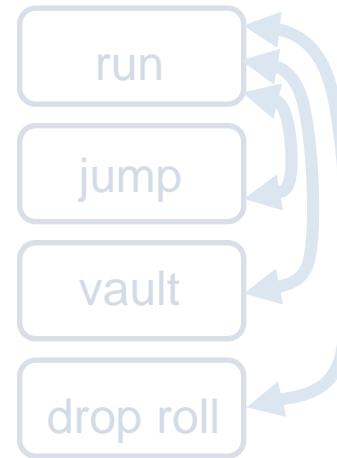
1



2



parameterized controllers



3

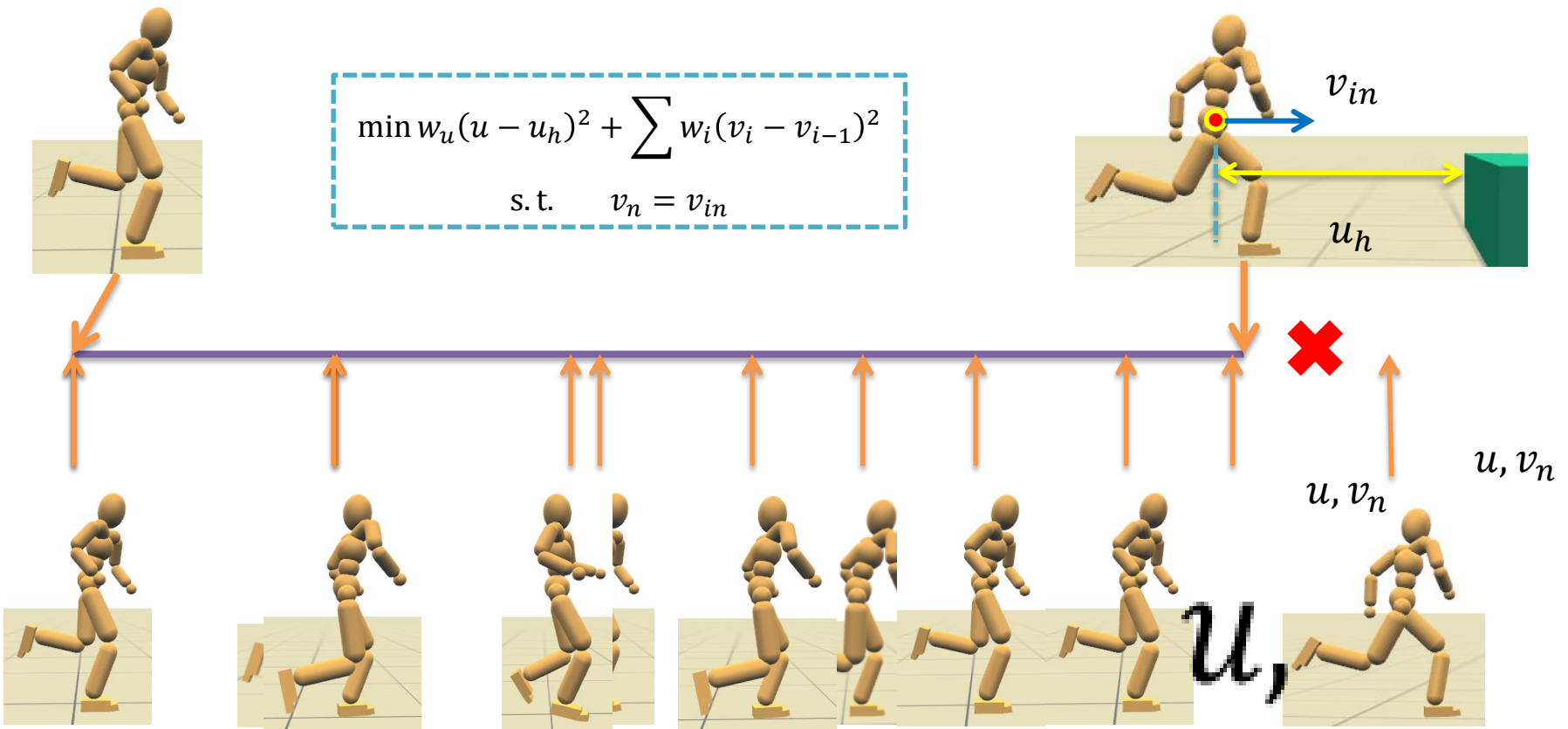


4

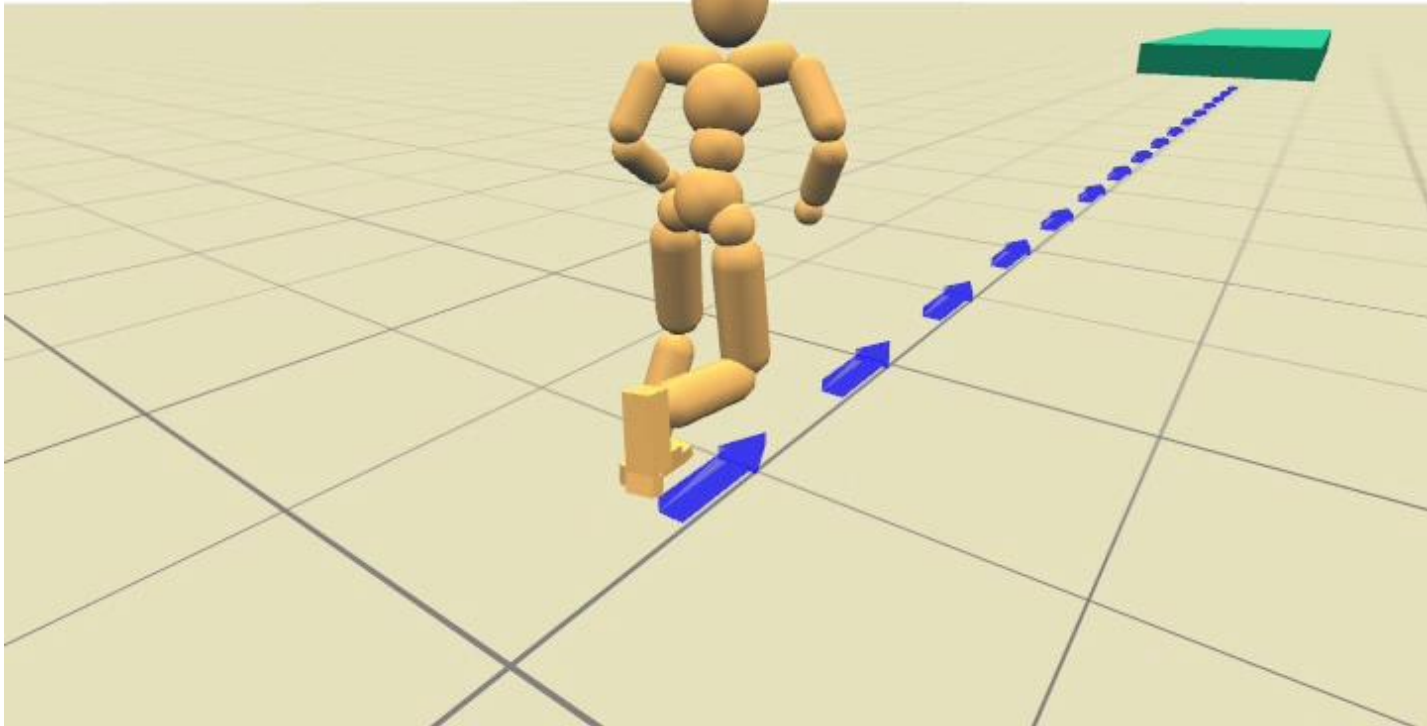


# Stage 4: Online Planning

- Step-based kinematic planning



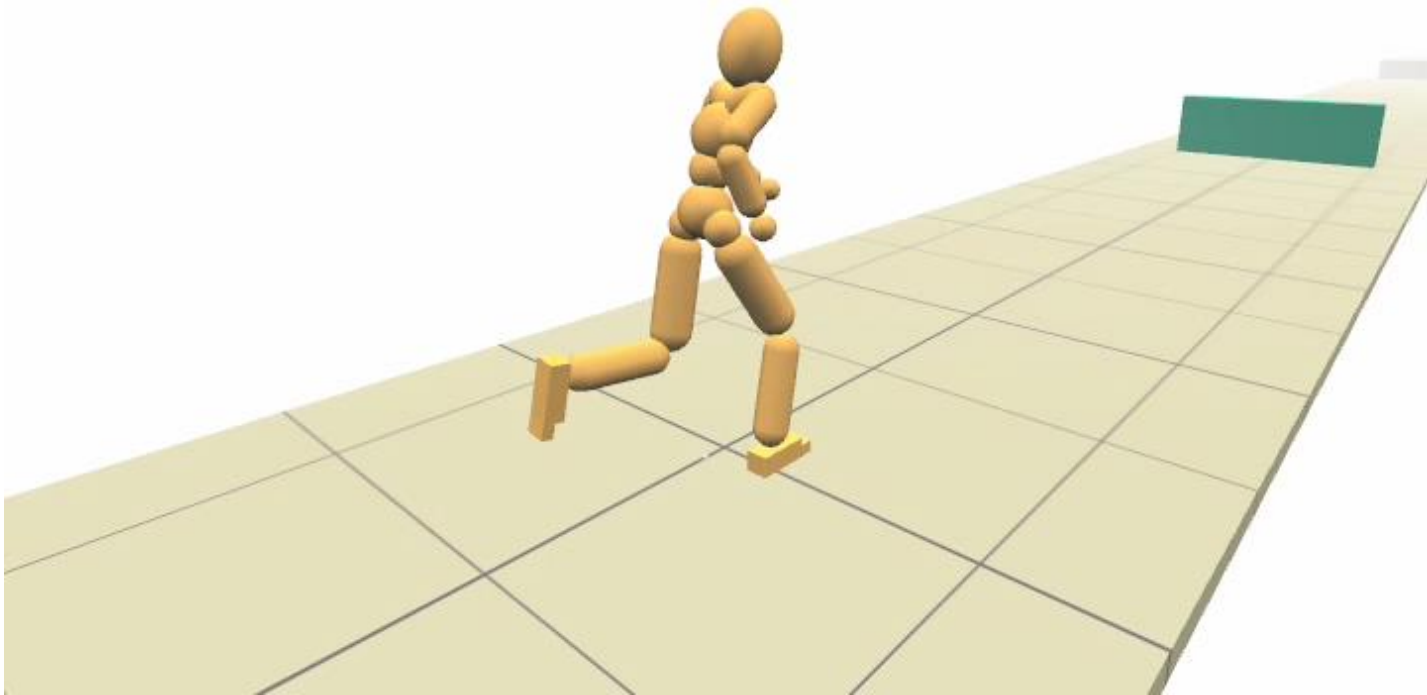
# Stage 4: Planning Results





Results

# Terrain Running



# Conclusion

- Parkour-style motions
  - Running, jumping, vaulting, drop-rolling
- Complete framework, Realtime synthesis
  - Control construction, parameterization, composition, planning
- Structured optimization scheme

# Limitations

- Only partly automated
- Composition can fail
- No arbitrary transitions

# Future Work



[*Parkour Memories*, uploaded by 3runTube  
<http://www.youtube.com/watch?v=24cgnAA6x0I&hd=1>]

# Thanks

