# 딥러닝으로 드래곤 길들이기

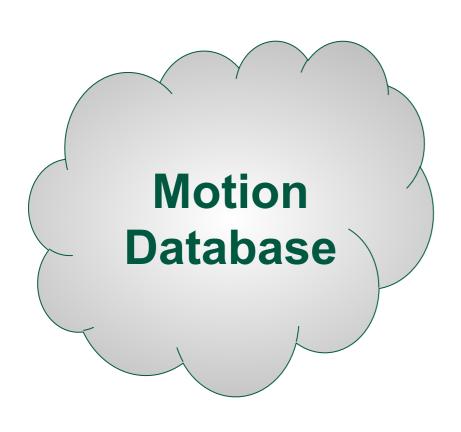
이제희 서울대학교 컴퓨터공학부

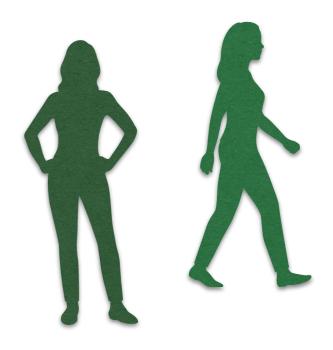


# **Motion Capture**



### **Data-Driven Animation**

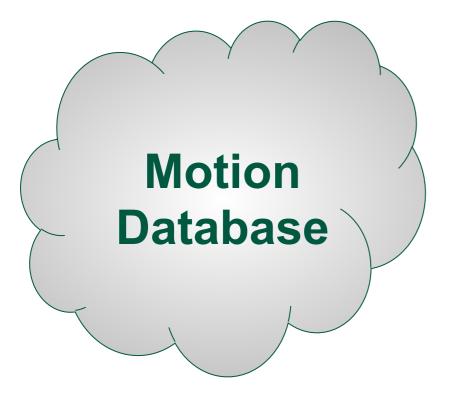




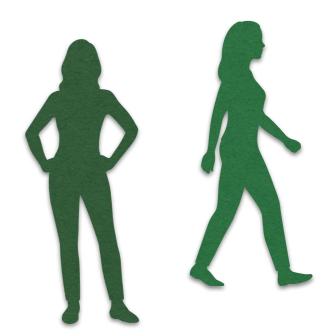
### **Data-Driven Animation**

### **Degree of User Intervention**

Unsupervised Minimally-supervised Supervised



Data Size small to very large



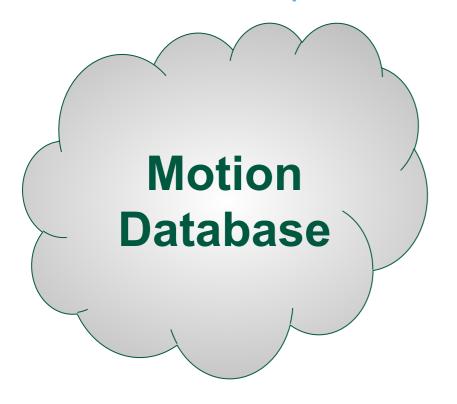
### **Model Complexity**

Sticks and joints
3D animated character
Musculoskeleton

### Data-Driven Animation

### **Degree of User Intervention**

Unsupervised Minimally-supervised Supervised



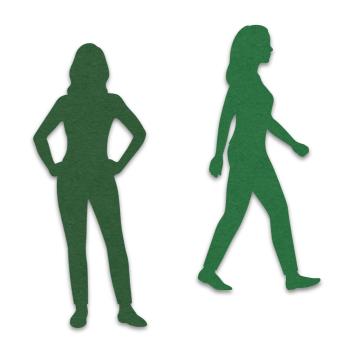
Data Size small to very large











### **Model Complexity**

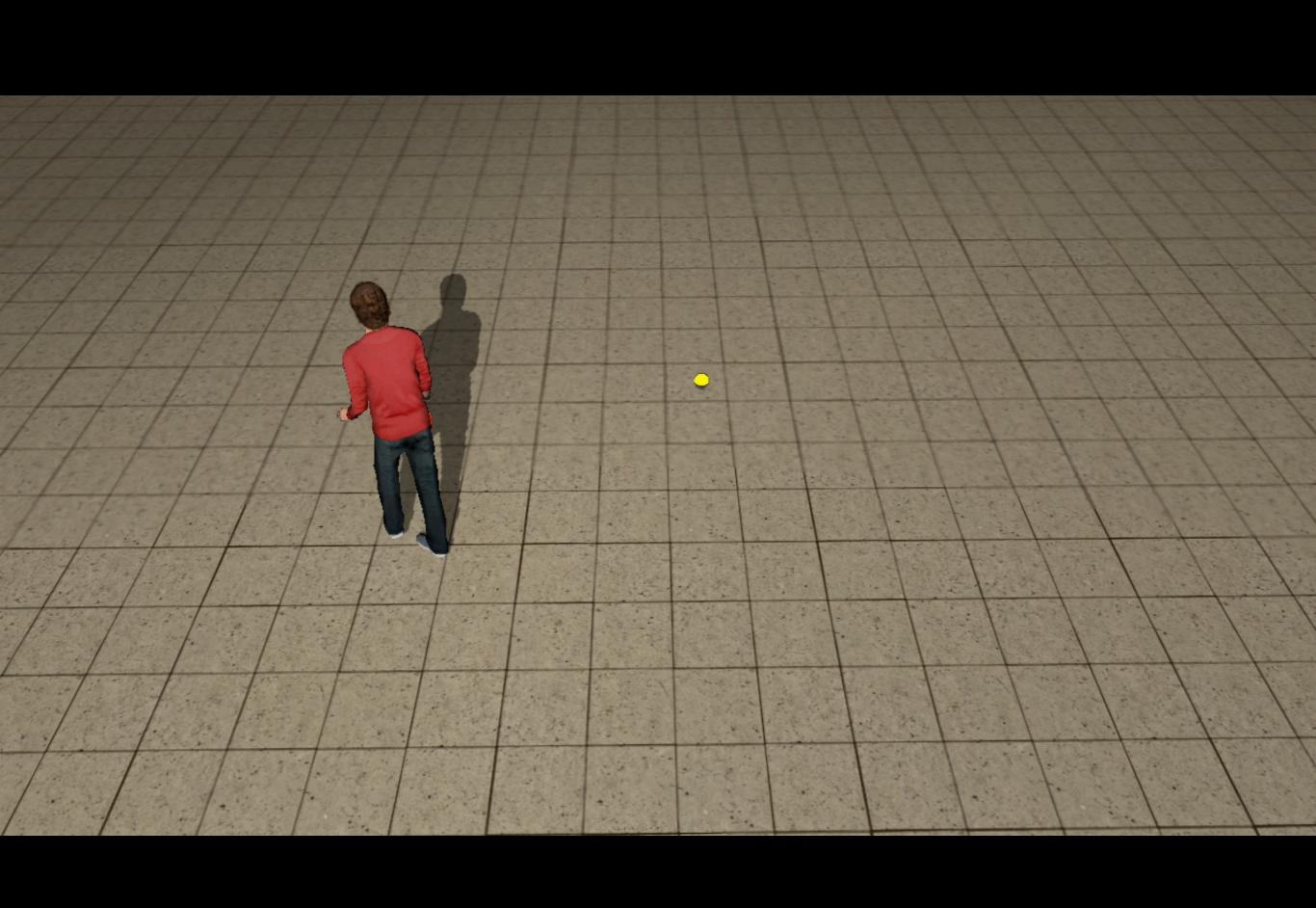
Sticks and joints
3D animated character
Musculoskeleton

**Syntax and Semantics** 

# Interactive Character Animation by Learning Multi-Objective Control



Kyungho Lee, Seyoung Lee and Jehee Lee (ACM Transactions on Graphics 2018, SIGGRAPH Asia 2018)



# Why Deep Learning?

### **Fast at runtime**

Specialized chips will be available to all platforms soon

### **Compact in memory**

We don't have to keep motion data Everything goes into layers of networks

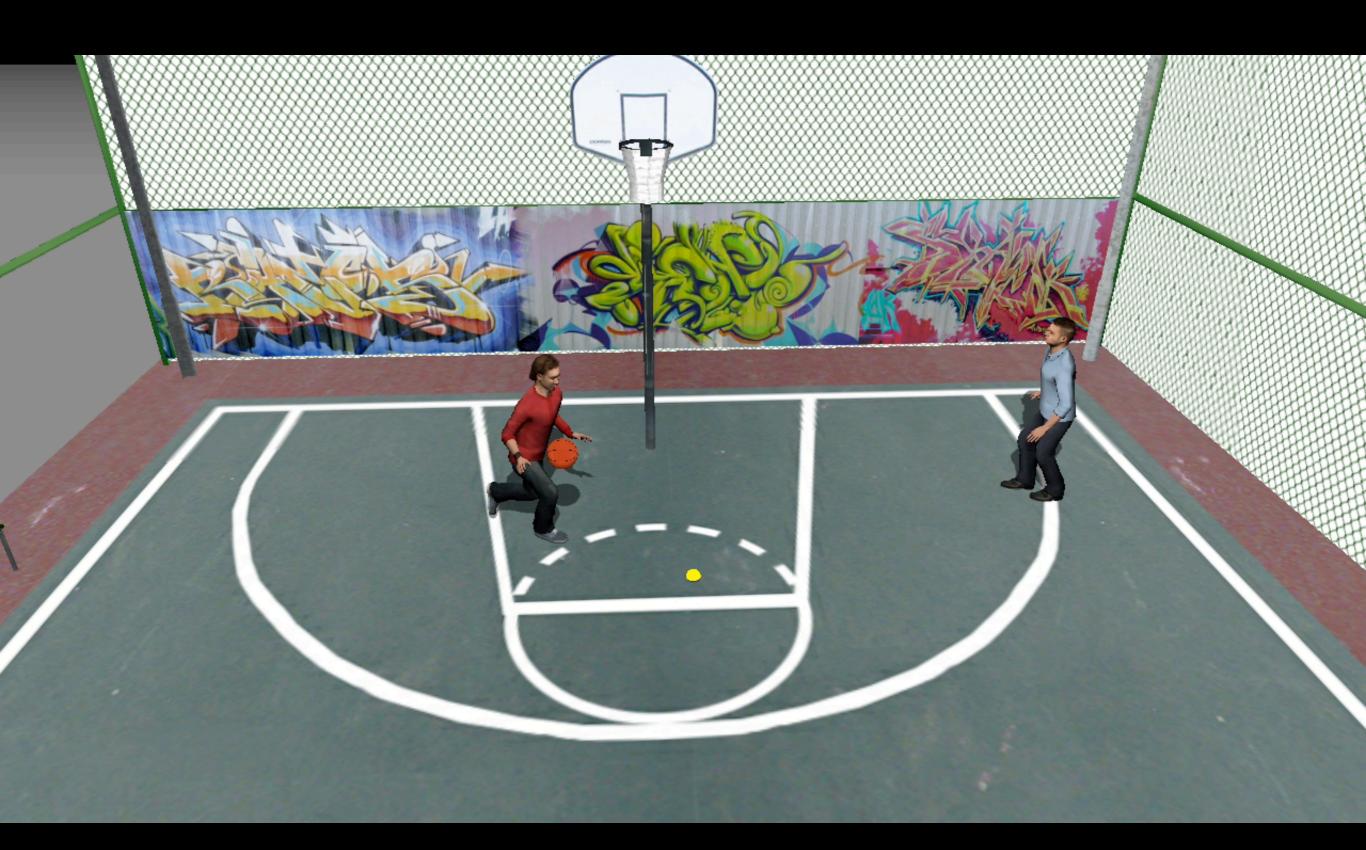
### Easy to build

Learning process is largely automated

### Interactive control

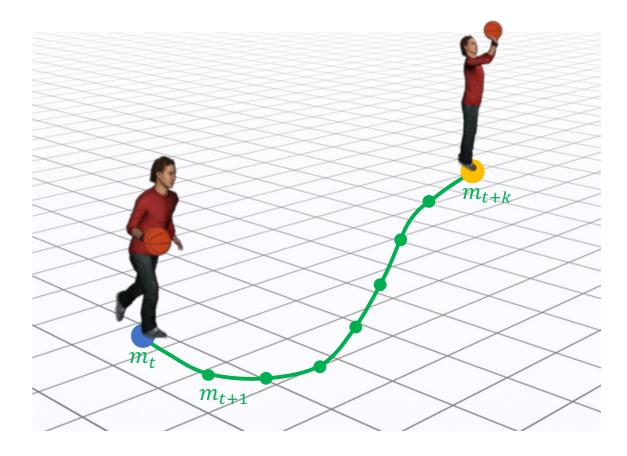
We still want to have direct control over the character's motion

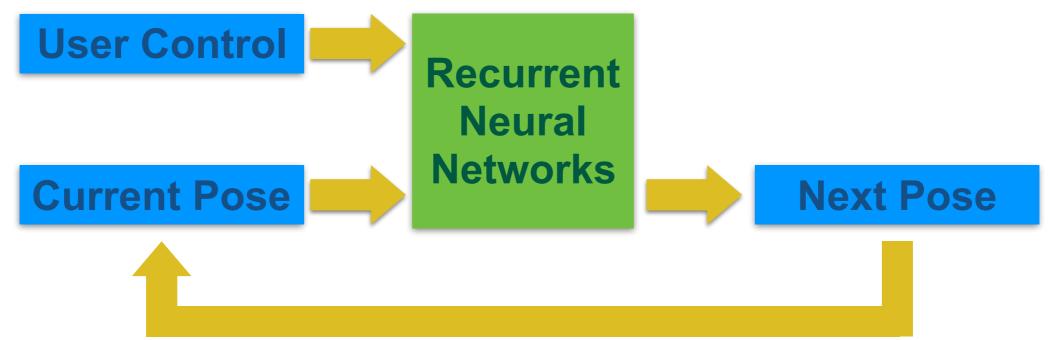
# Motion Capture Data



### **RNN for Interactive Character Control**

Target position, direction, velocity, ...





# **Issues in Motion Learning**

### Multiple actions in the data set

Dribble, shoot, pass, catch, pivot, run, ...

### Size of motion data

We can never have enough data for deep learning

### Segmentation and labeling

labor-intensive and time consuming

# Multi-Objective Control

### Learn Multiple actions simultaneously

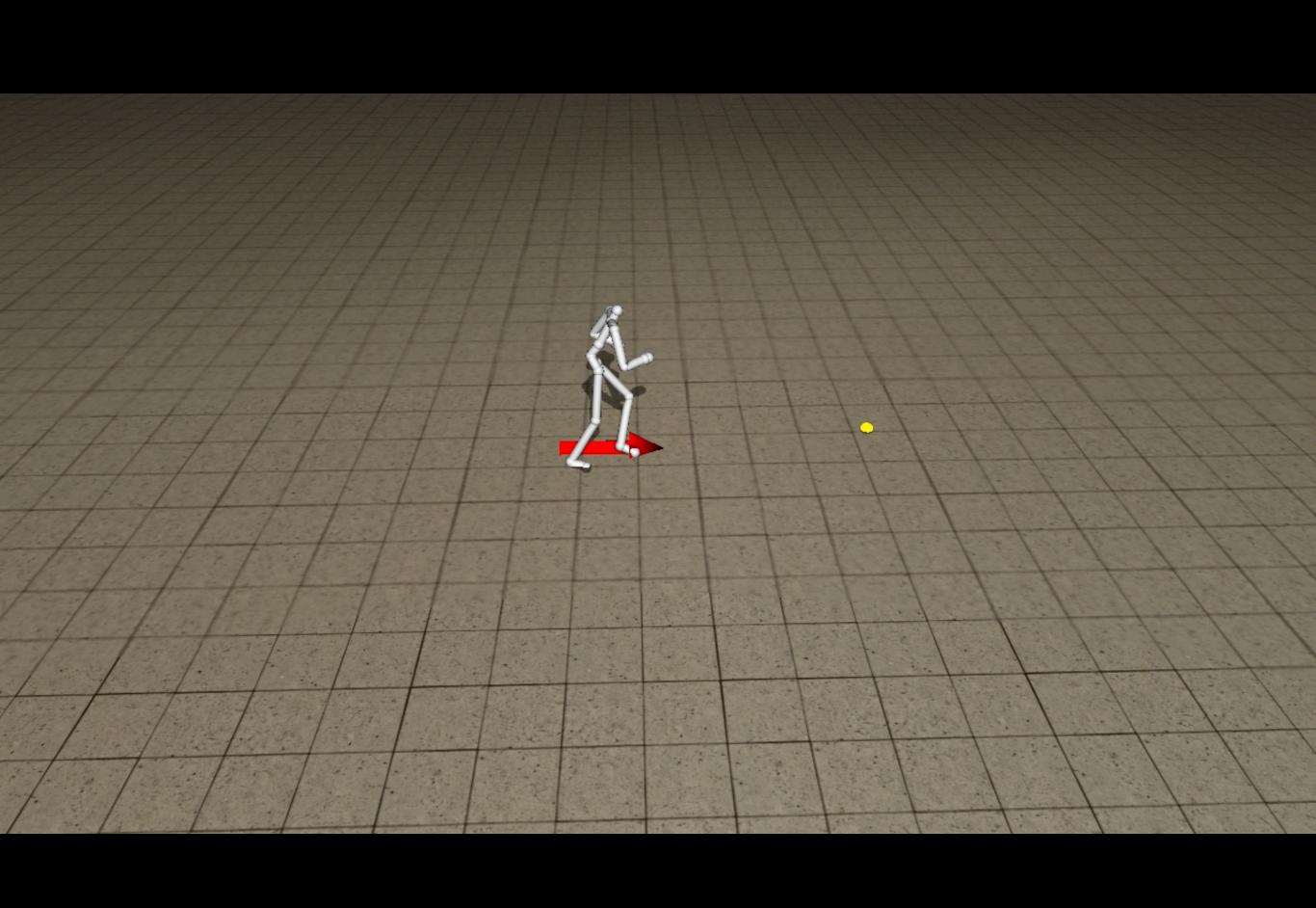
Each action may have a different set of control parameters

### **Automatic data augmentation**

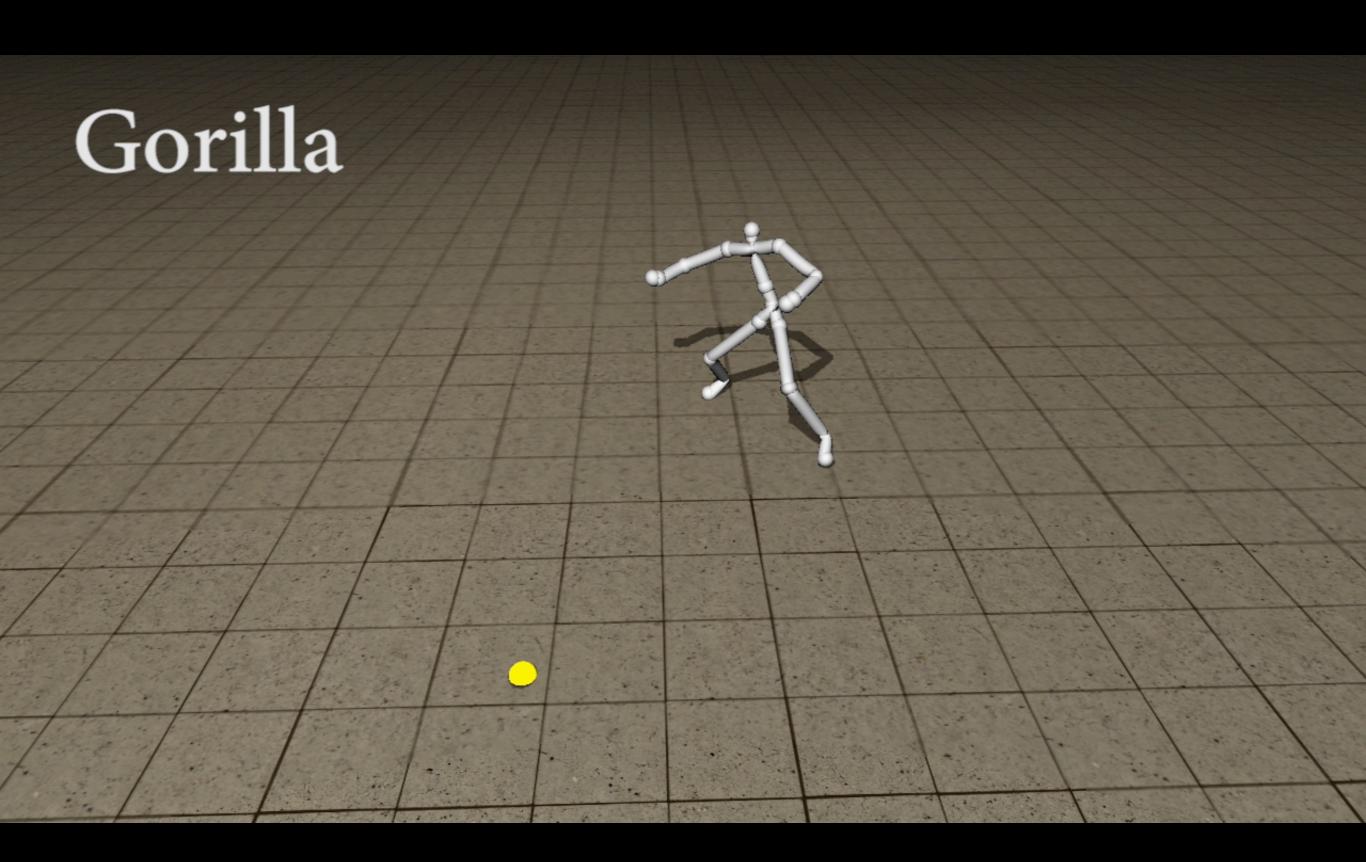
Enhance variabilities in combinatorial and spatiotemporal domains From very small (10 to 20 sec) to medium (20 min)

### Minimal user intervention

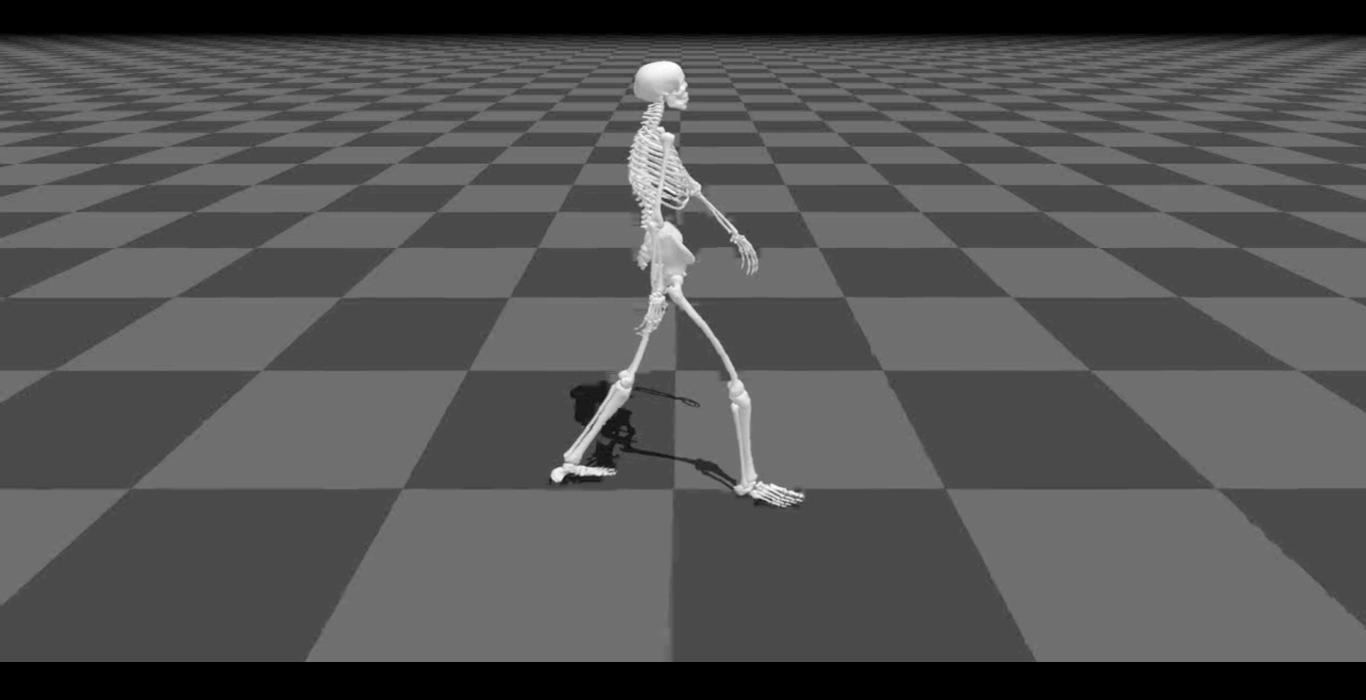
No segmentation, minimal labeling Need more work to design syntactic and semantic rules





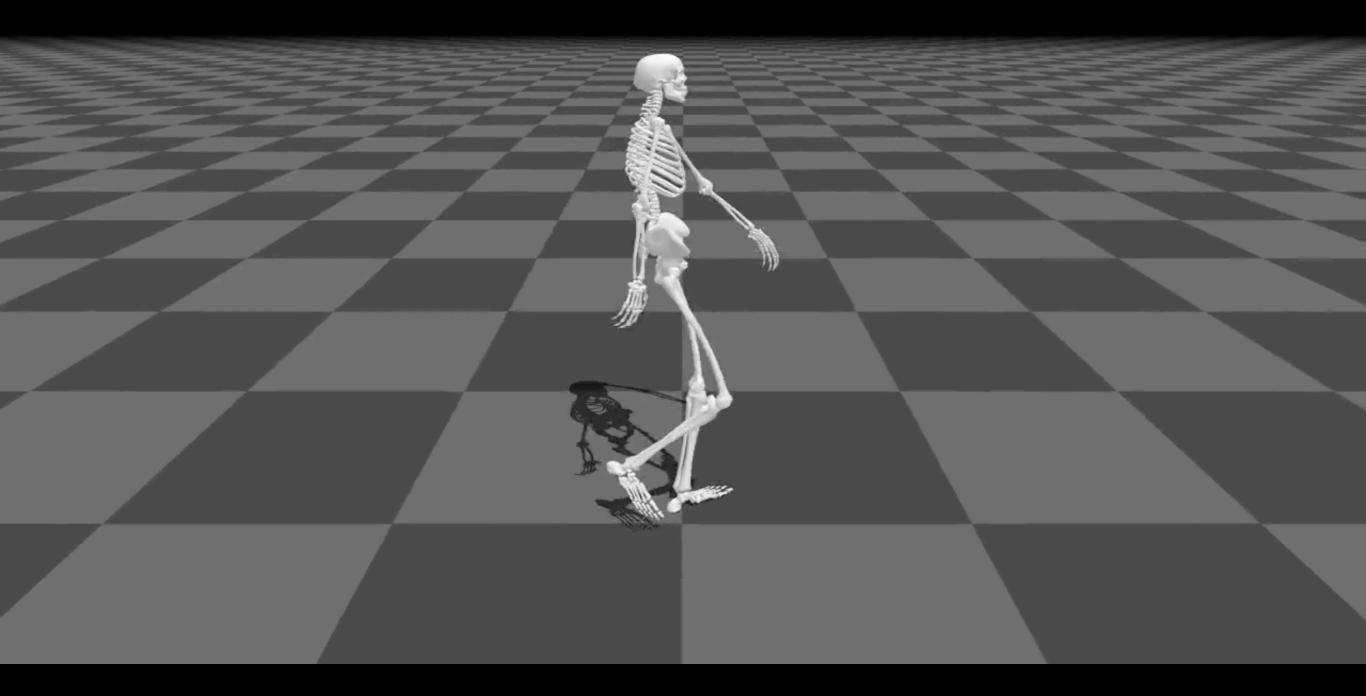


### **Physically Simulated**



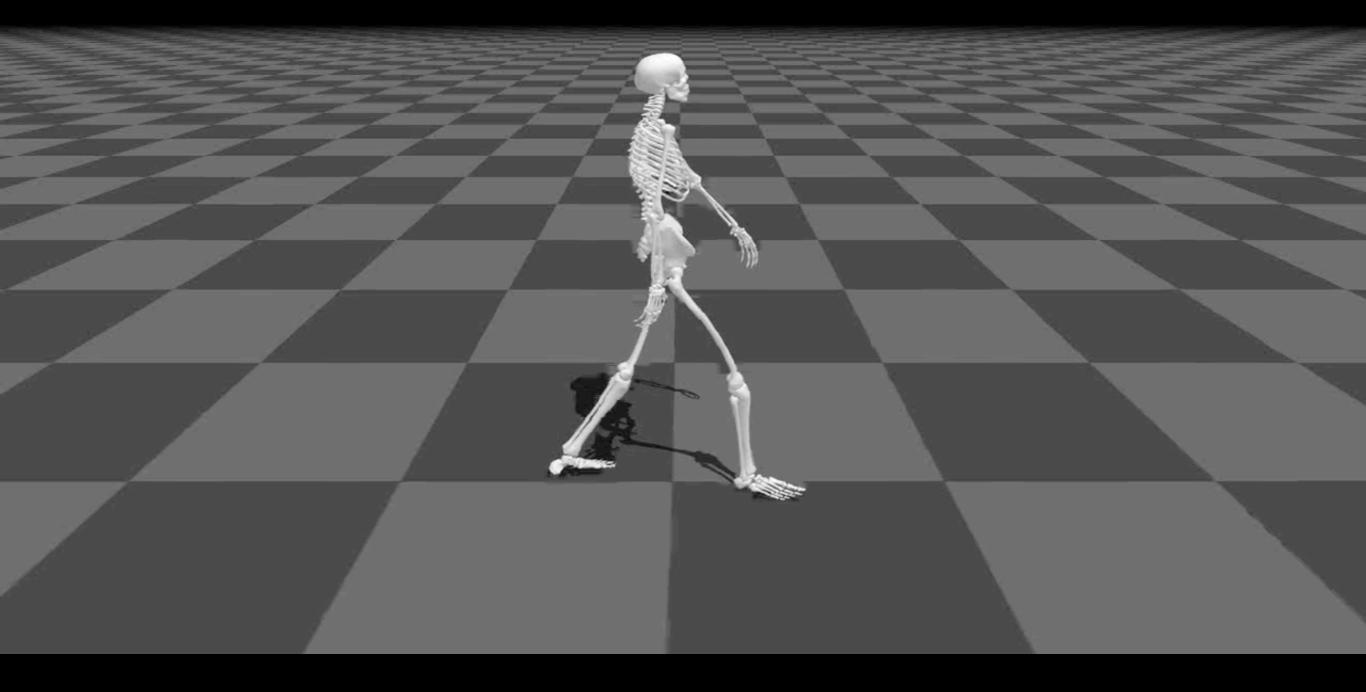
[SIGGRAPH 2010] Lee et al, Data-driven biped control

### with Tracking Control Only

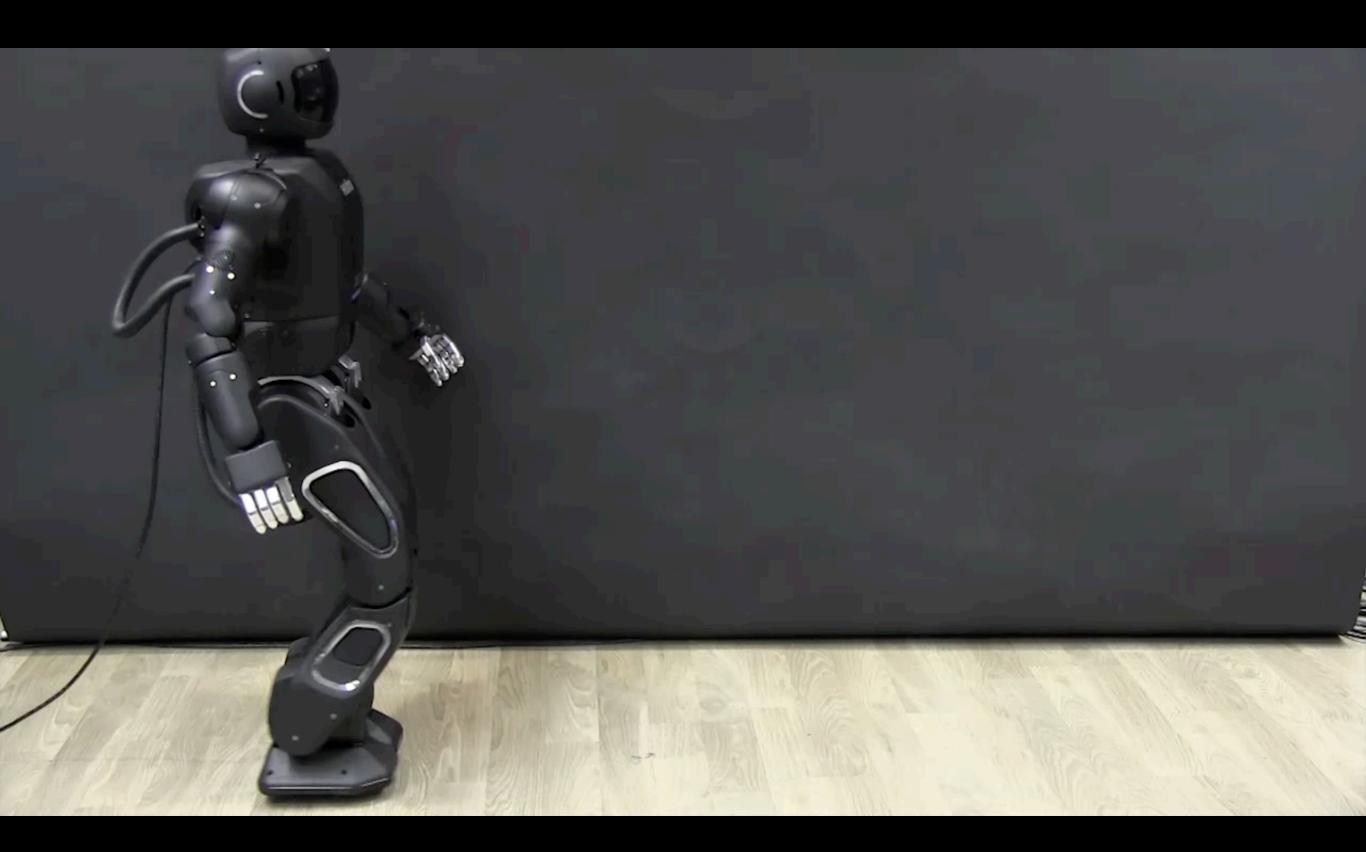


[SIGGRAPH 2010] Lee et al, Data-driven biped control

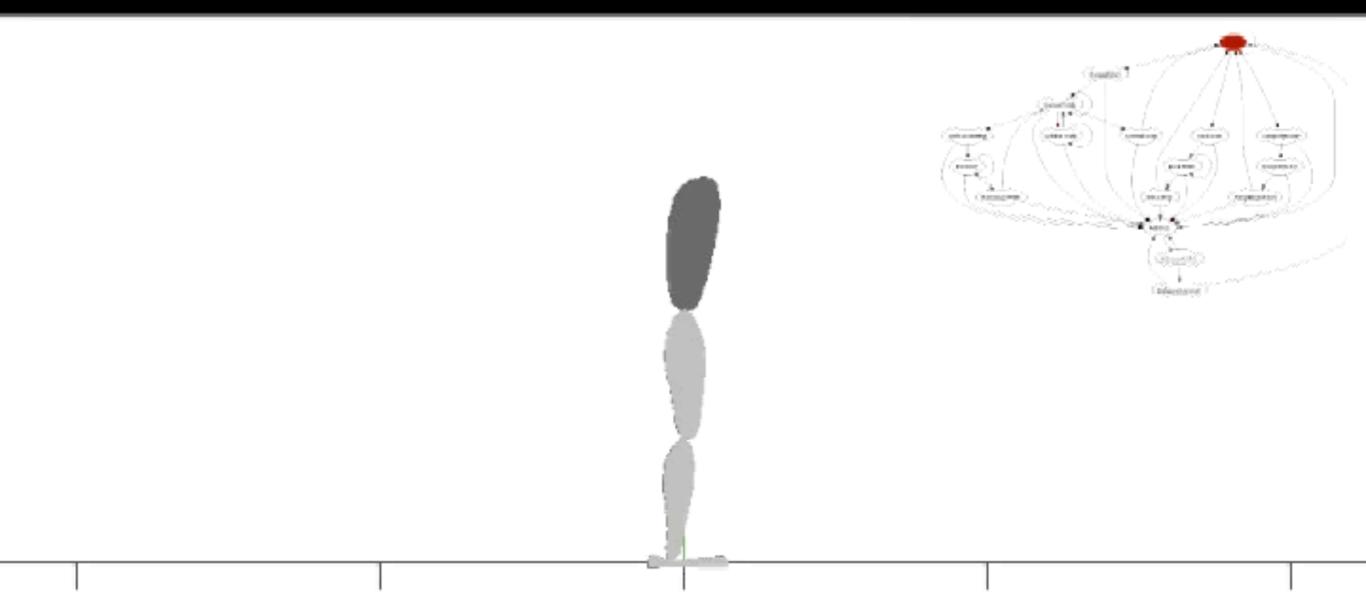
### **Physically Simulated**



[SIGGRAPH 2010] Lee et al, Data-driven biped control

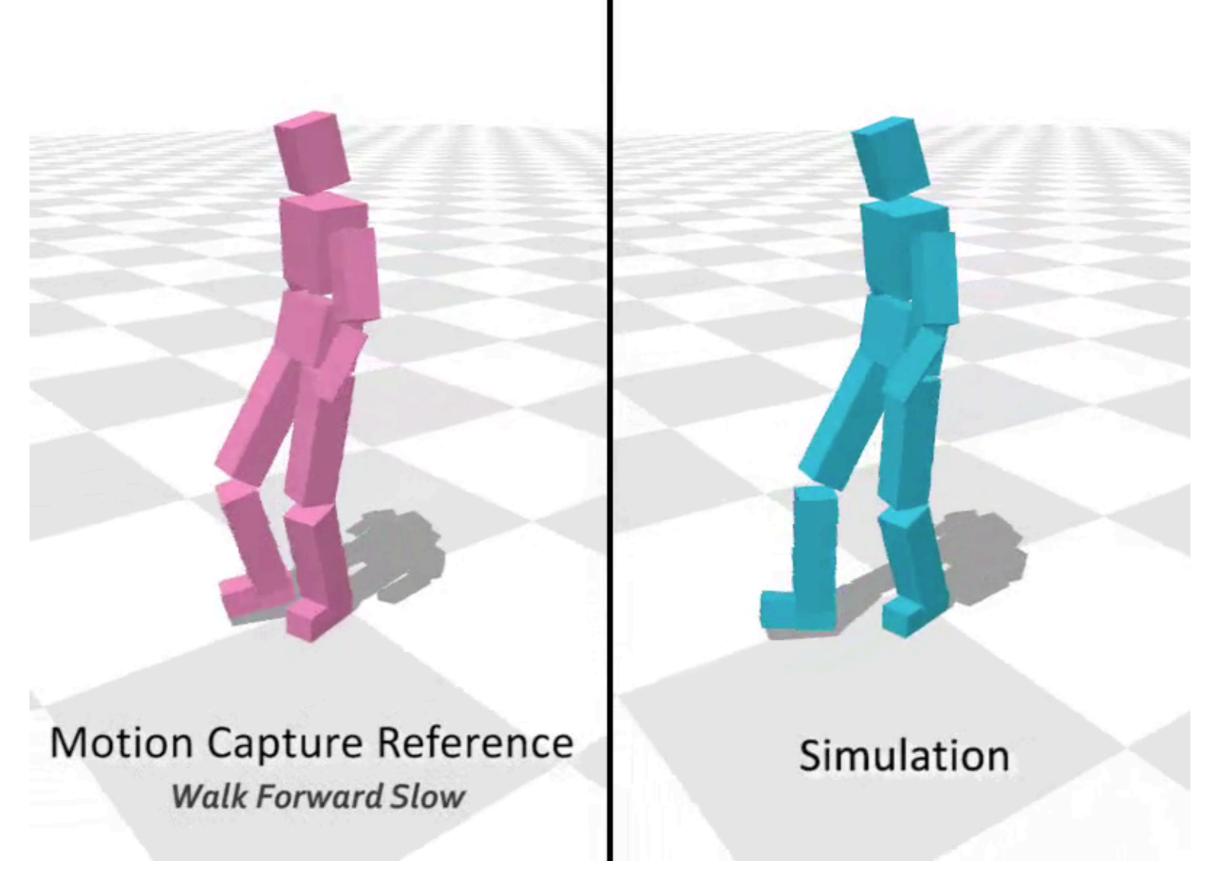


Hubo 2013

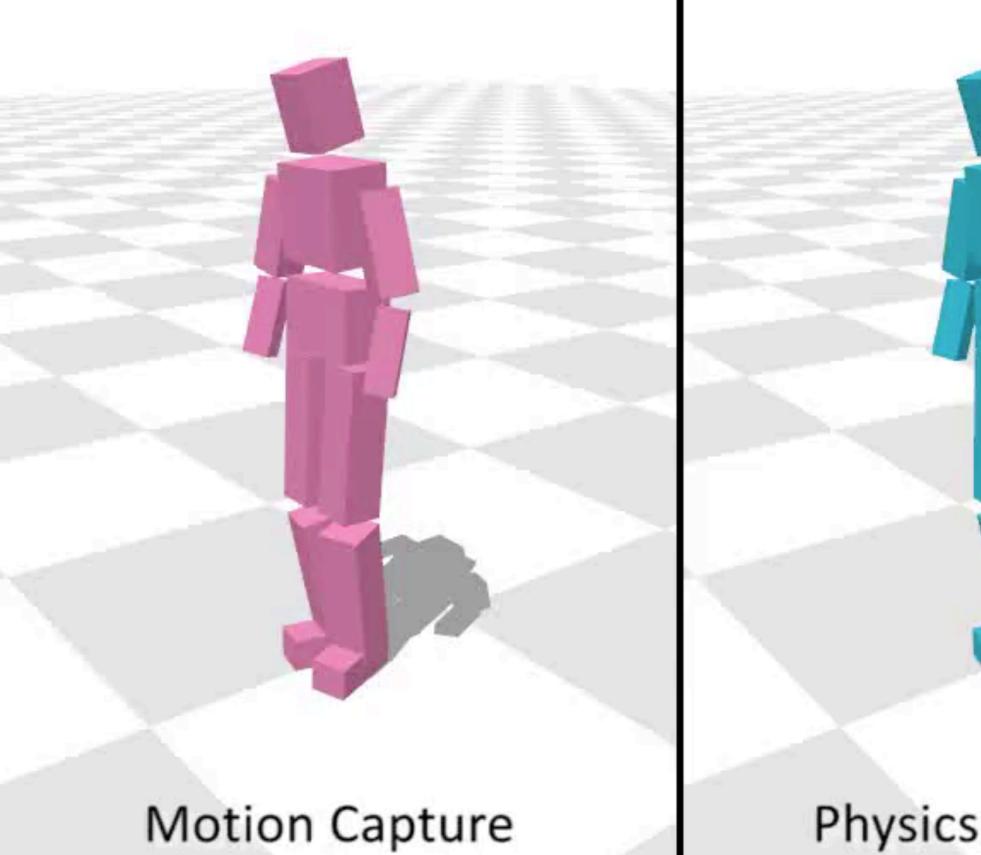


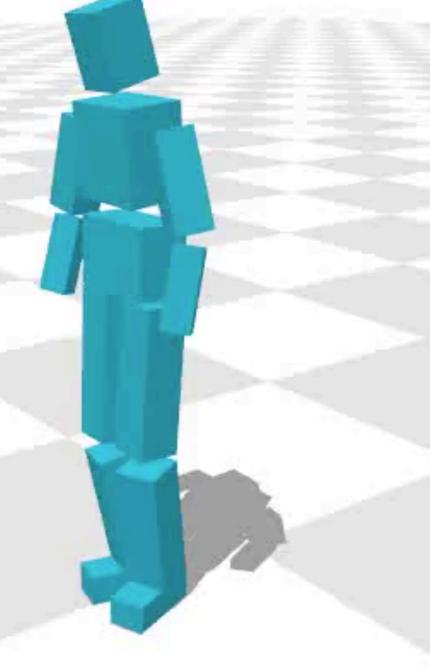
# Stand

[SIGGRAPH 2007] Sok et al, Simulating Biped Behaviors from Human Motion Data

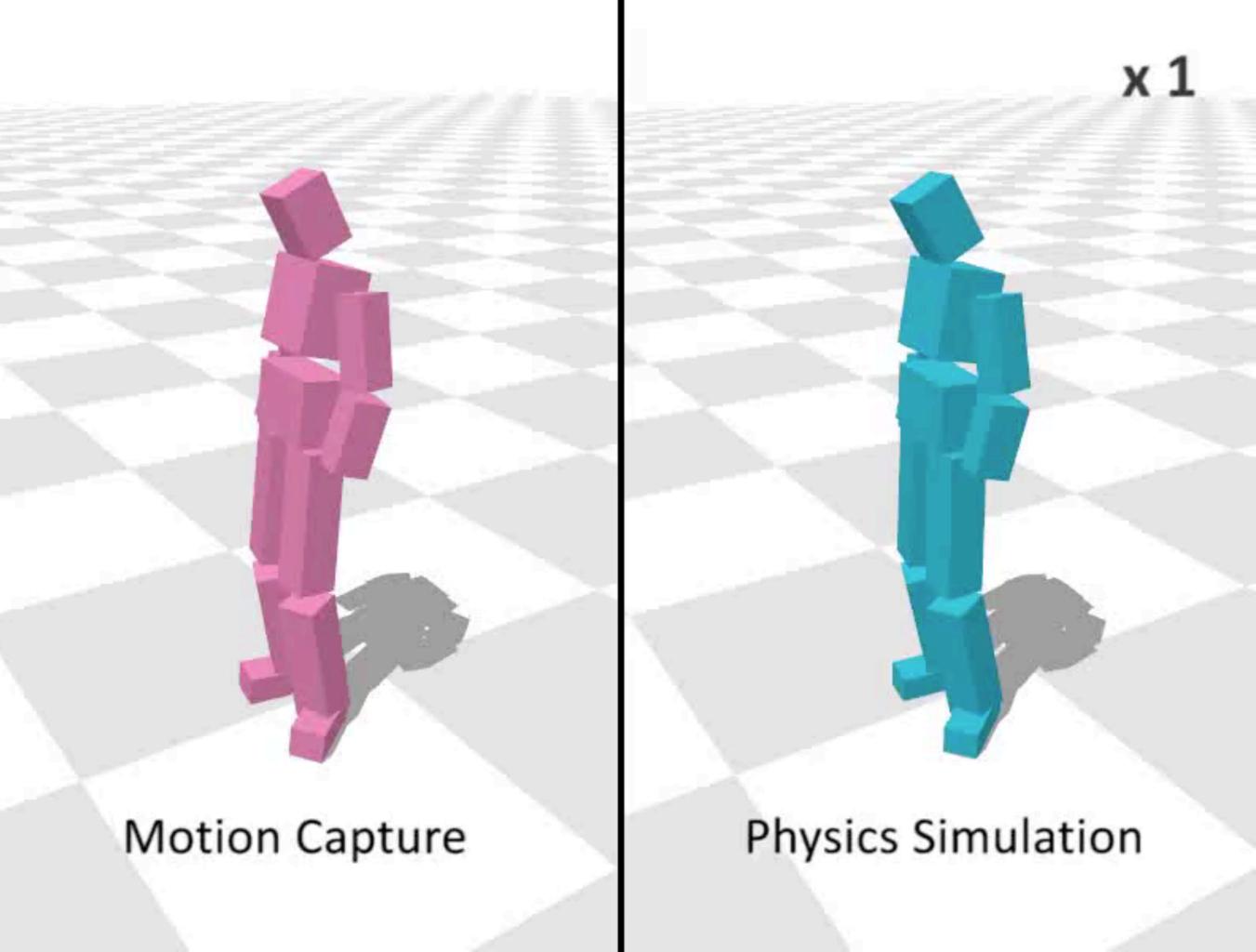


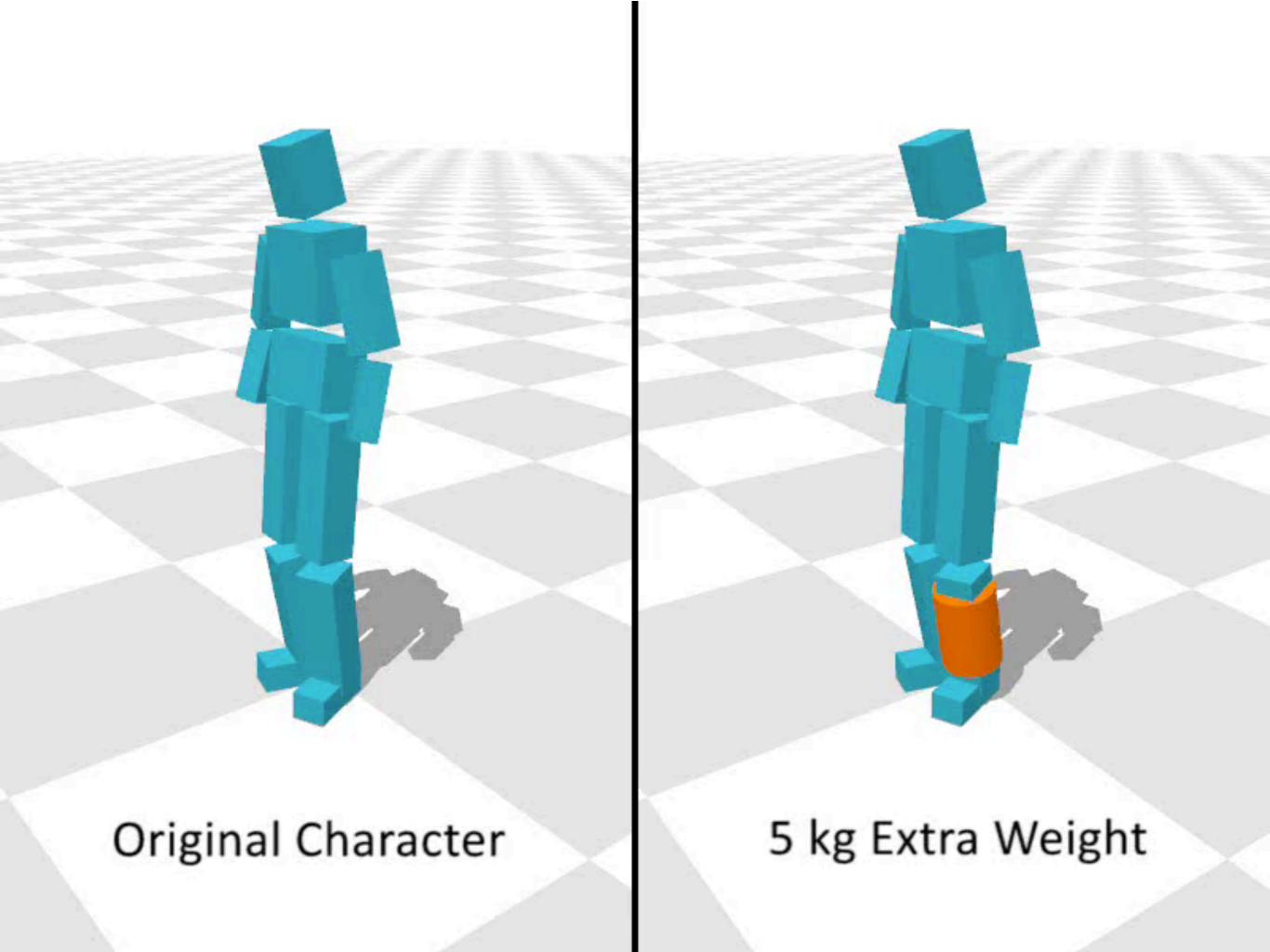
[SIGGRAPH 2010] Lee et al, Data-driven biped control

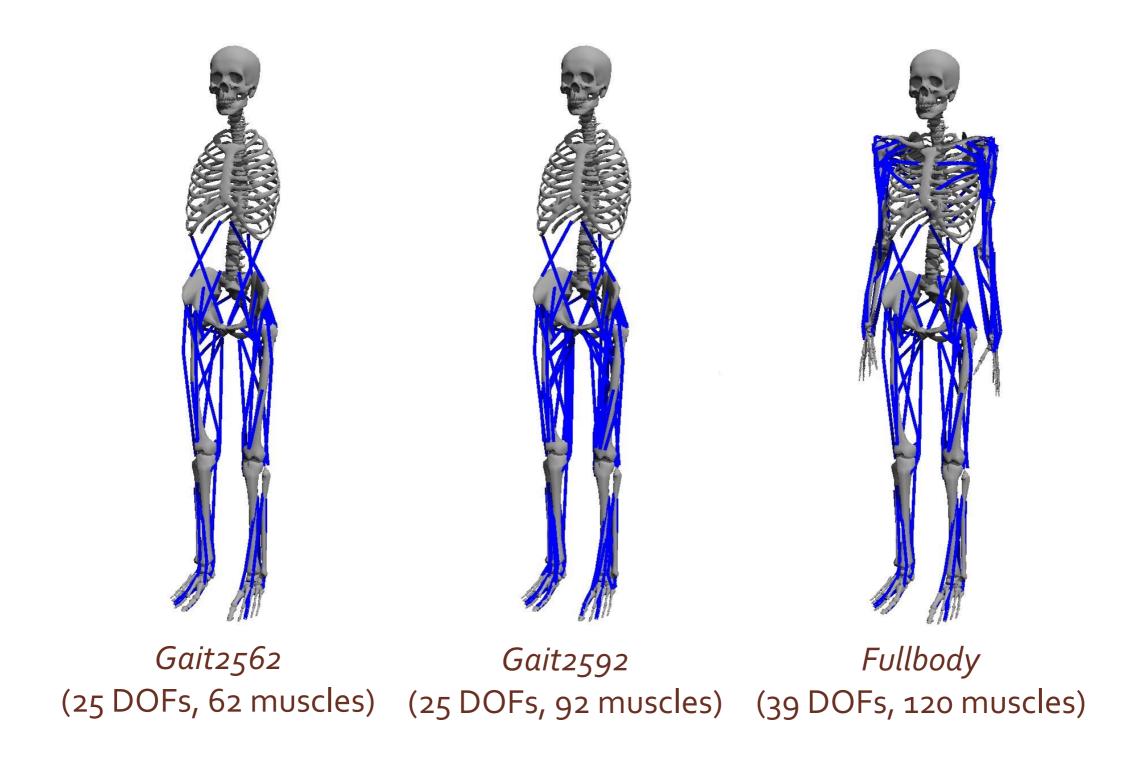




**Physics Simulation** 

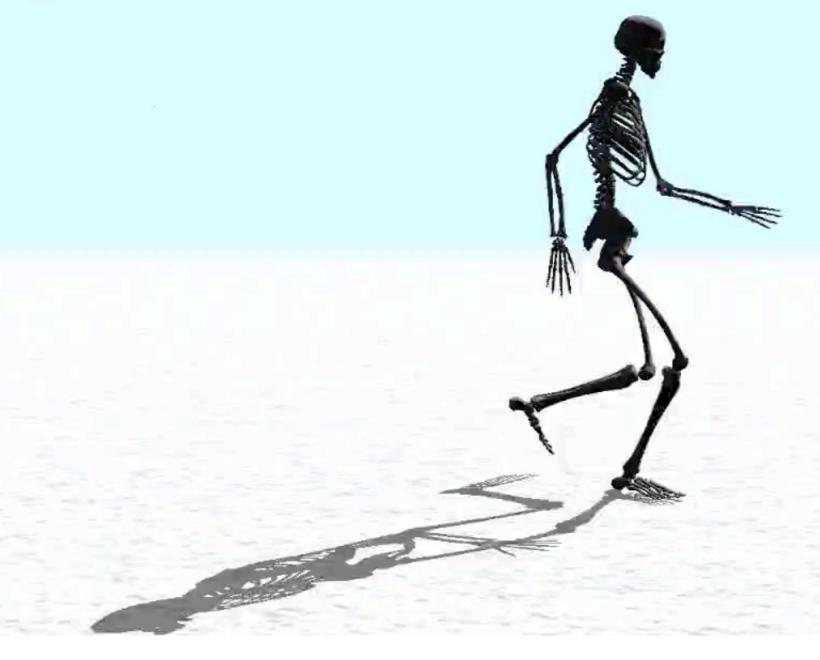




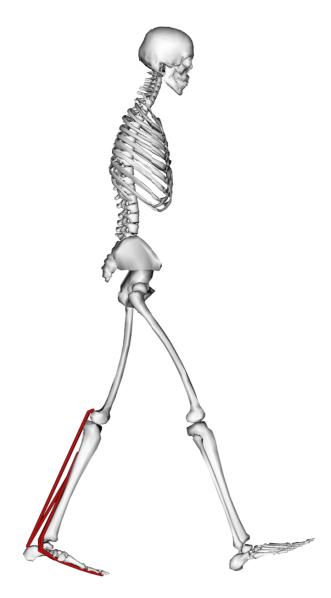


[SIGGRAPH Asia 2014] Lee et al, Many-Muscle Humanoids

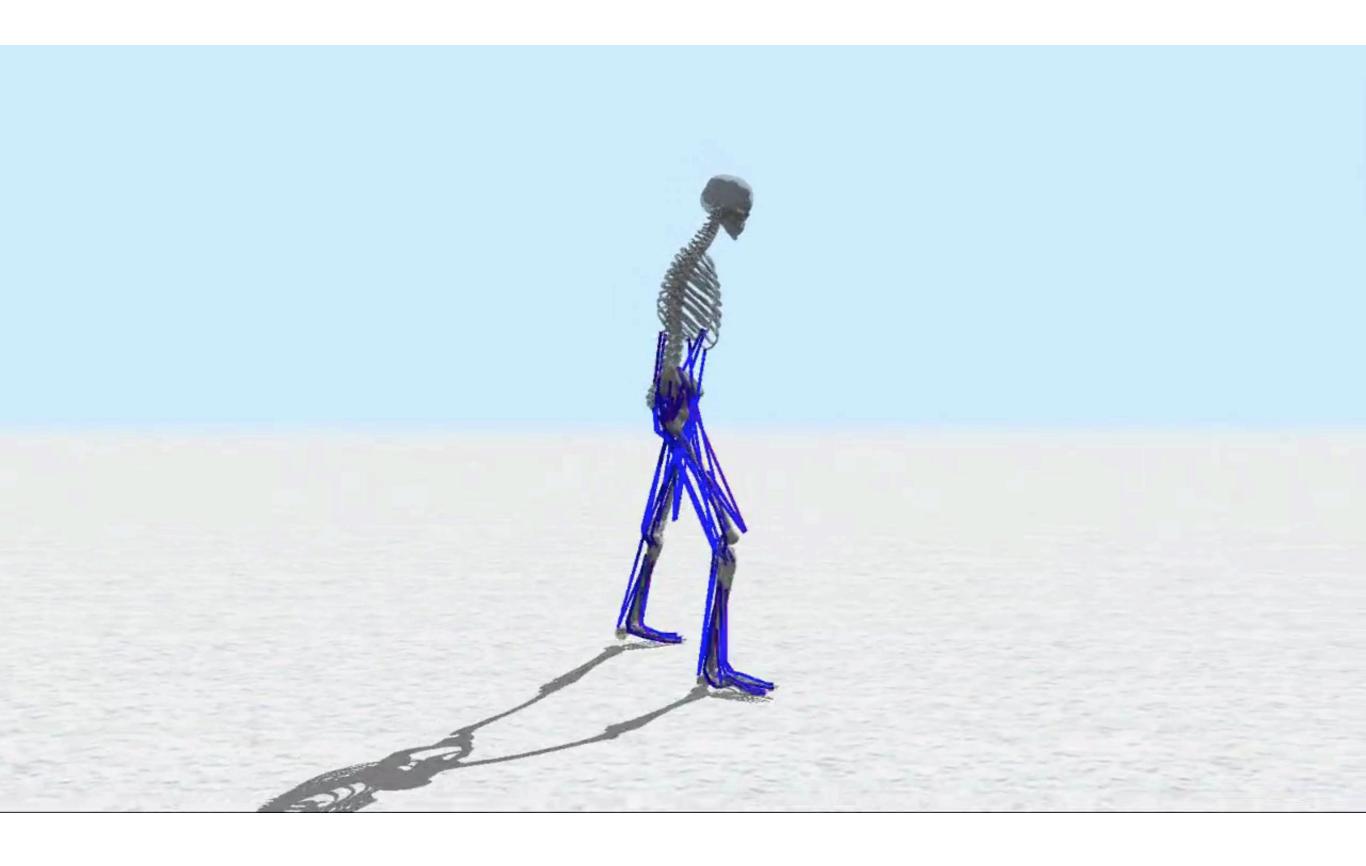
# Motion Capture Reference slow run

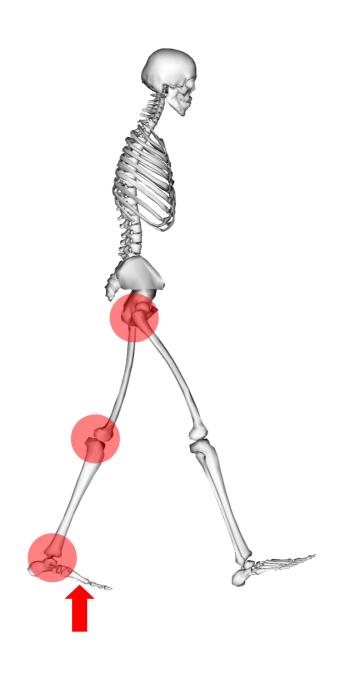


[SIGGRAPH Asia 2014] Lee et al, Many-Muscle Humanoids

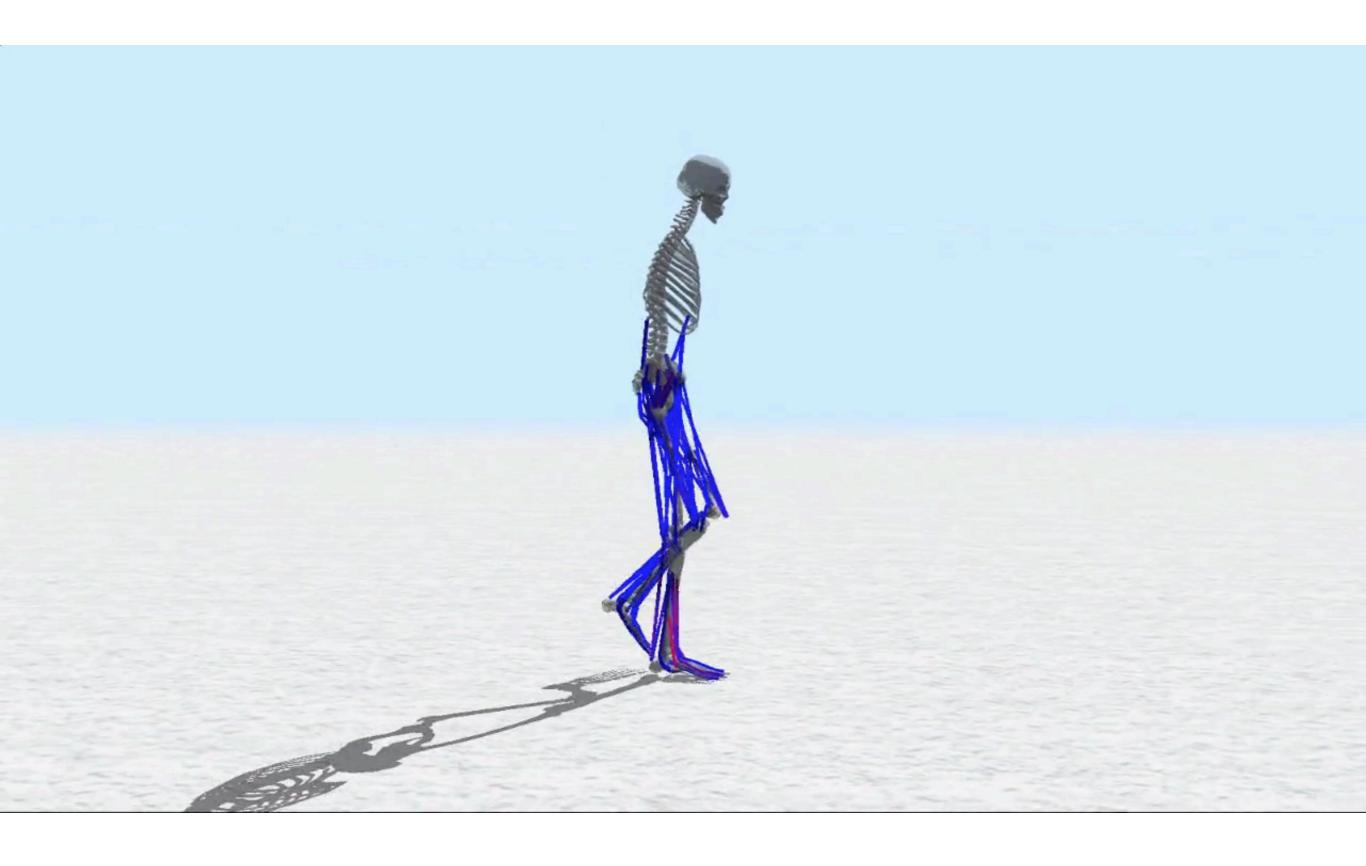


종아리 근육이 약화되면, ...



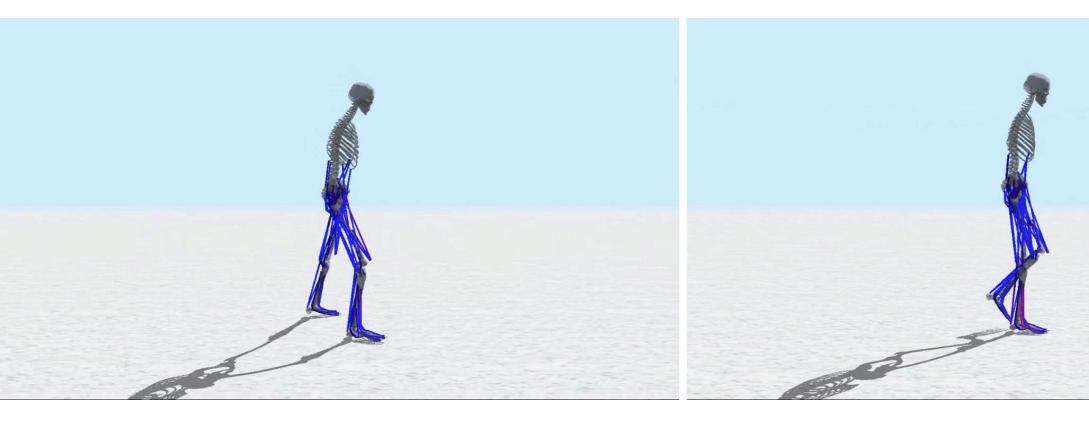


# 관절에 통증이 있으면, ...



### Painful Left Ankle Plantar Flexor

### **Painful Joints on Left Leg**



### 보행 시뮬레이션을 위한 딥러닝









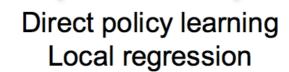


1980년대 – 2000년대 단순화된 모델 Inverted pendulum 로봇의 걸음걸이 DOF < 5 2007년 Fullbody dynamics Motor/torque control 사람과 같은 걸음걸이 DOF < 10 2010년 Fullbody dynamics Motor/torque control 다양한 동작 DOF < 100 2014년 근골격구조 선형 Hill type 생체역학적 동작 DOF < 1000

2017년 이후 근골격+피부 Volumetric FEM 해부학적 정밀도 DOF > 10000

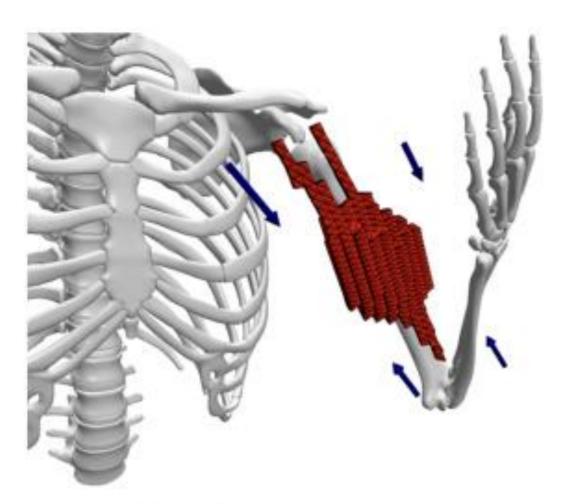
Closed-form solution

Feedback control, Optimization, Data-driven

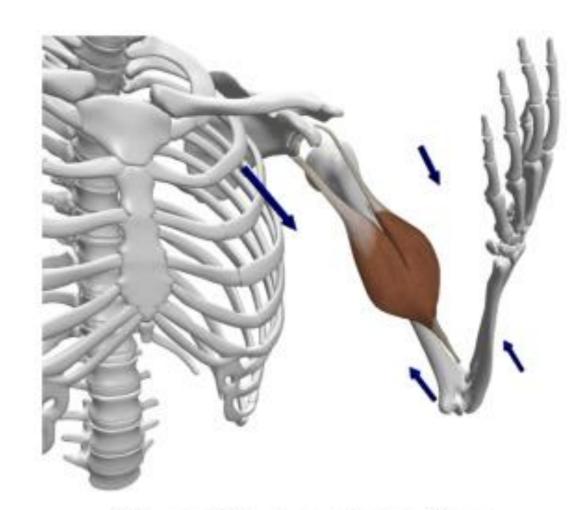


Reinforcement learning
Deep neural network
End-to-end learning

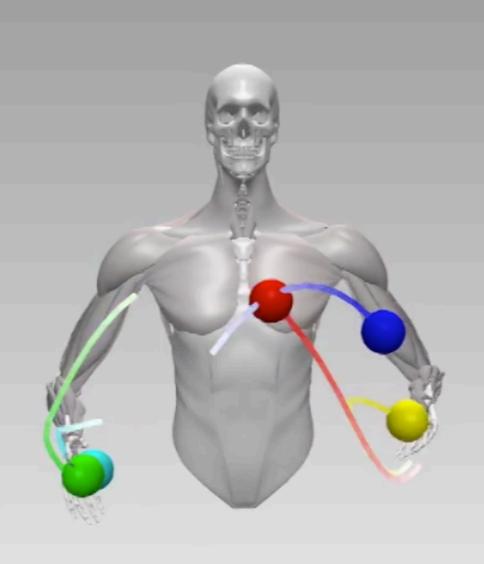
# 근골격신경 모델링

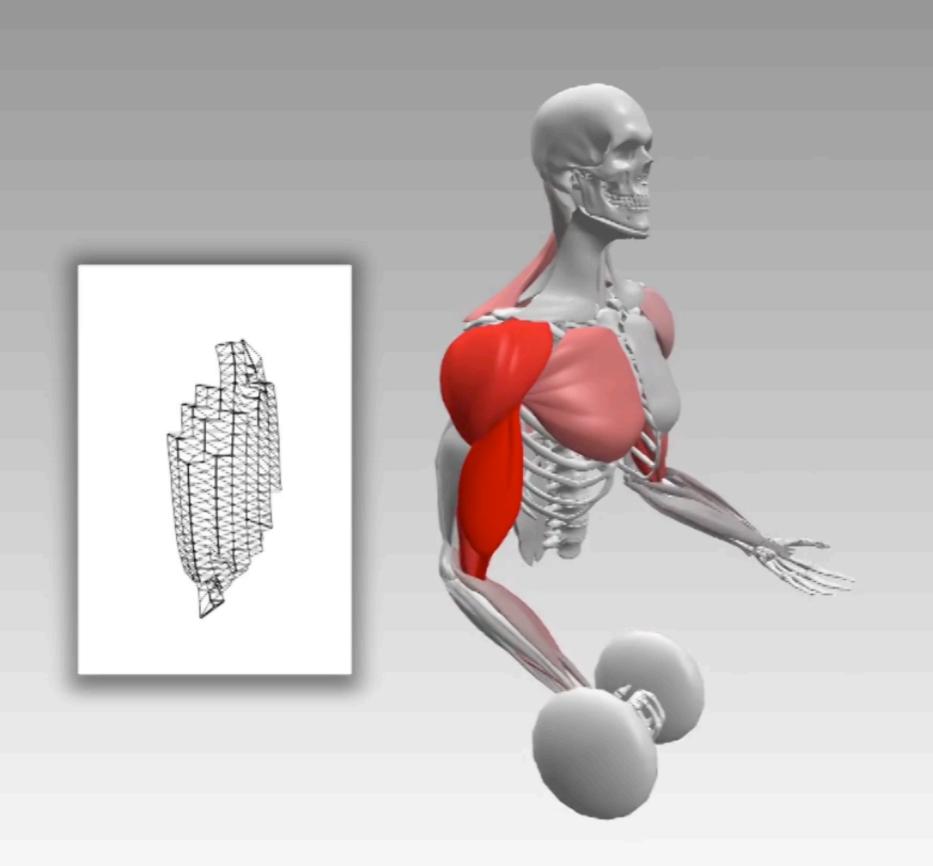


FEM simulation



Muscle contraction



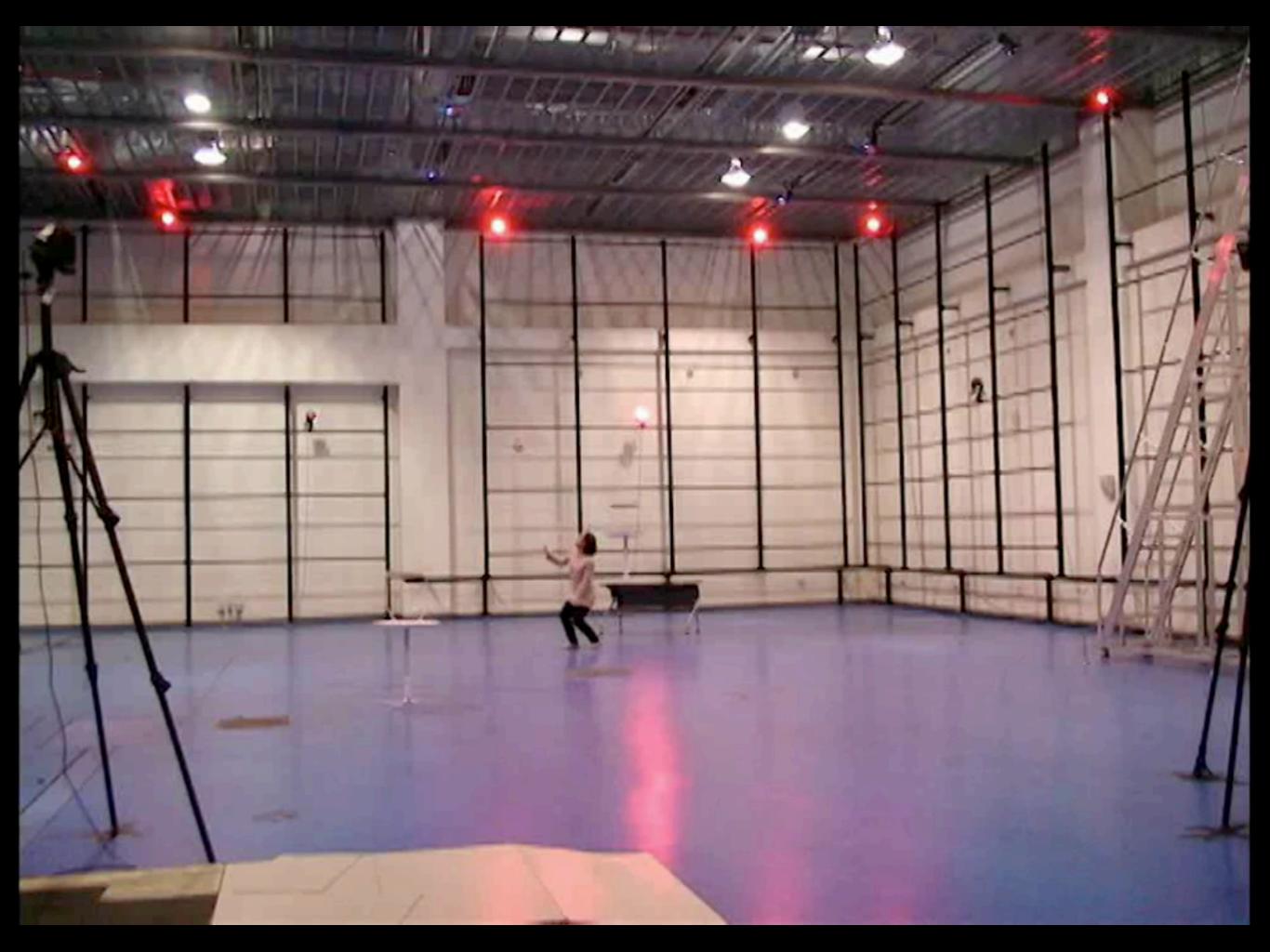


### Data-driven Control of Flapping Flight



Collaboration with Eunjung Ju, Jungdam Won, Byungkuk Choi, Junyong Noh, Min Gyu Choi (ACM Transactions on Graphics 2013, presented at SIGGRAPH 2014)





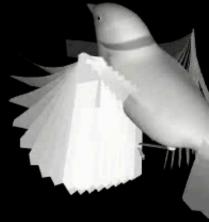


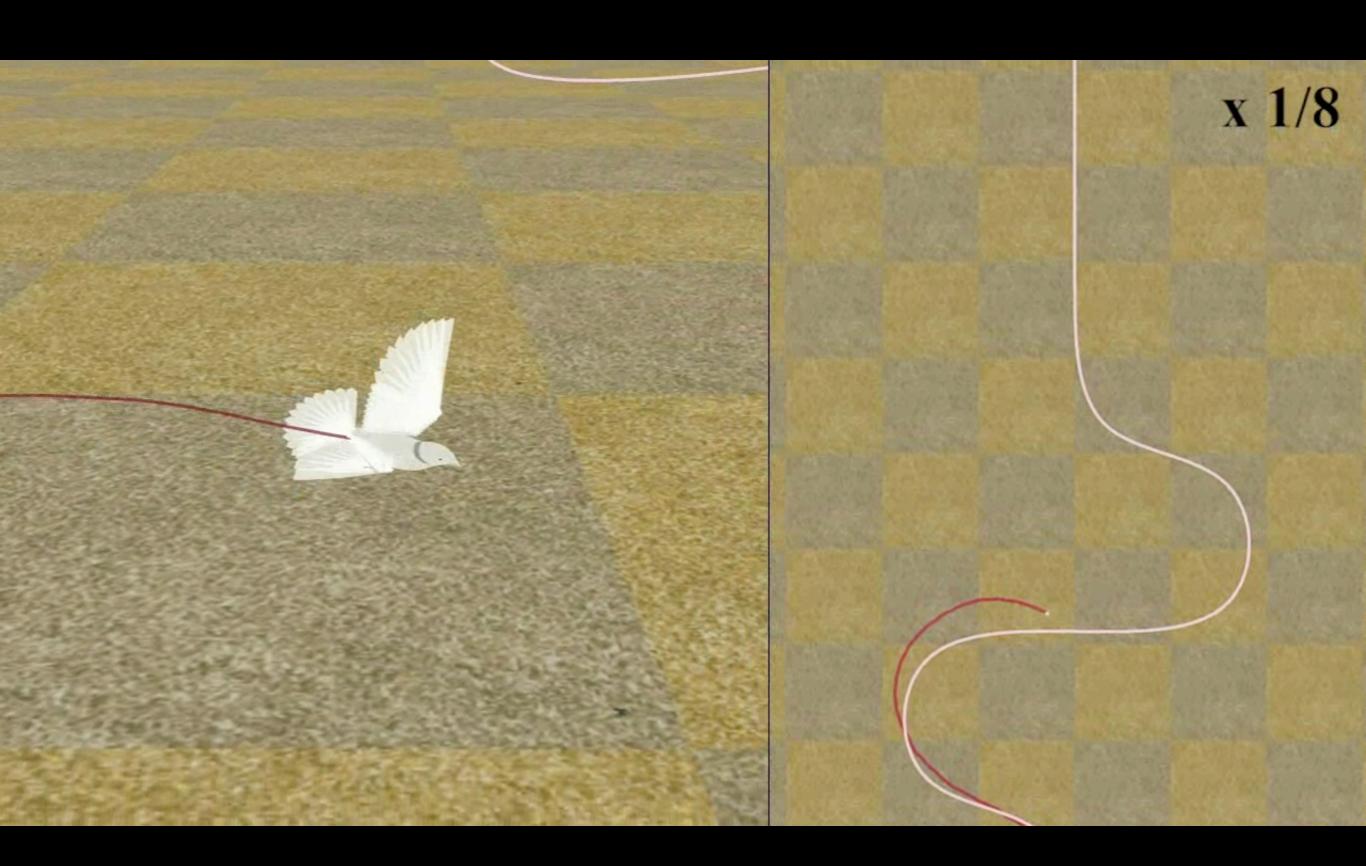


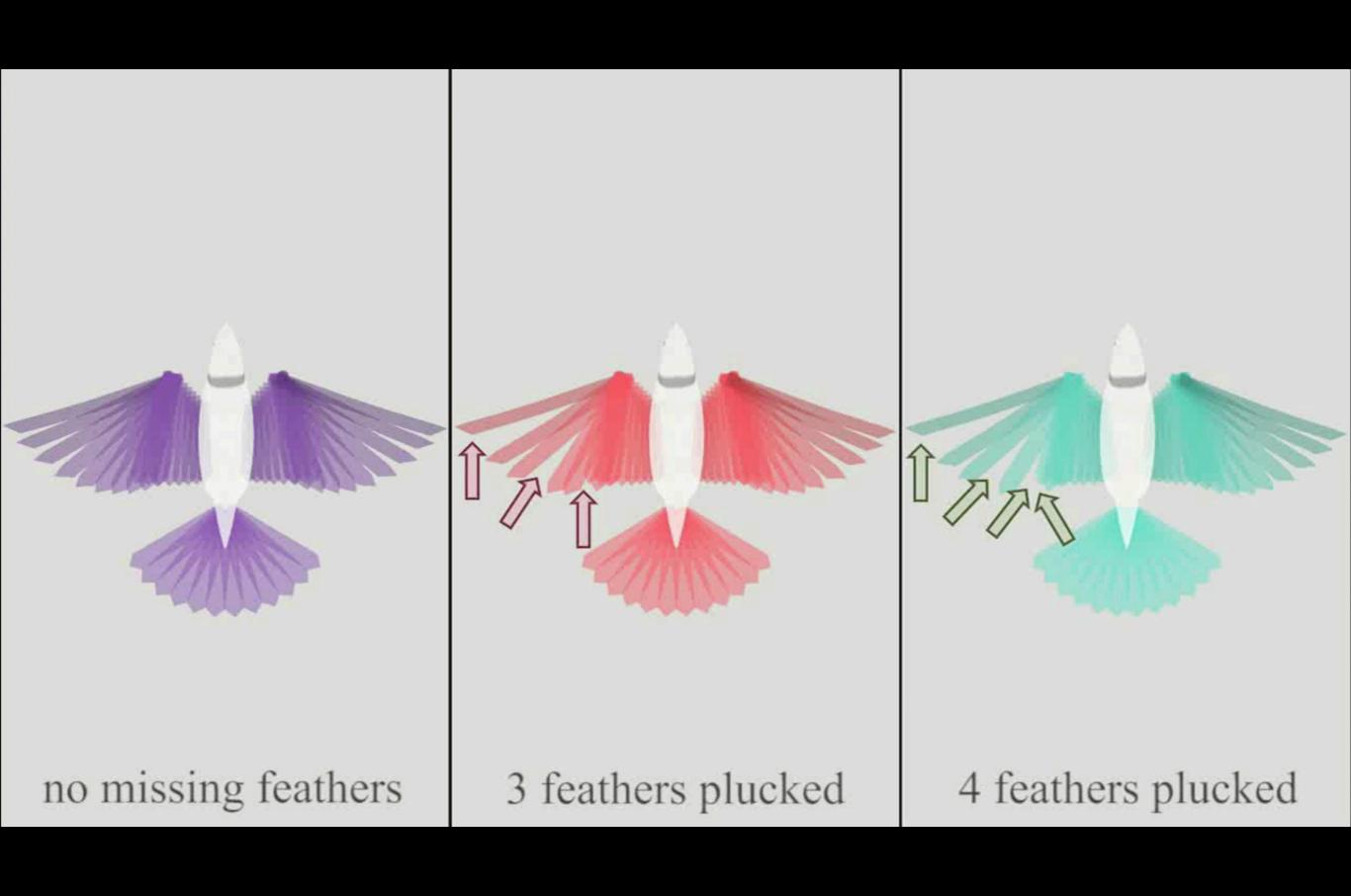








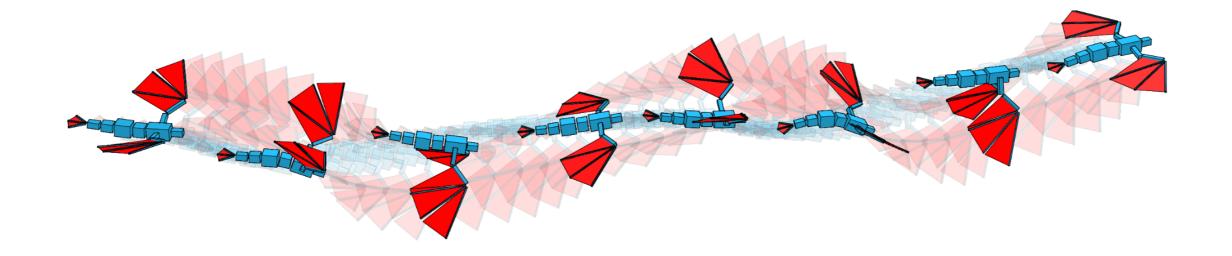






## How To Train Your Dragon:

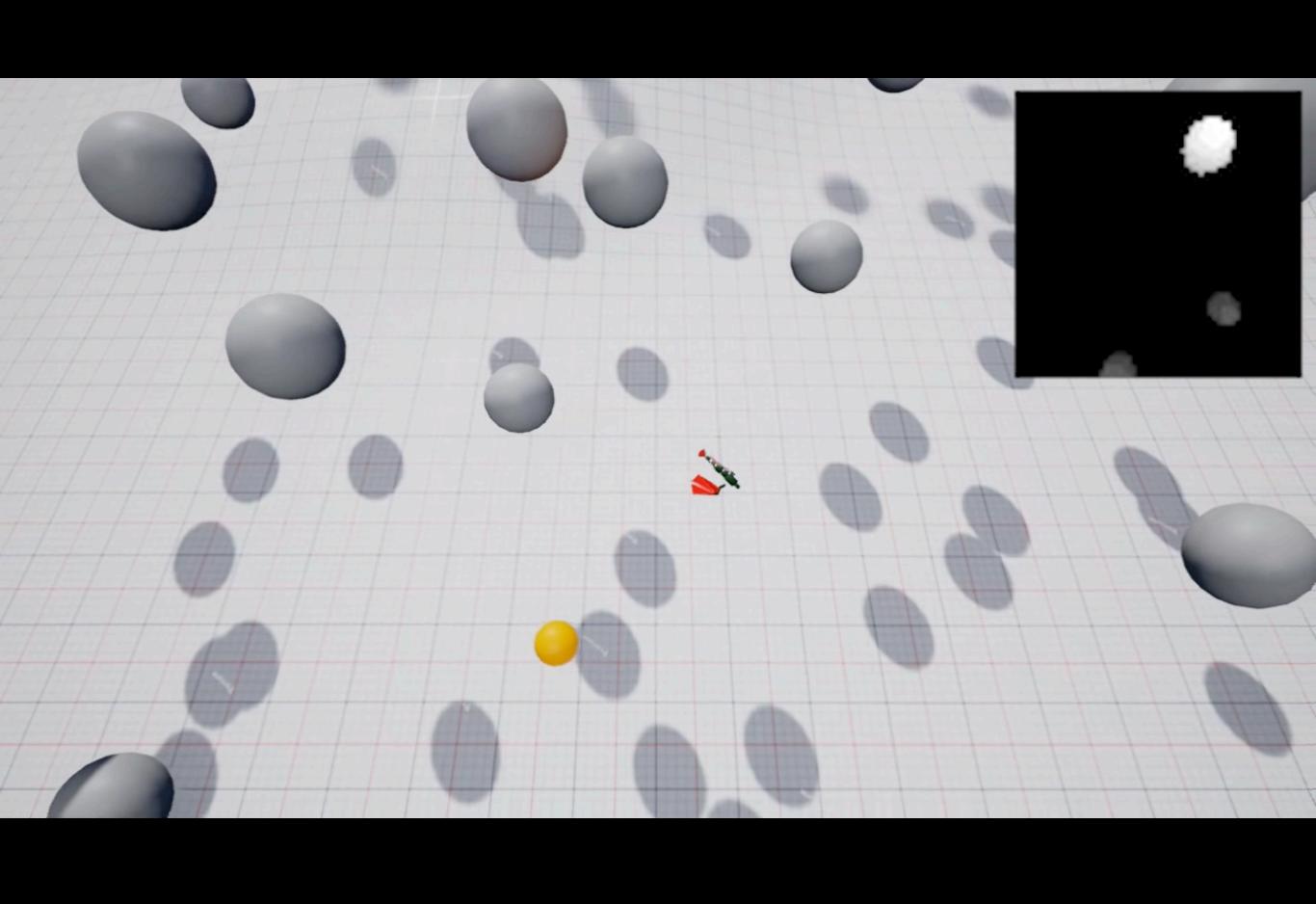
Example-Guided Control of Flapping Flight

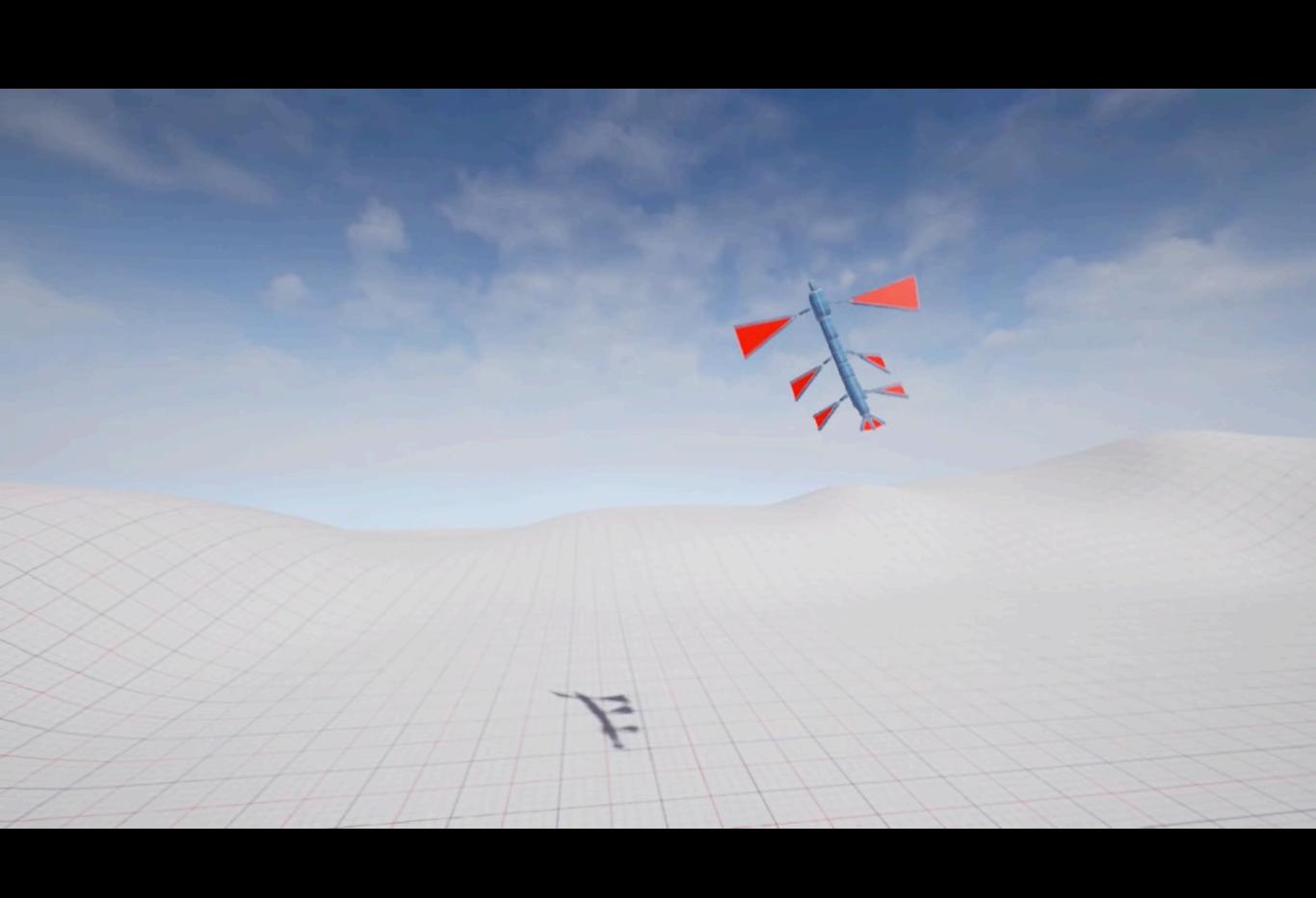


Jungdam Won Jongho Park Kwanyu Kim Jehee Lee Seoul National University

[SIGGRAPH Asia 2017]





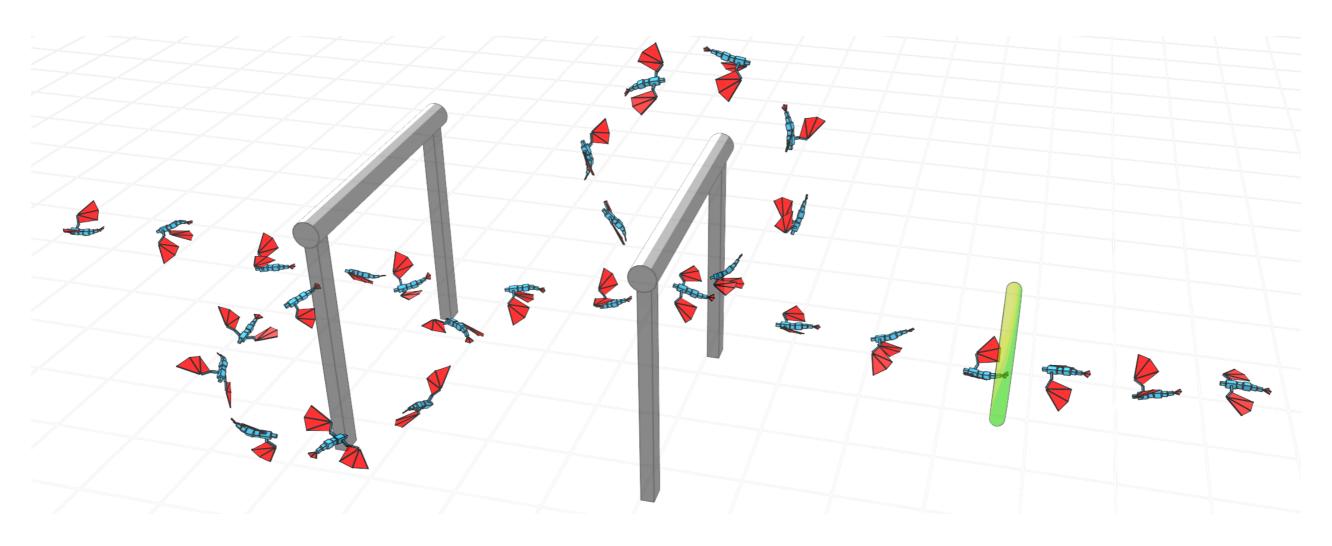






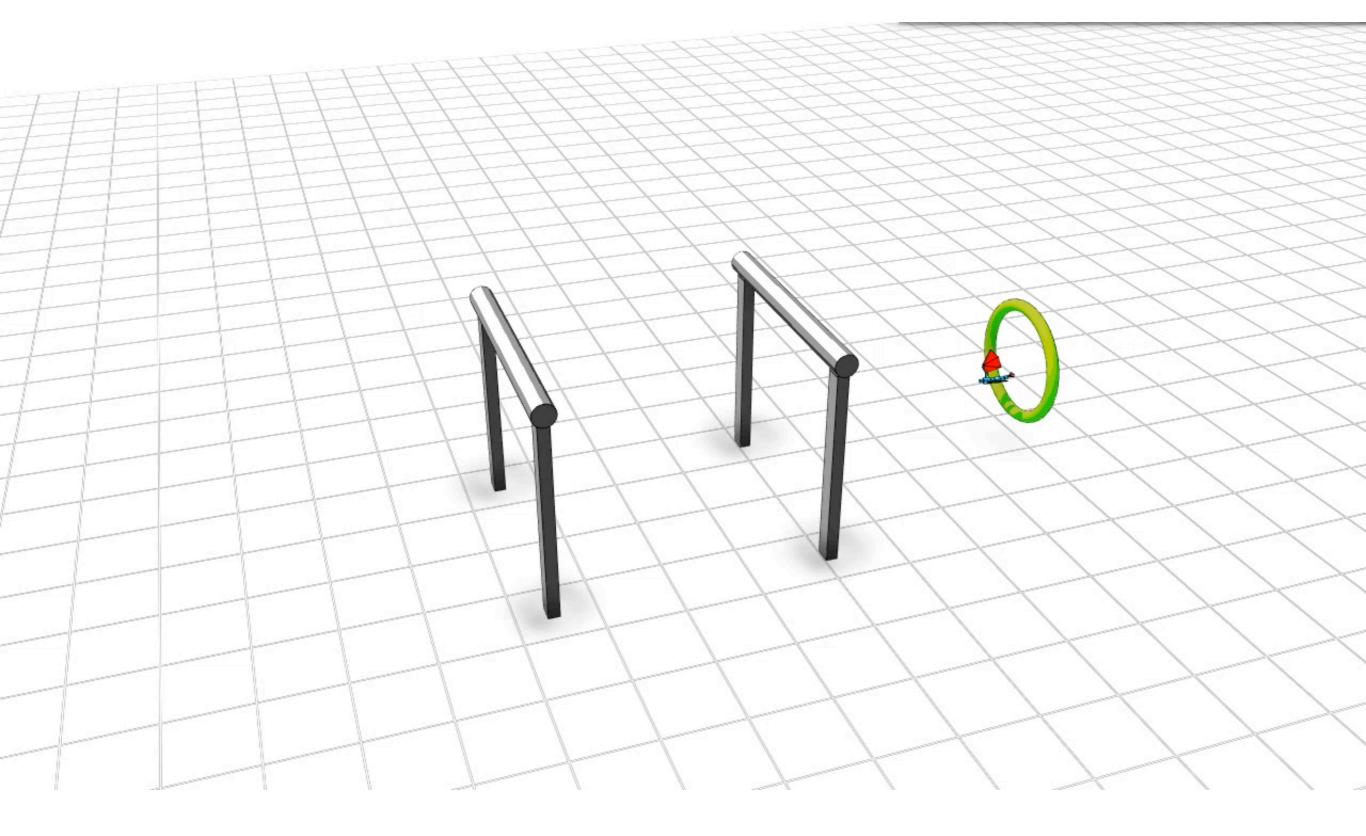


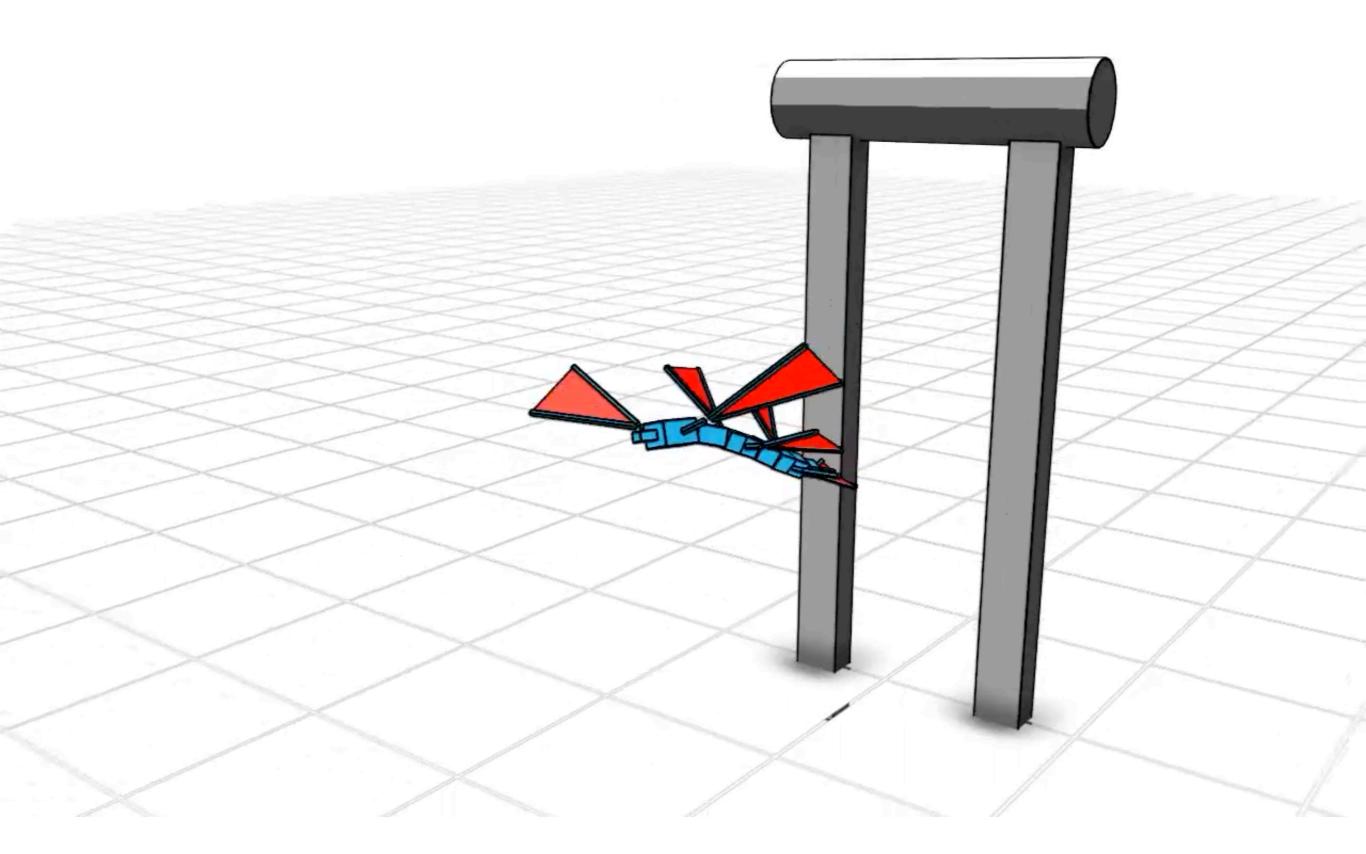
# Aerobatic Control of Flying Creatures via Self-Regulated Learning



Jungdam Won Jungnam Park Jehee Lee Seoul National University

[SIGGRAPH Asia 2018]





## The papers and videos are available at SNU Movement Research Lab at <a href="http://mrl.snu.ac.kr">http://mrl.snu.ac.kr</a>



#### **Collaborators**

Jungdam Won, Kyungho Lee, Seunghwan Lee, Ri Yu, Jungnam Park, Seyoung Lee, Yoonsang Lee, Munseok Park, Jongho Park, Kwanyu Kim, Eunjung Ju, Manmyung Kim, Kwangwon Sok, and many others