

# Backgrounds

- Robust locomotion control depends on accurate state estimations.
- The sensors of most legged robots can only provide partial and noisy observations.
- Previous two stage pipeline inevitably introduce information loss and may suffer from the noise brought by domain randomization.

#### Motivation

- Environmental properties can be **considered as** disturbances.
- Internal Model Control suggests that we can do robust control without directly **modeling the disturbances**.



# Hybrid Internal Model: Learning Agile Legged Locomotion with Simulated Robot Response Junfeng Long<sup>1,\*</sup>, Zirui Wang<sup>1,2,\*</sup>, Quanyi Li<sup>1</sup>, Jiawei Gao<sup>1,3</sup>, Liu Cao<sup>1,3</sup>, Jiangmiao Pang<sup>1,†</sup> <sup>1</sup>OpenRobot Lab, Shanghai AI Laboratory, <sup>2</sup>Zhejiang University, <sup>3</sup>Tsinghua University





### Construction of Robot Response:

Explicitly, we wish the robot to track a target velocity command, however, we also wish the robot to keep stable, which is implicit. Therefore, the robot's response also compose the real velocity and a variable indicating stability and dynamics.

### Auxiliary Task:

Estimating the real velocity of the robot and estimate the variable indicating stability and dynamics.

### **Contrastive Learning:**

- Supervision from both positive and negative samples -> higher efficiency
- Fuzzier representation compared with regression and reconstruction -> easier to adapt to real world
- Less sensitive to noise -> less influenced by human-designed noise and domain randomization

Experimental Re					
• Real robot experim					
Benchmarks	Enviro	onme			
Stairs	Short (A	-rang (1)			
	Long (Ali	-rang engo			
Unseen Terrains	Compo Terrain	ositio (Alie			
	Defor Slope	rmab e (A1			
Anti- disturbance	Drag Obstac	gging cle (A			
	Vertie (A	cal H A1)			
	Pay (A	vload 1)			
	Missir (Ali	ng ste engo			
(a)	) Stairs				
	alization rerrain Rough	ON C Type Stairs Slope Slope Discrete			
(a) Ours Contact:					
lunfong Long (jung					
7irui Wang (ziseoi					
liangmian Dang (n					
Draiget Mabrid					



# lesults:

#### nents

nts	Metrics	Ours	RMA	MoB	Built-in MPC
ge	Success rate (%)	100	60	0	0
ge )	Number of stairs	176.5±7.81	75.35±19.98	0.0±0.0	0.0±0.0
onal engo)	Success rate (%)	85	45	0	0
ole 1)	Success rate (%)	55	10	0	0
g A1)	Maximum weight (Kg)	10	10	7	3
lit	Maximum weight (Kg)	8	7.5	7	5
	Maximum weight (Kg)	8	7	4	7
eps	Success rate	100	0	0	0







(b) Unseen terrains





(c) Anti-disturbance

• Ablations of number of prototypes



(b) Regression (Nahrendra et al., 2023

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