

---

---

# View-Dependent Articulated-Body Simulation with Adaptive Forward Dynamics

---

---

**Daseong Han**

KAIST (Korea Advanced Institute of Science  
and Technology)

**KAIST**



# Outline

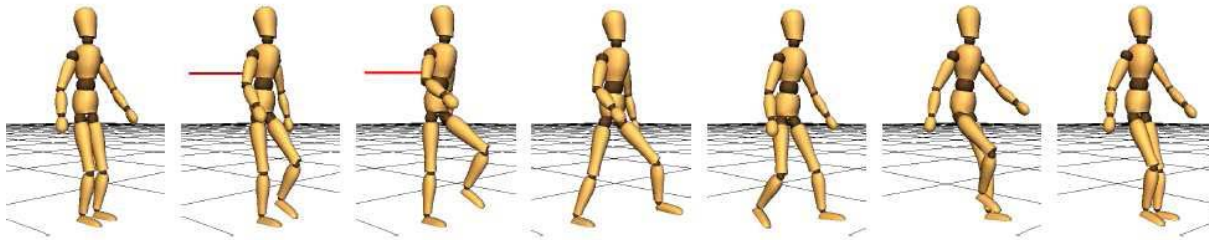
---

---

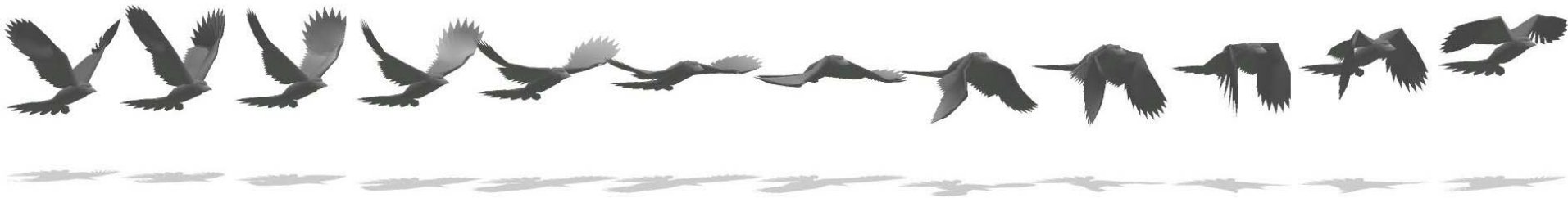
- **Introduction**
- **Related Work**
  - **Simulation Levels of Detail(SLODs) for Real-time Animation**
  - **View-Dependent Culling Systems in Virtual Environments**
  - **Divide and Conquer Algorithm(DCA) For Forward Dynamics**
  - **Adaptive Forward Dynamics(AFD)**
- **View-dependent Forward Dynamics**
- **Conclusion**

# Introduction

- **Physically-based character animation**
  - Support **physical interaction** between a character and its environment
  - Generate a variety of physically correct motions



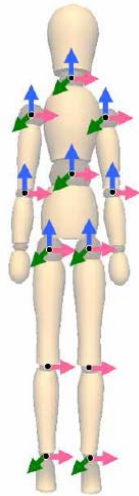
[SIMBICON: Simple Biped Locomotion Control, KangKang Yin et al., SIGGRAPH 2007]



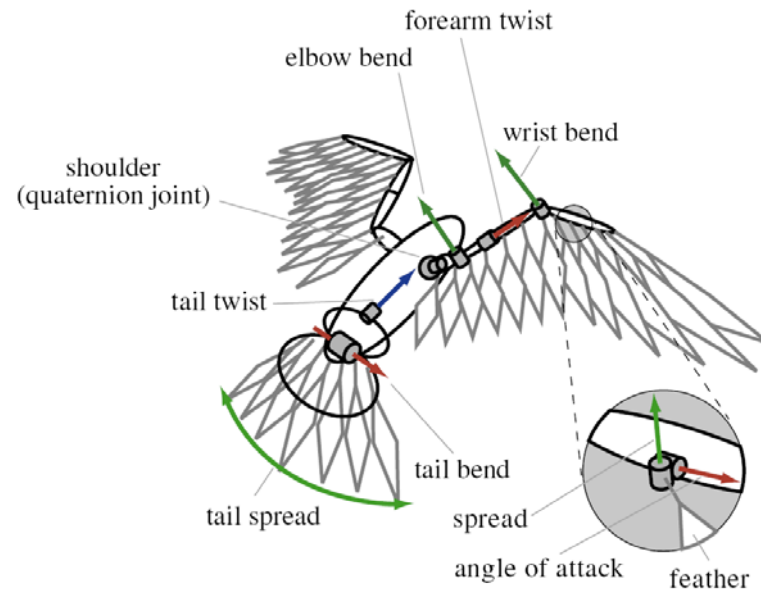
[Realistic Modeling of Bird Flight Animations, Jia-chi Wu, Zoran Popović, SIGGRAPH 2003]

# Introduction

- **Physically-based character**
  - Usually modeled as **an articulated body**



[KangKang Y., '07]



[Jia-chi W., '03]

***Articulated body = Rigid bodies + Joints***

# Introduction

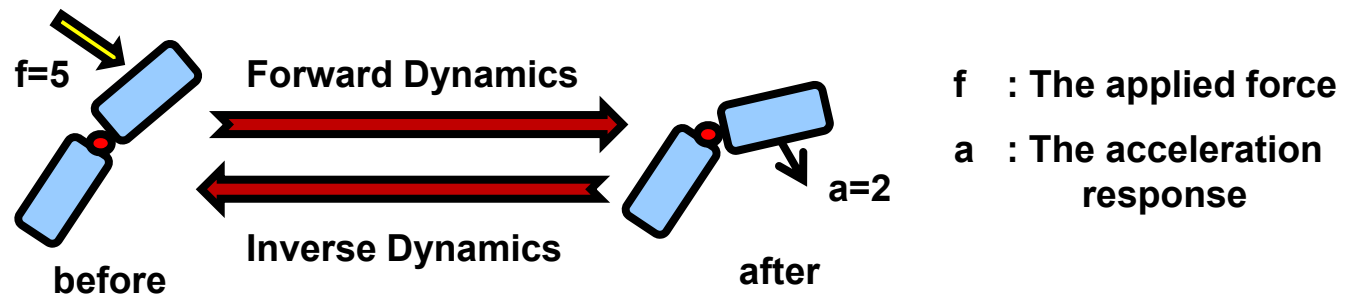
- **Simulation of the articulated-body dynamics**

- **Forward Dynamics** (force  $\rightarrow$  accel.)

The calculation of the acceleration response to a given applied force

- **Inverse Dynamics** (accel.  $\rightarrow$  force)

The calculation of the force that must be applied in order to produce a given acceleration response



# Introduction

- **Optimal forward dynamics algorithms**
  - **Their time complexities are linear in the number of joints, but...**



[Continuum Crowds, Adrien T. et al., SIGGRAPH 2006]

## Production constraints

**“Dynamics computations should take less than 10-20 seconds per frame to make animators’ lives easy”**

**Sunil Hadap,  
PDI/DreamWorks**

***We do need approximation techniques for large-scale dynamics simulations!***

# Related Work

---

---

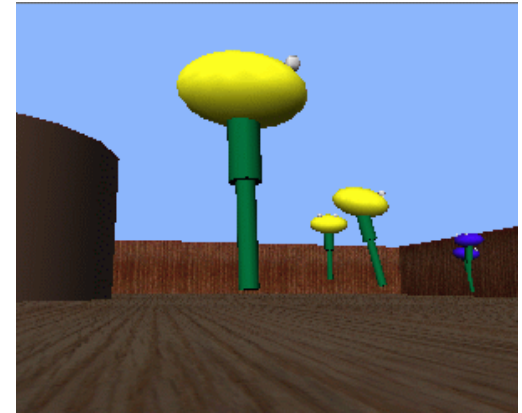
- **Optimal Forward Dynamics**
  - **Divide and Conquer Algorithm(DCA) For Forward Dynamics [Roy F., '99]**
  
- **Approximation of Dynamics**
  - **Simulation Levels of Detail(SLODs) for Real-time Animation [Deborah C. and Jessica H., '97]**
  - **View-Dependent Culling Systems in Virtual Environments [Stephen C. and David F., '97]**
  - **Adaptive Forward Dynamics(AFD) [Stephane R. et al., '05]**

# SLODs for Real-time Animation

---

---

- **Simulation of simple hopping robots**
  - Move around a rectangular court
  - Avoid collision with other objects
- **Three SLODs models**
  - **Dynamic model**
    - Fully simulated
  - **Hybrid model**
    - Kinematic(leg) + Dynamic(position)
  - **Point-mass model**
    - Only the position of the body simulated
    - No motion of the leg (invisible case)

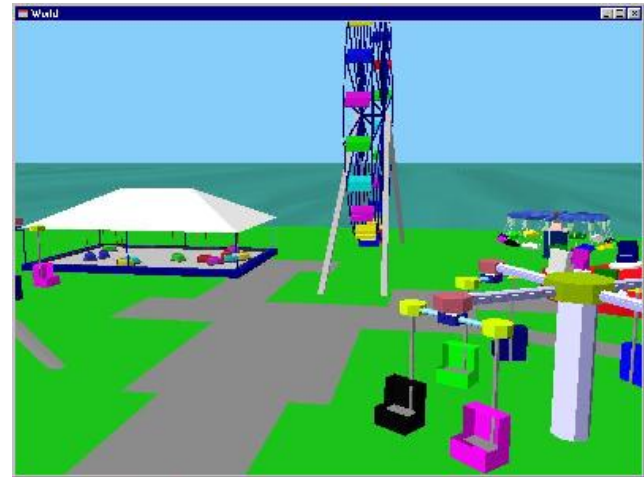


*Recording of motions needed, Lower scalability to any other models*



# View-Dependent Culling Systems

- **Simulation of dynamic objects in a virtual amusement park**
- **Culling dynamics**
  - **Do not solve dynamic equations of objects that are not visible**
- **Two main problems**



[pages.cs.wisc.edu/~schenney/research/culling]

- **Consistency**

**In what state should culled objects be when the view turns back?**

- **Completeness**

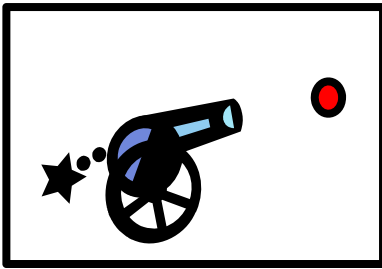
**Where and when will culled objects return to the view by themselves?**

# View-Dependent Culling Systems

---

---

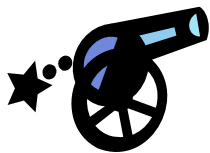
- **Consistency**



View window



- **Completeness**



# View-Dependent Culling Systems

---

---

- **Key observation**
  - The user has a snapshot of the approximate **initial conditions**
- **Approaches to consistency problem**
  - Predict from the initial conditions the states of the systems to which the view turns back
    - ➔ Apply a different **statistical model** according to behavioral properties of each dynamic system

*Study of the behavioral properties needed,  
Completeness problem not yet solved,  
Lower scalability to any other models*

# DCA For Forward Dynamics

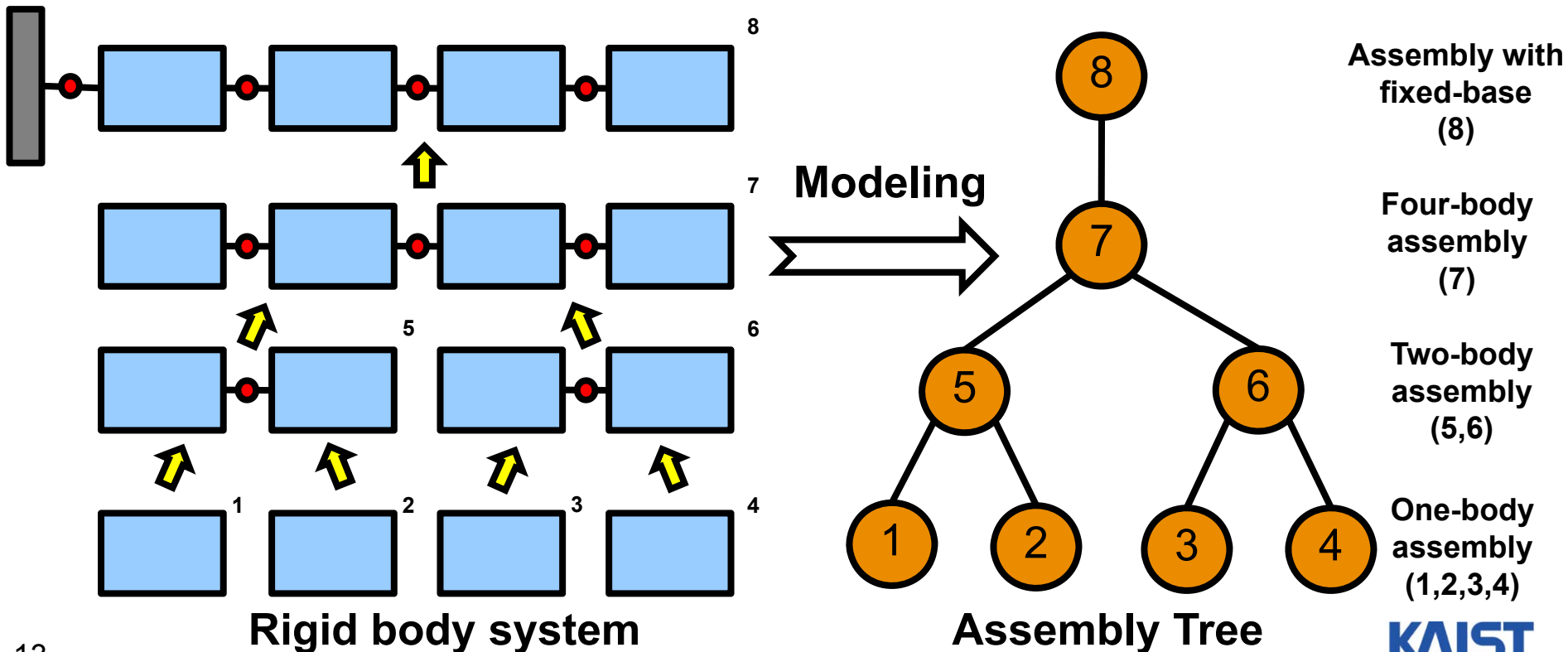
---

---

- One of the **optimal solutions**
- The **spatial vector algebra** used
  - **Spatial vectors: 6D vectors that represent the linear and angular motions together**
  - **Simple and efficient to express the dynamic equations**
- **Divide and Conquer Algorithm (DCA)**
  - **Computations are recursively defined**
  - **Efficient parallel computing in multi-processor systems possible**

# DCA For Forward Dynamics

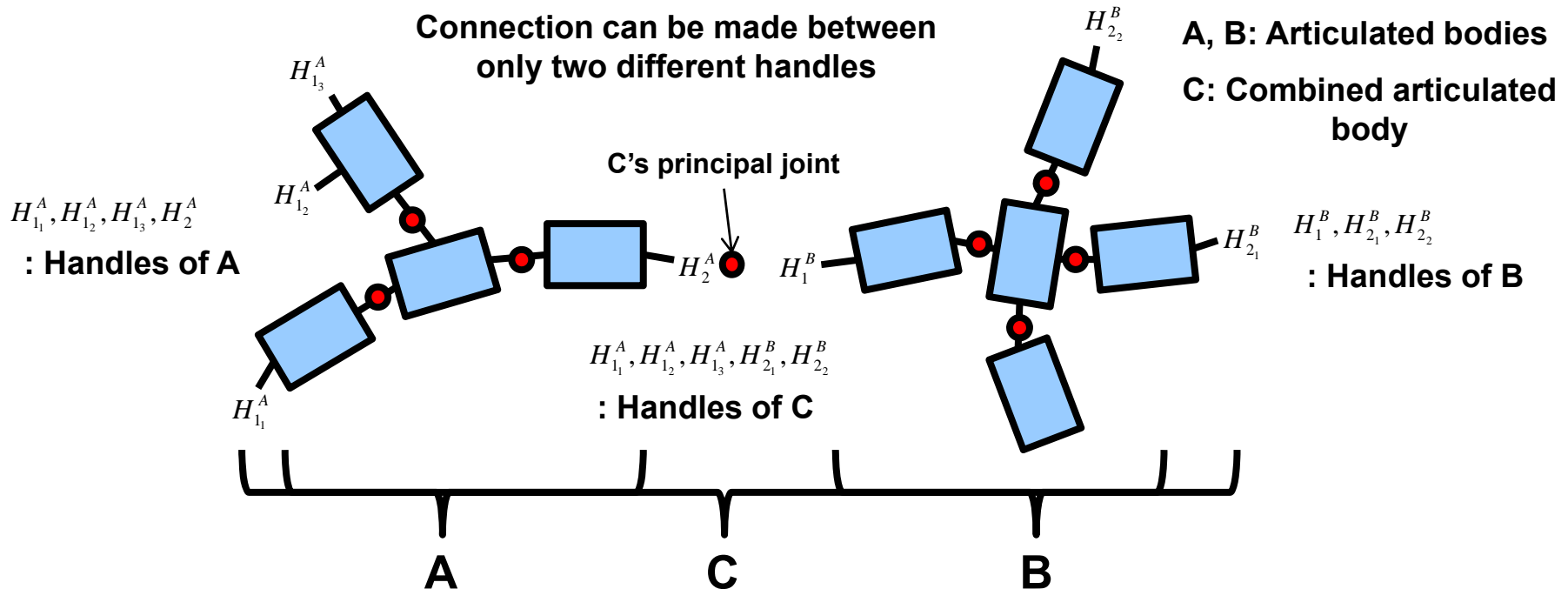
- **Rigid body system model**
  - **Binary assembly tree**
    - **Combines two subassembly trees recursively**



# DCA For Forward Dynamics

- **Handles**

- **Specified locations within a rigid body system at which external forces may be applied**



# DCA For Forward Dynamics

- Articulated-body equation

$$\begin{bmatrix} a_1 \\ a_2 \\ \vdots \\ a_m \end{bmatrix} = \begin{bmatrix} \Phi_1 & \Phi_{12} & \cdots & \Phi_{1m} \\ \Phi_{21} & \Phi_2 & \cdots & \Phi_{2m} \\ \vdots & \vdots & \ddots & \vdots \\ \Phi_{m1} & \Phi_{m2} & \cdots & \Phi_m \end{bmatrix} \begin{bmatrix} f_1 \\ f_2 \\ \vdots \\ f_m \end{bmatrix} + \begin{bmatrix} b_1 \\ b_2 \\ \vdots \\ b_m \end{bmatrix}$$

Body accelerations

$a_i$  : the acceleration for handle  $i$

Inverse inertia tensors

$\Phi_i$  : the inverse inertia tensor for handle  $i$

$\Phi_{ij}$  : the inverse inertia tensor mapping a force applied to handle  $j$  to an acceleration at handle  $i$

Applied external forces

$f_i$  : the force applied to handle  $i$

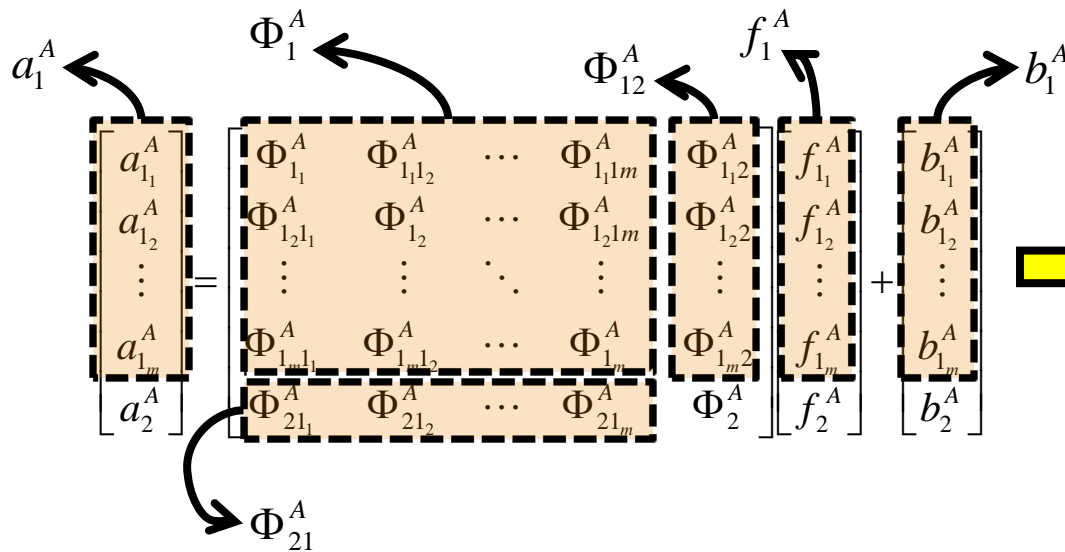
Bias accelerations

$b_i$  : the bias acceleration for handle  $i$

# DCA For Forward Dynamics

- Articulated-body equation
  - Body A with  $m+1$  handles

$$(H_{1_1}^A, H_{1_2}^A, \dots, H_{1_m}^A, H_2^A)$$



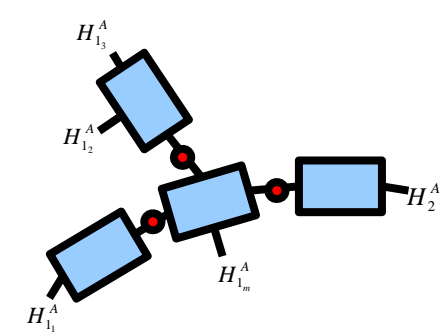
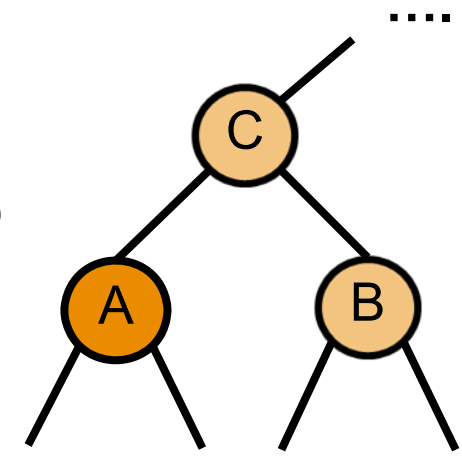
Accelerations  
of body A

Inverse  
inertias

Applied  
forces

Bias  
accelerations

$$\begin{bmatrix} a_1^A \\ a_2^A \end{bmatrix} = \begin{bmatrix} \Phi_1^A & \Phi_{12}^A \\ \Phi_{21}^A & \Phi_2^A \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^A \end{bmatrix} + \begin{bmatrix} b_1^A \\ b_2^A \end{bmatrix}$$





# DCA For Forward Dynamics

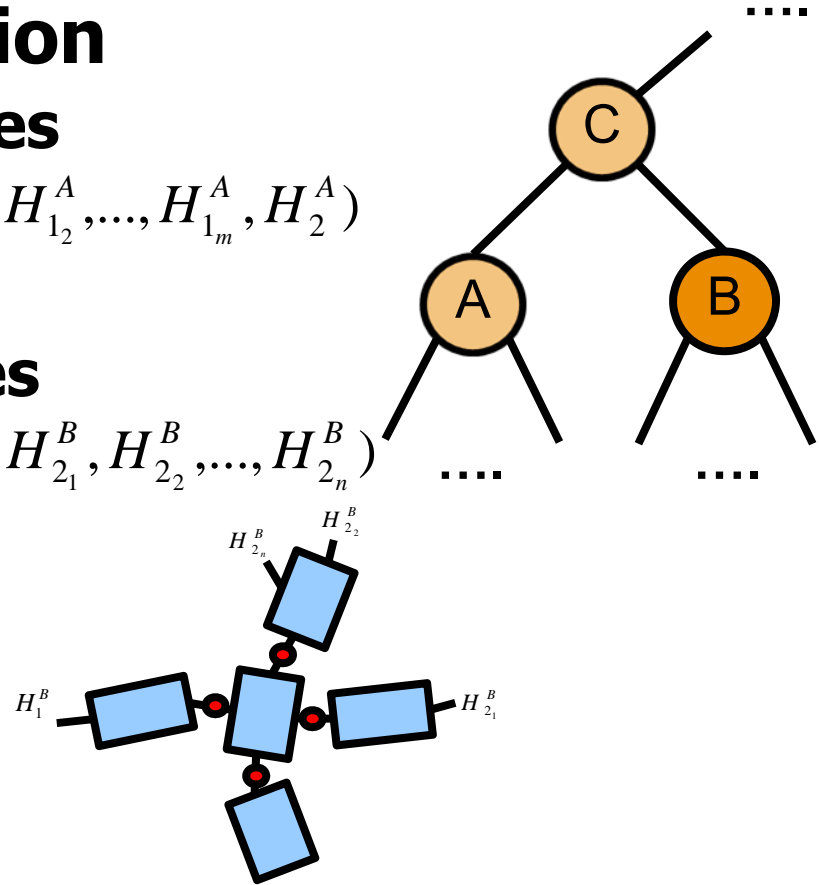
- Articulated-body equation

- Body A with  $m+1$  handles

$$\begin{bmatrix} a_1^A \\ a_2^A \end{bmatrix} = \begin{bmatrix} \Phi_1^A & \Phi_{12}^A \\ \Phi_{21}^A & \Phi_2^A \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^A \end{bmatrix} + \begin{bmatrix} b_1^A \\ b_2^A \end{bmatrix} \quad (H_{1_1}^A, H_{1_2}^A, \dots, H_{1_m}^A, H_2^A)$$

- Body B with  $n+1$  handles

$$\begin{bmatrix} a_1^B \\ a_2^B \end{bmatrix} = \begin{bmatrix} \Phi_1^B & \Phi_{12}^B \\ \Phi_{21}^B & \Phi_2^B \end{bmatrix} \begin{bmatrix} f_1^B \\ f_2^B \end{bmatrix} + \begin{bmatrix} b_1^B \\ b_2^B \end{bmatrix} \quad (H_1^B, H_{2_1}^B, H_{2_2}^B, \dots, H_{2_n}^B)$$



# DCA For Forward Dynamics

- Articulated-body equation

- Body A with  $m+1$  handles

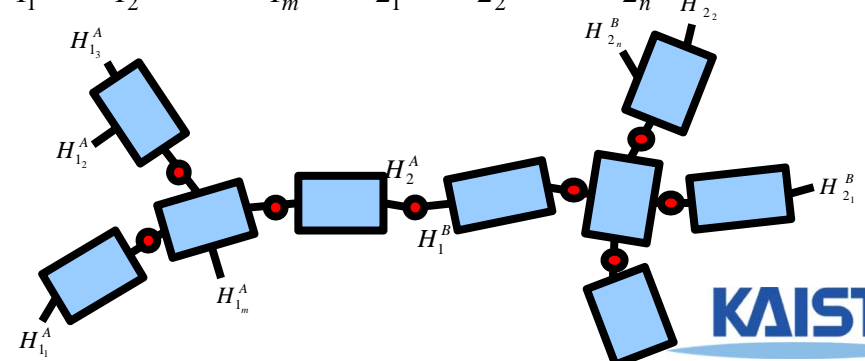
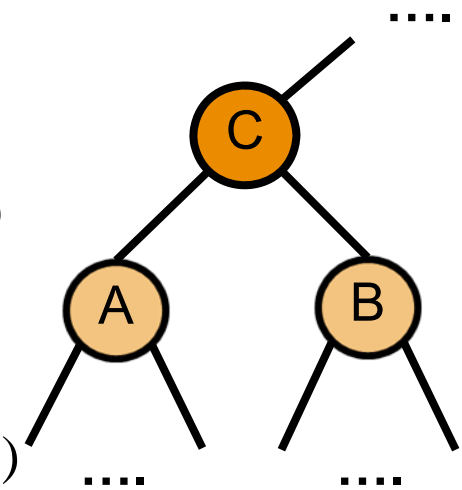
$$\begin{bmatrix} a_1^A \\ a_2^A \end{bmatrix} = \begin{bmatrix} \Phi_1^A & \Phi_{12}^A \\ \Phi_{21}^A & \Phi_2^A \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^A \end{bmatrix} + \begin{bmatrix} b_1^A \\ b_2^A \end{bmatrix} \quad (H_{1_1}^A, H_{1_2}^A, \dots, H_{1_m}^A, H_2^A)$$

- Body B with  $n+1$  handles

$$\begin{bmatrix} a_1^B \\ a_2^B \end{bmatrix} = \begin{bmatrix} \Phi_1^B & \Phi_{12}^B \\ \Phi_{21}^B & \Phi_2^B \end{bmatrix} \begin{bmatrix} f_1^B \\ f_2^B \end{bmatrix} + \begin{bmatrix} b_1^B \\ b_2^B \end{bmatrix} \quad (H_1^B, H_{2_1}^B, H_{2_2}^B, \dots, H_{2_n}^B)$$

- Body C with  $m+n$  handles

$$\begin{bmatrix} a_1^C \\ a_2^C \end{bmatrix} = \begin{bmatrix} \Phi_1^C & \Phi_{12}^C \\ \Phi_{21}^C & \Phi_2^C \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^B \end{bmatrix} + \begin{bmatrix} b_1^C \\ b_2^C \end{bmatrix} \quad (H_{1_1}^A, H_{1_2}^A, \dots, H_{1_m}^A, H_{2_1}^B, H_{2_2}^B, \dots, H_{2_n}^B)$$



# DCA For Forward Dynamics

- Articulated-body equation

- Body A with  $m+1$  handles

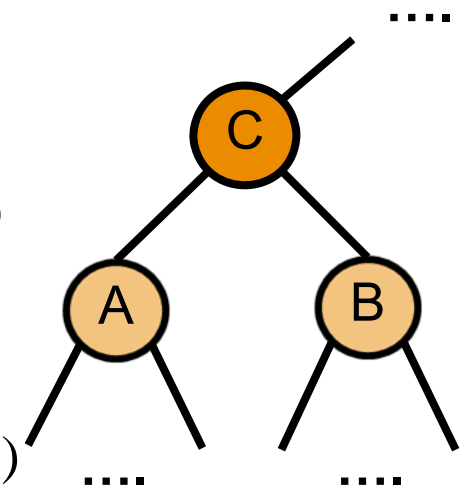
$$\begin{bmatrix} a_1^A \\ a_2^A \end{bmatrix} = \begin{bmatrix} \Phi_1^A & \Phi_{12}^A \\ \Phi_{21}^A & \Phi_2^A \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^A \end{bmatrix} + \begin{bmatrix} b_1^A \\ b_2^A \end{bmatrix} \quad (H_{1_1}^A, H_{1_2}^A, \dots, H_{1_m}^A, H_2^A)$$

- Body B with  $n+1$  handles

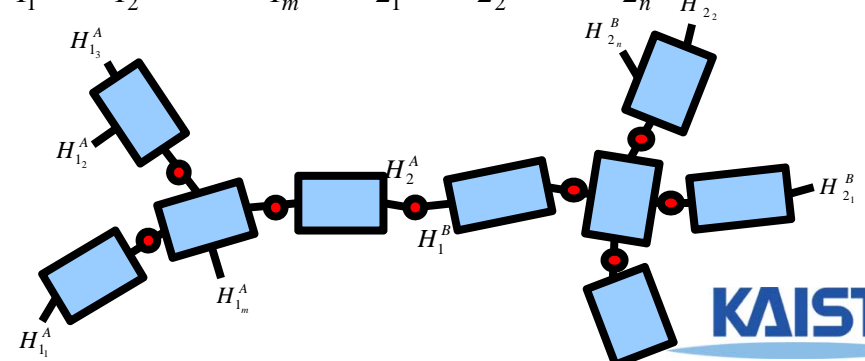
$$\begin{bmatrix} a_1^B \\ a_2^B \end{bmatrix} = \begin{bmatrix} \Phi_1^B & \Phi_{12}^B \\ \Phi_{21}^B & \Phi_2^B \end{bmatrix} \begin{bmatrix} f_1^B \\ f_2^B \end{bmatrix} + \begin{bmatrix} b_1^B \\ b_2^B \end{bmatrix} \quad (H_1^B, H_{2_1}^B, H_{2_2}^B, \dots, H_{2_n}^B)$$

- Body C with  $m+n$  handles

$$\begin{bmatrix} a_1^C \\ a_2^C \end{bmatrix} = \begin{bmatrix} \Phi_1^C & \Phi_{12}^C \\ \Phi_{21}^C & \Phi_2^C \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^B \end{bmatrix} + \begin{bmatrix} b_1^C \\ b_2^C \end{bmatrix} \quad (H_{1_1}^A, H_{1_2}^A, \dots, H_{1_m}^A, H_{2_1}^B, H_{2_2}^B, \dots, H_{2_n}^B)$$



*The coefficients of C can be expressed in terms of those of A and B  
 → Divide and Conquer Algorithm (DCA) is possible!!*



# DCA For Forward Dynamics

- Two main passes

- Main pass ( $\uparrow$ )

$$\begin{bmatrix} a_1^C \\ a_2^C \end{bmatrix} = \begin{bmatrix} \Phi_1^C & \Phi_{12}^C \\ \Phi_{21}^C & \Phi_2^C \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^B \end{bmatrix} + \begin{bmatrix} b_1^C \\ b_2^C \end{bmatrix}$$

Inverse inertias

$$\Phi_1^C = \Phi_1^A - \Phi_{12}^A W \Phi_{21}^A$$

$$\Phi_2^C = \Phi_2^B - \Phi_{21}^B W \Phi_{12}^B$$

$$\Phi_{21}^C = \Phi_{21}^B W \Phi_{21}^A$$

$$\Phi_{12}^C = (\Phi_{21}^C)^T$$

$$b_1^C = b_1^A - \Phi_{12}^A \gamma$$

$$b_2^C = b_2^B + \Phi_{21}^B \gamma$$

Bias accelerations

, where

$$V = (\Phi_2^A + \Phi_1^B)^{-1}$$

$$W = V - VS(S^T VS)^{-1} S^T V$$

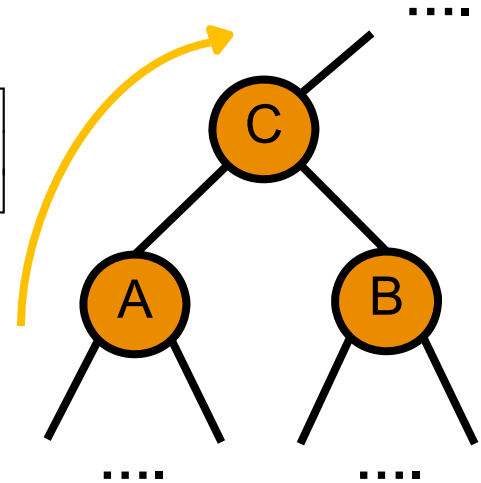
$$\beta = b_2^A - b_1^A + \dot{S} \dot{q}_0$$

$$\gamma = W\beta + VS(S^T VS)^{-1} Q$$

$S$  : Joint motion space

$Q$  : Forces applied by joint actuators

$\dot{q}_0$  : Velocity of the principal joint



- Back-substitution pass ( $\downarrow$ )

# DCA For Forward Dynamics

- Two main passes

- Main pass ( $\uparrow$ )

$$\begin{bmatrix} a_1^C \\ a_2^C \end{bmatrix} = \begin{bmatrix} \Phi_1^C & \Phi_{12}^C \\ \Phi_{21}^C & \Phi_2^C \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^B \end{bmatrix} + \begin{bmatrix} b_1^C \\ b_2^C \end{bmatrix}$$

$$\Phi_1^C = \Phi_1^A - \Phi_{12}^A W \Phi_{21}^A$$

$$\Phi_2^C = \Phi_2^B - \Phi_{21}^B W \Phi_{12}^B$$

$$\Phi_{21}^C = \Phi_{21}^B W \Phi_{21}^A$$

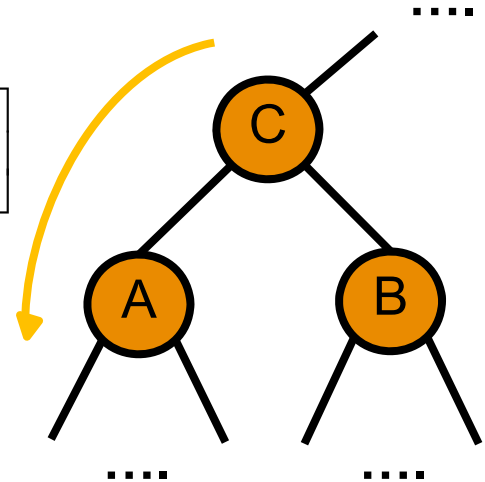
$$\Phi_{12}^C = (\Phi_{21}^C)^T$$

Inverse inertias

bias accelerations

$$b_1^C = b_1^A - \Phi_{12}^A \gamma$$

$$b_2^C = b_2^A + \Phi_{21}^A \gamma$$



- Back-substitution pass ( $\downarrow$ )

Joint acceleration

$$\ddot{q}_0 = (S^T V S)^{-1} (Q - S^T V (\Phi_{21}^A f_1^A - \Phi_{12}^B f_2^B + \beta))$$

Kinematic constraint forces

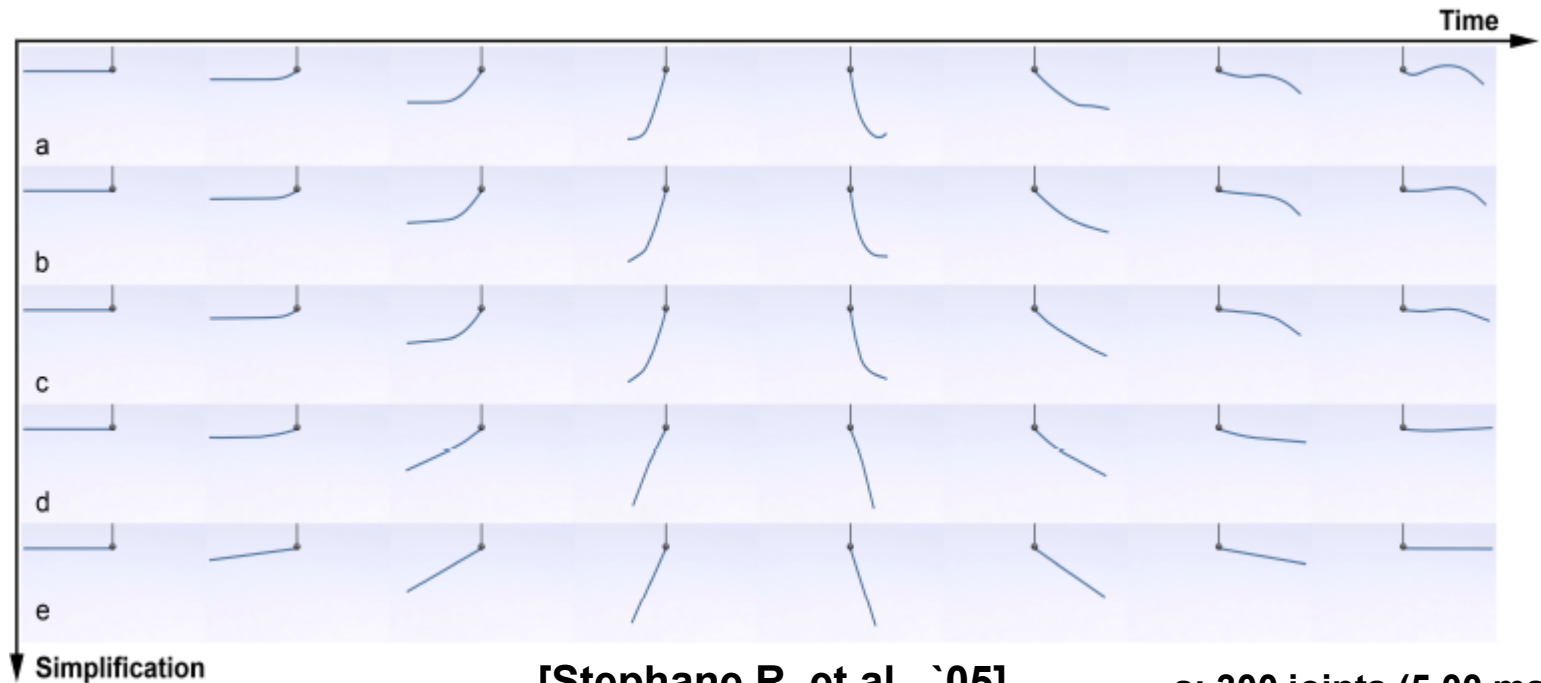
$$f_1^B = W \Phi_{21}^A f_1^A - W \Phi_{12}^B f_2^B + \gamma$$

$$f_2^A = -f_1^B$$

$$\begin{bmatrix} a_1^A \\ a_2^A \end{bmatrix} = \begin{bmatrix} \Phi_1^A & \Phi_{12}^A \\ \Phi_{21}^A & \Phi_2^A \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^A \end{bmatrix} + \begin{bmatrix} b_1^A \\ b_2^A \end{bmatrix}$$

$$\begin{bmatrix} a_1^B \\ a_2^B \end{bmatrix} = \begin{bmatrix} \Phi_1^B & \Phi_{12}^B \\ \Phi_{21}^B & \Phi_2^B \end{bmatrix} \begin{bmatrix} f_1^B \\ f_2^B \end{bmatrix} + \begin{bmatrix} b_1^B \\ b_2^B \end{bmatrix}$$

# Adaptive Forward Dynamics



a: 300 joints (5.00 ms)

b: 100 joints (1.70 ms)

c: 50 joints (0.70 ms)

d: 20 joints (0.25 ms)

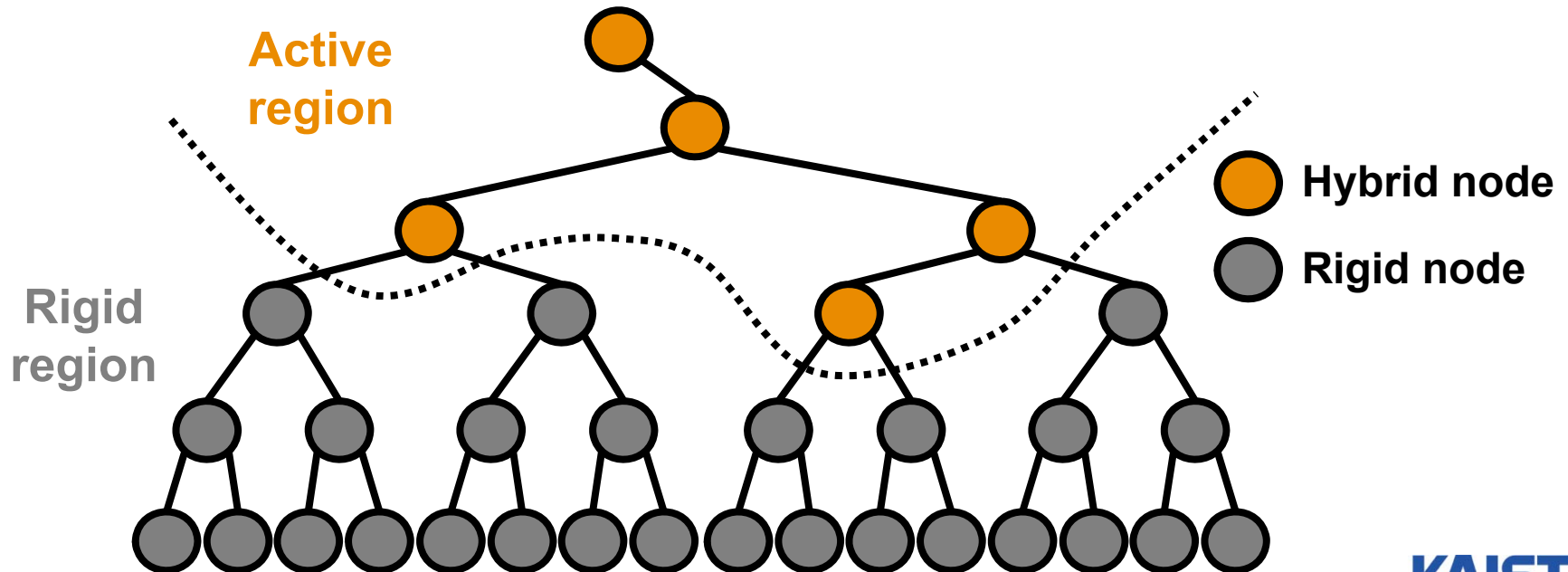
e: 1 joints (0.02 ms)

***We don't need to simulate all of the joints of an articulated body to keep its plausible dynamics!!***

# Adaptive Forward Dynamics

- **Hybrid bodies**

- **Hybrid node:** its principal joint is active (simulated) but some descendants are rigid
- **Rigid node:** its principal joint is inactive and all the descendants are rigid / it is a leaf

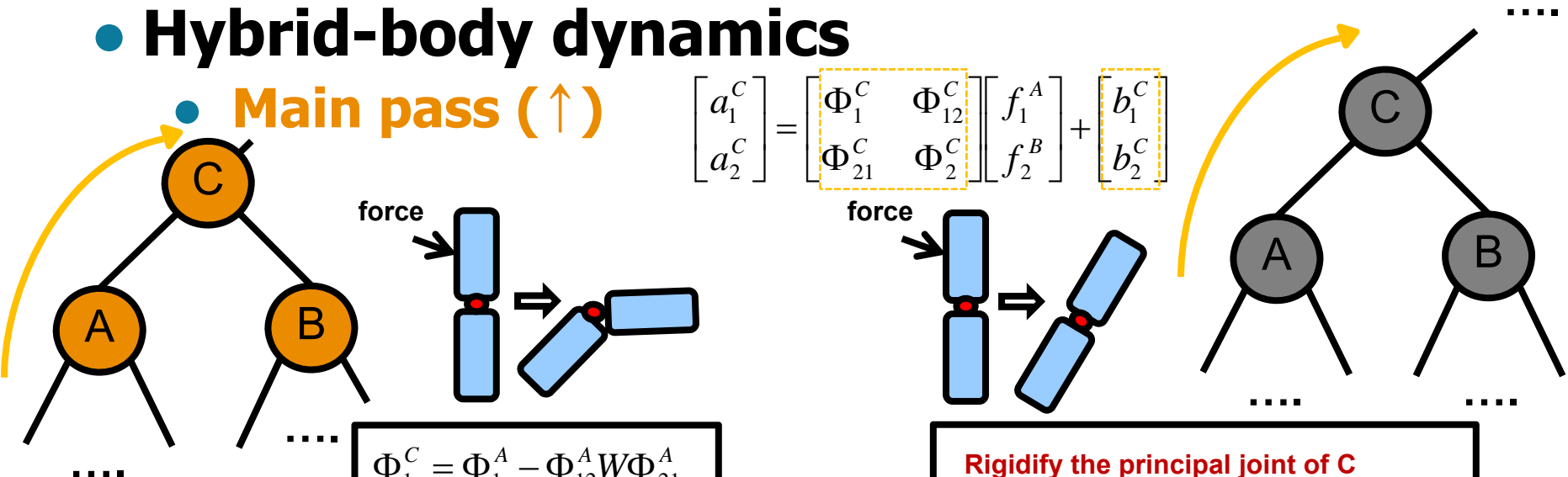


# Adaptive Forward Dynamics

- Hybrid-body dynamics

- Main pass (↑)

$$\begin{bmatrix} a_1^C \\ a_2^C \end{bmatrix} = \begin{bmatrix} \Phi_1^C & \Phi_{12}^C \\ \Phi_{21}^C & \Phi_2^C \end{bmatrix} \begin{bmatrix} f_1^A \\ f_2^B \end{bmatrix} + \begin{bmatrix} b_1^C \\ b_2^C \end{bmatrix}$$



Inverse inertias

$$\begin{aligned} \Phi_1^C &= \Phi_1^A - \Phi_{12}^A W \Phi_{21}^A \\ \Phi_2^C &= \Phi_2^B - \Phi_{21}^B W \Phi_{12}^B \\ \Phi_{21}^C &= \Phi_{21}^B W \Phi_{21}^A \\ \Phi_{12}^C &= (\Phi_{21}^C)^T \end{aligned}$$

Bias accelerations

$$\begin{aligned} b_1^C &= b_1^A - \Phi_{12}^A \gamma \\ b_2^C &= b_2^B + \Phi_{21}^B \gamma \end{aligned}$$

Rigidify the principal joint of C

$$\begin{aligned} \Phi_i^C &= \Phi_{ij}^C = \Phi^C \\ \Phi^C &= \Phi^B (\Phi^A + \Phi^B)^{-1} \Phi^A \end{aligned}$$

$$b_i^C = b_{ij}^C = b^C$$

$$b^C = b^A - \Phi^A (\Phi^A + \Phi^B)^{-1} (b^A - b^B)$$

Rigidification



C can be rigidified only if C's principal joint is inactive and both its children A and B are rigid nodes



# Adaptive Forward Dynamics

- Adaptive joint selection
  - Motion metrics
    - Acceleration metric

$$\mathcal{A}(C) = \begin{bmatrix} \mathbf{f}_1^A \\ \mathbf{f}_2^B \end{bmatrix}^T \begin{bmatrix} \Psi_1^C & \Psi_{12}^C \\ \Psi_{21}^C & \Psi_2^C \end{bmatrix} \begin{bmatrix} \mathbf{f}_1^A \\ \mathbf{f}_2^B \end{bmatrix} + \begin{bmatrix} \mathbf{f}_1^A \\ \mathbf{f}_2^B \end{bmatrix}^T \begin{bmatrix} \mathbf{p}_1^C \\ \mathbf{p}_2^C \end{bmatrix} + \eta^C,$$

$$\Psi_i^C, \Psi_{ij}^C, p_i^C, \eta^C$$

: Acceleration metric coefficients

- Velocity metric

$$\mathcal{V}(C) = \sum_{i \in C} \dot{\mathbf{q}}_i^T \mathbf{V}_i \dot{\mathbf{q}}_i$$

$C$  : Articulated body

$\dot{q}_i$  : Velocity of joint  $i$

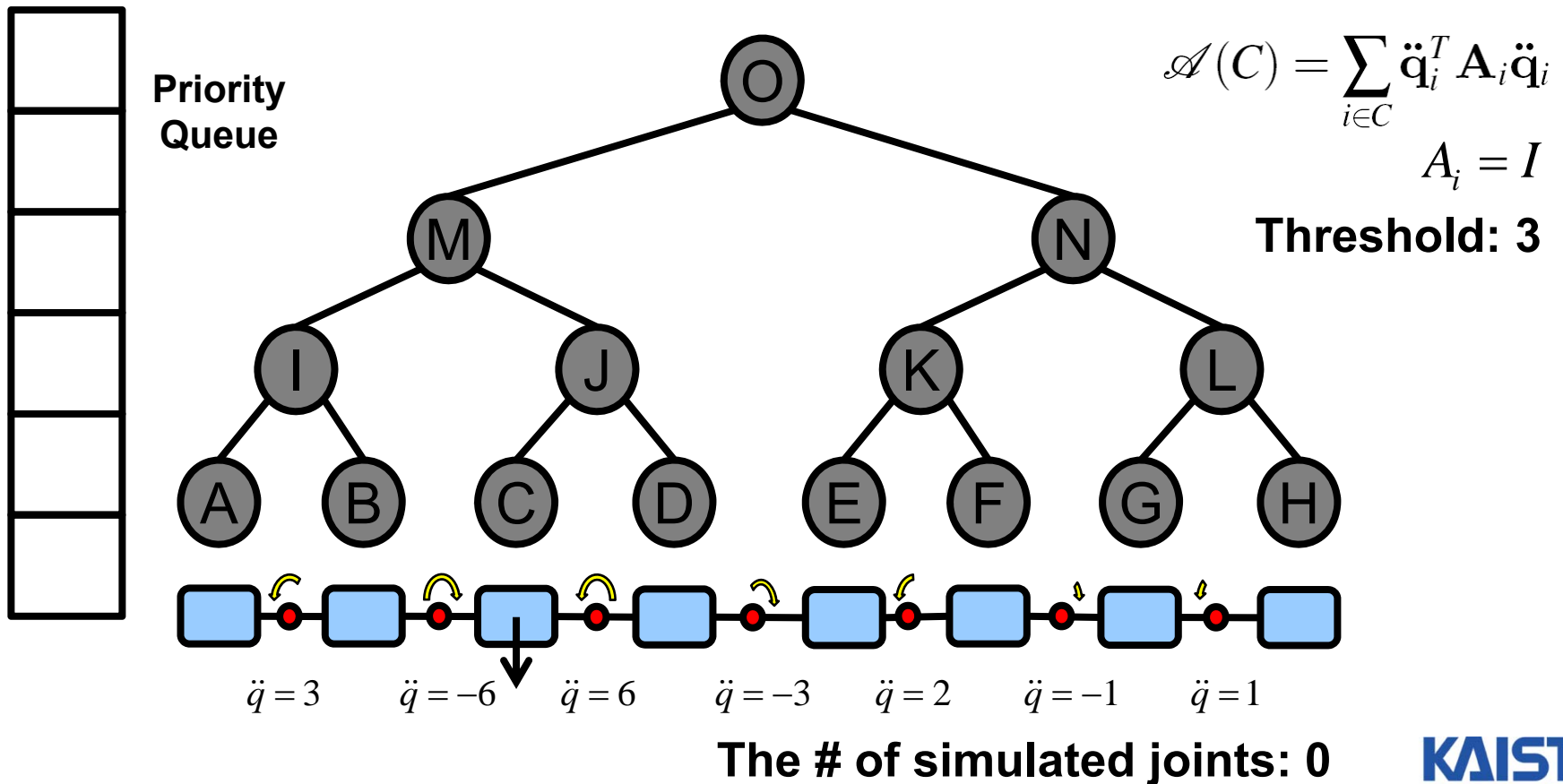
$\ddot{q}_i$  : Acceleration of joint  $i$

$A_i, V_i$  : Customizable weight matrices of joint  $i$

*The acceleration metric value of an articulated body can be computed before computing its joint accelerations!!*

# Adaptive Forward Dynamics

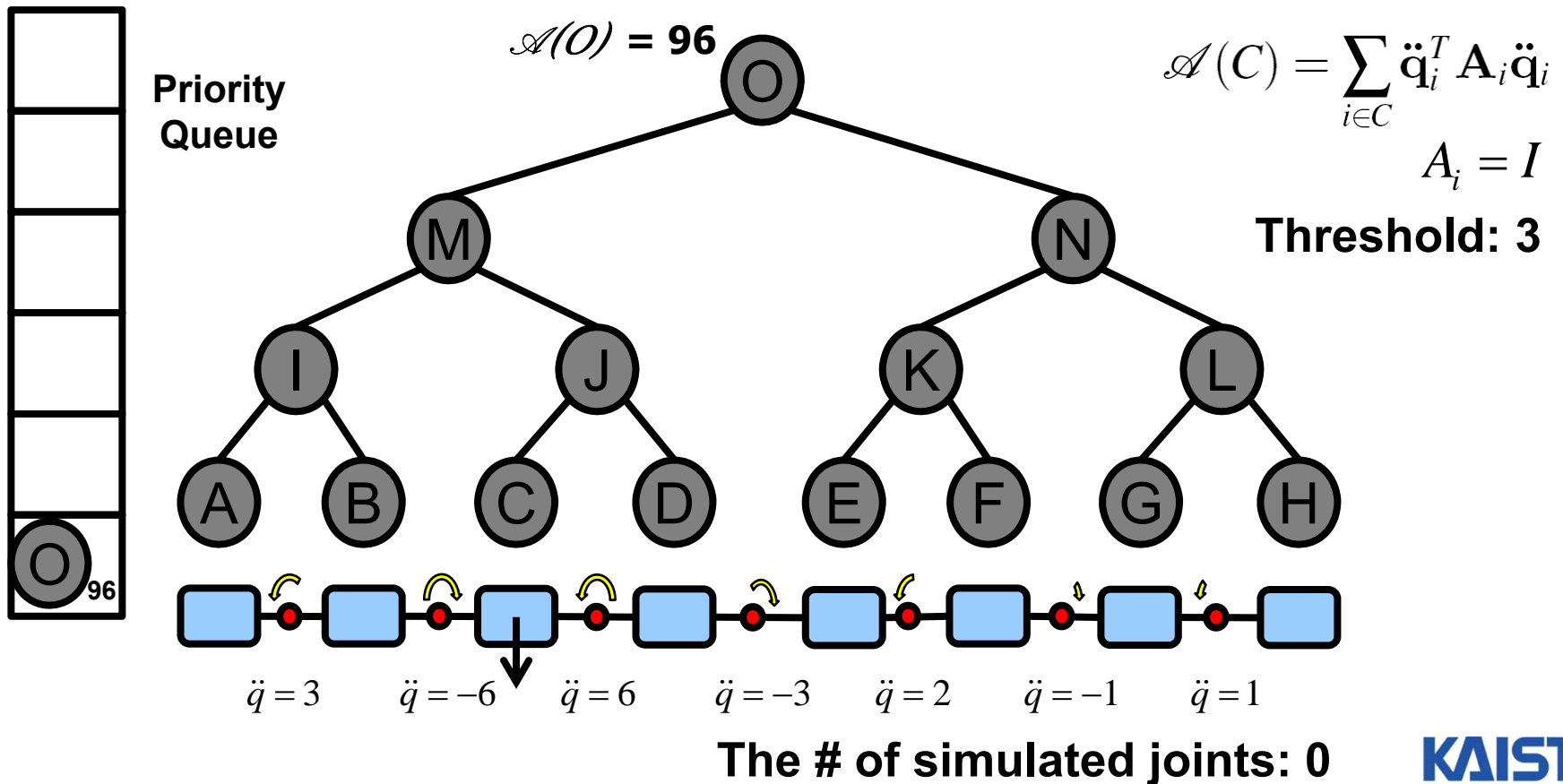
- Adaptive joint selection
  - Example: Back-substitution pass (↓)



# Adaptive Forward Dynamics

- Adaptive joint selection

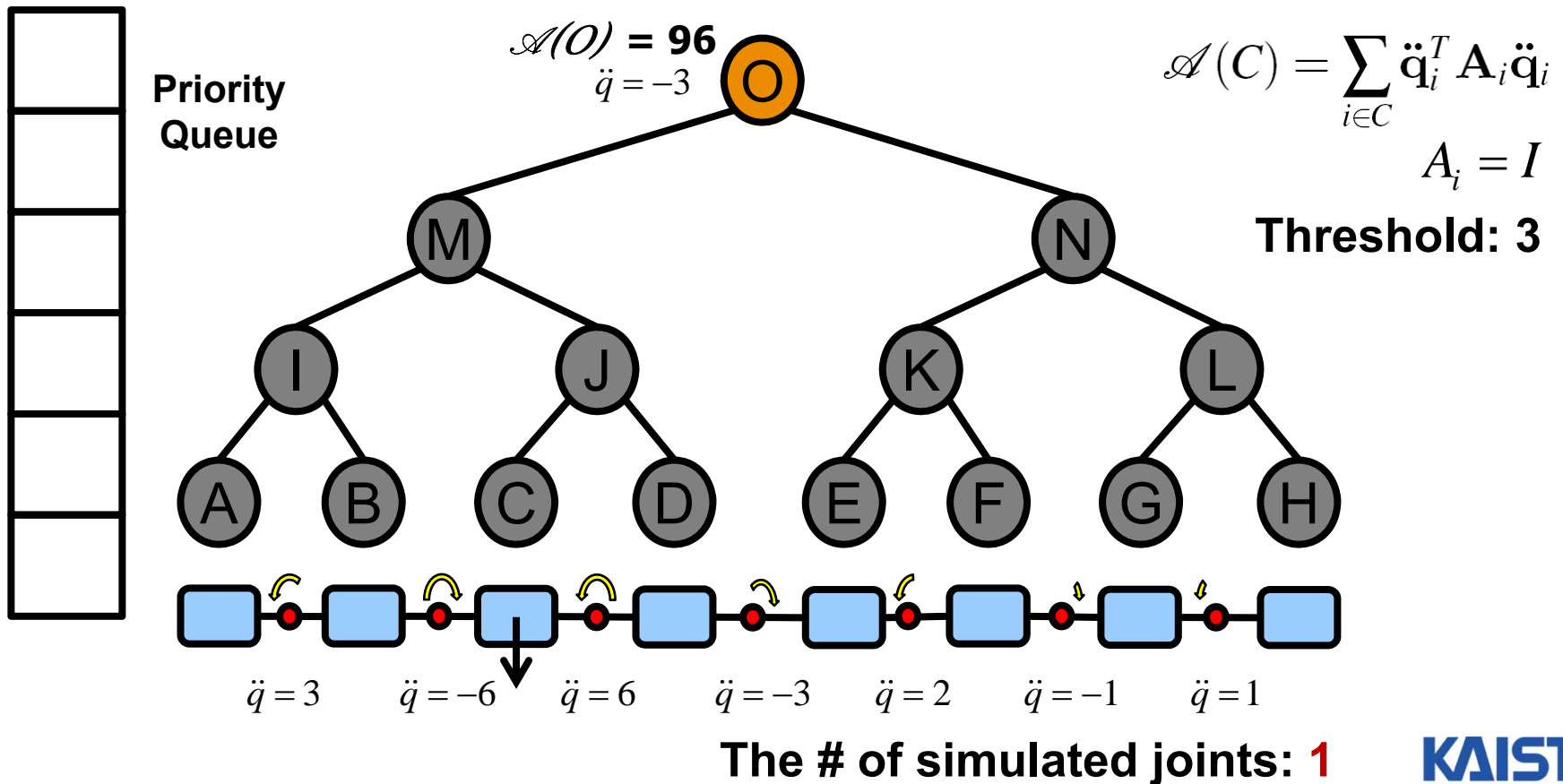
- Example: Back-substitution pass ( $\downarrow$ )



# Adaptive Forward Dynamics

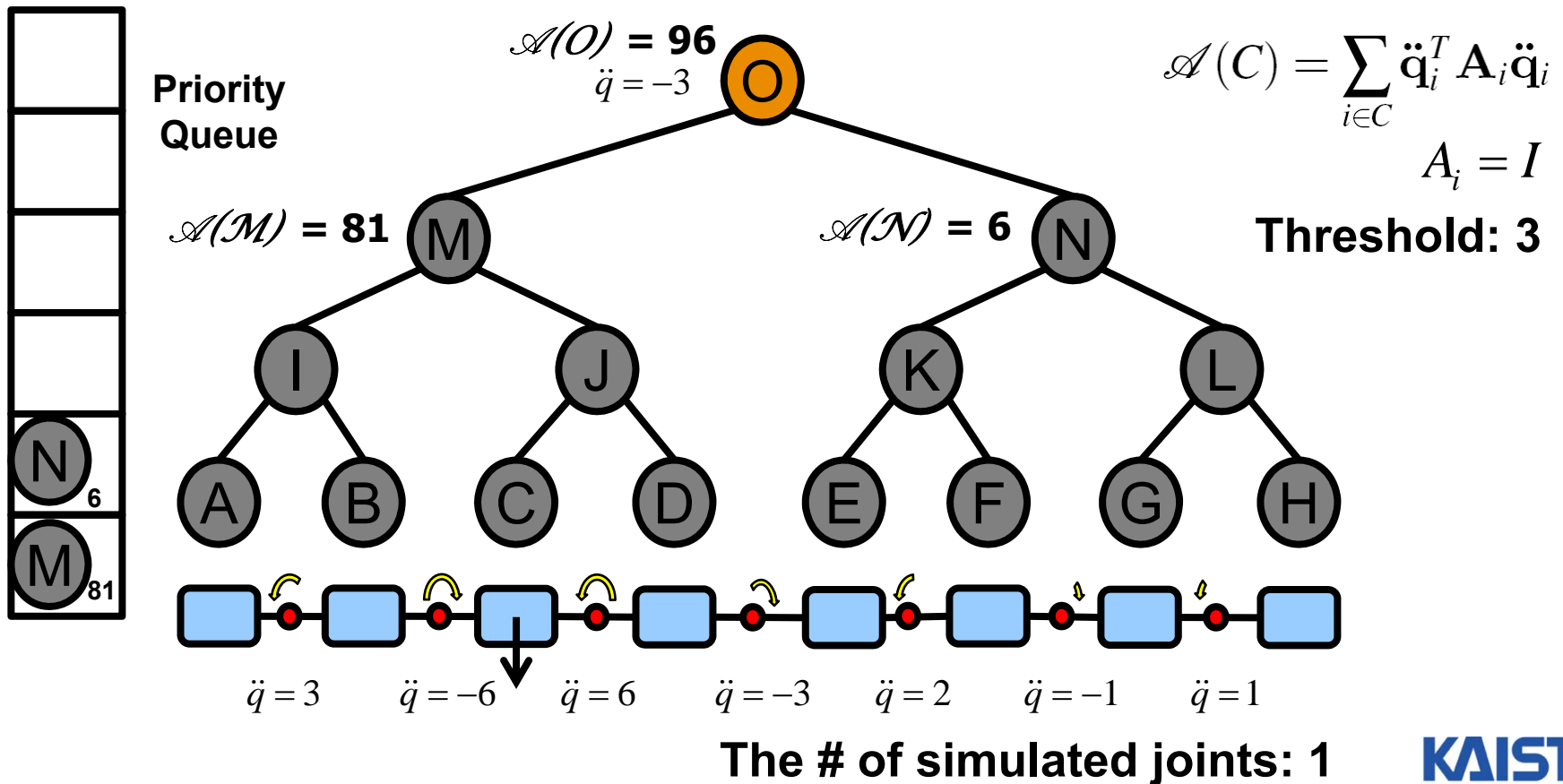
- Adaptive joint selection

- Example: Back-substitution pass ( $\downarrow$ )



# Adaptive Forward Dynamics

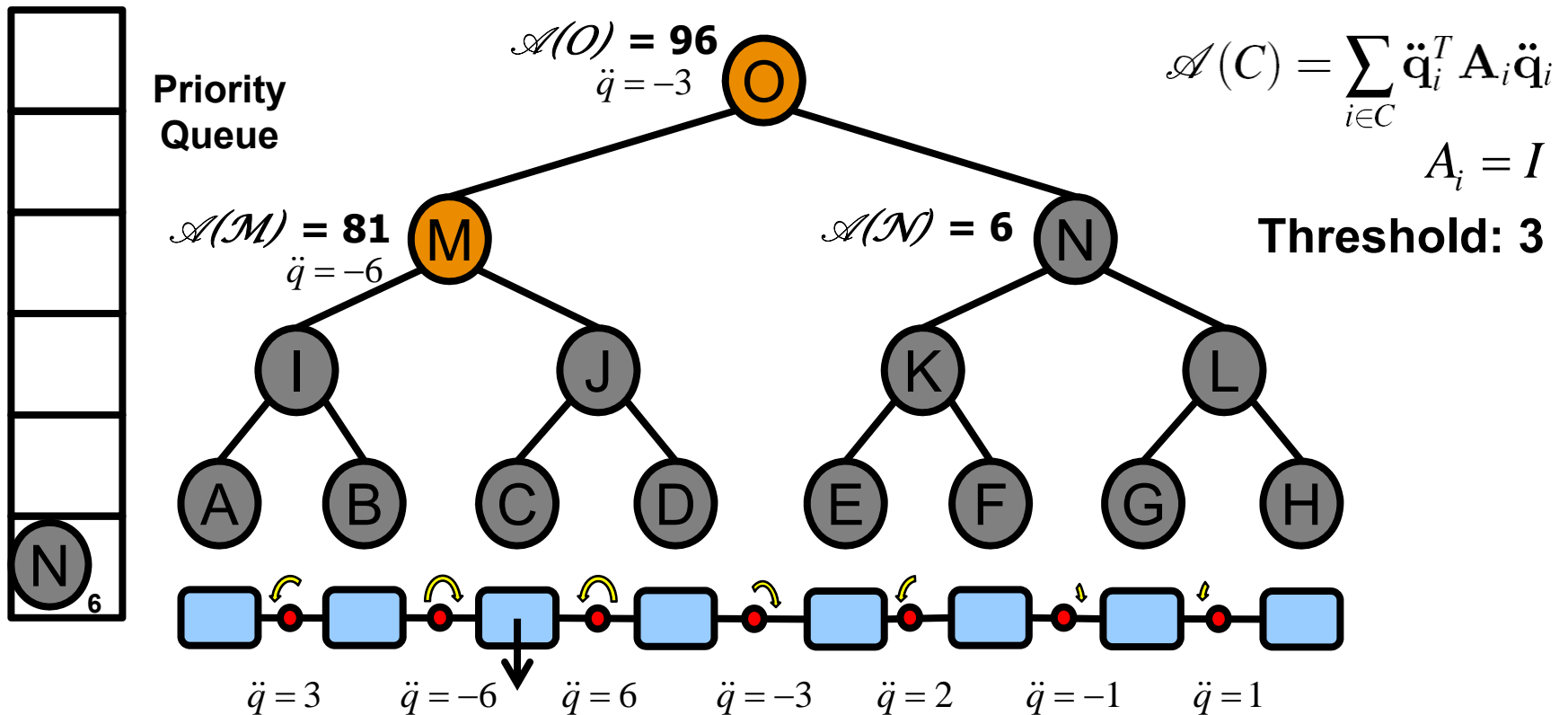
- Adaptive joint selection
  - Example: Back-substitution pass ( $\downarrow$ )



# Adaptive Forward Dynamics

- Adaptive joint selection

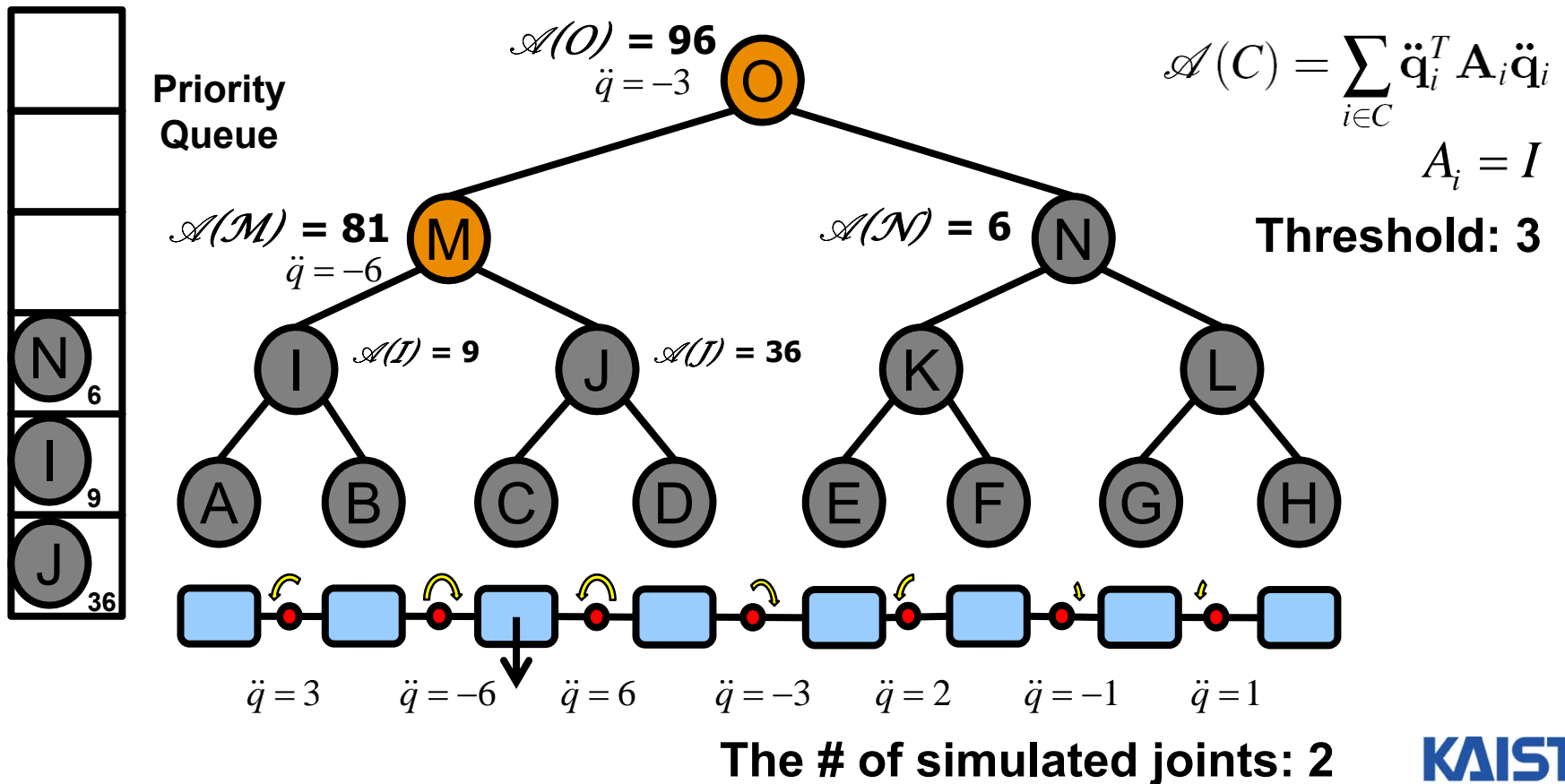
- Example: Back-substitution pass ( $\downarrow$ )



# Adaptive Forward Dynamics

- Adaptive joint selection

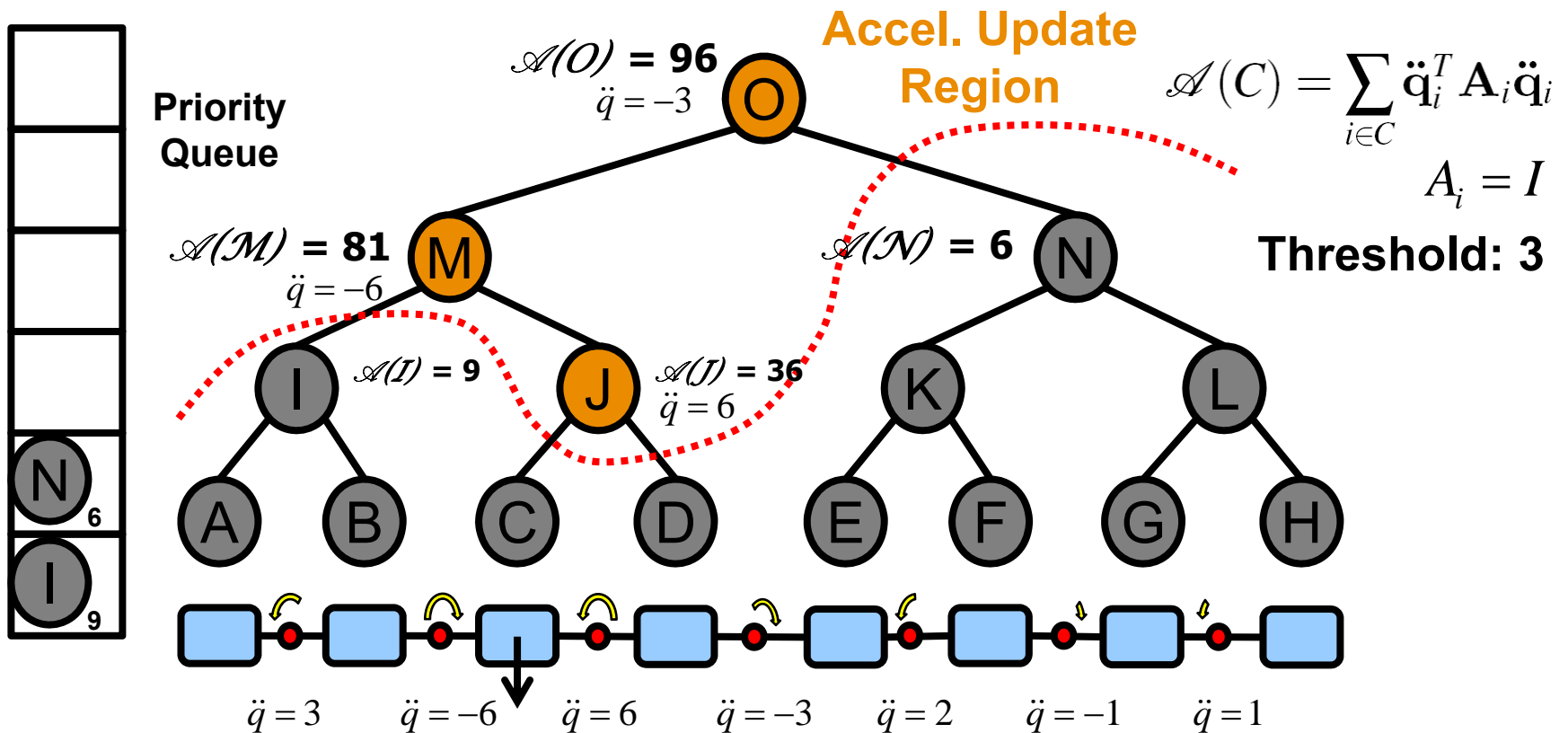
- Example: Back-substitution pass ( $\downarrow$ )



# Adaptive Forward Dynamics

- Adaptive joint selection

- Example: Back-substitution pass ( $\downarrow$ )



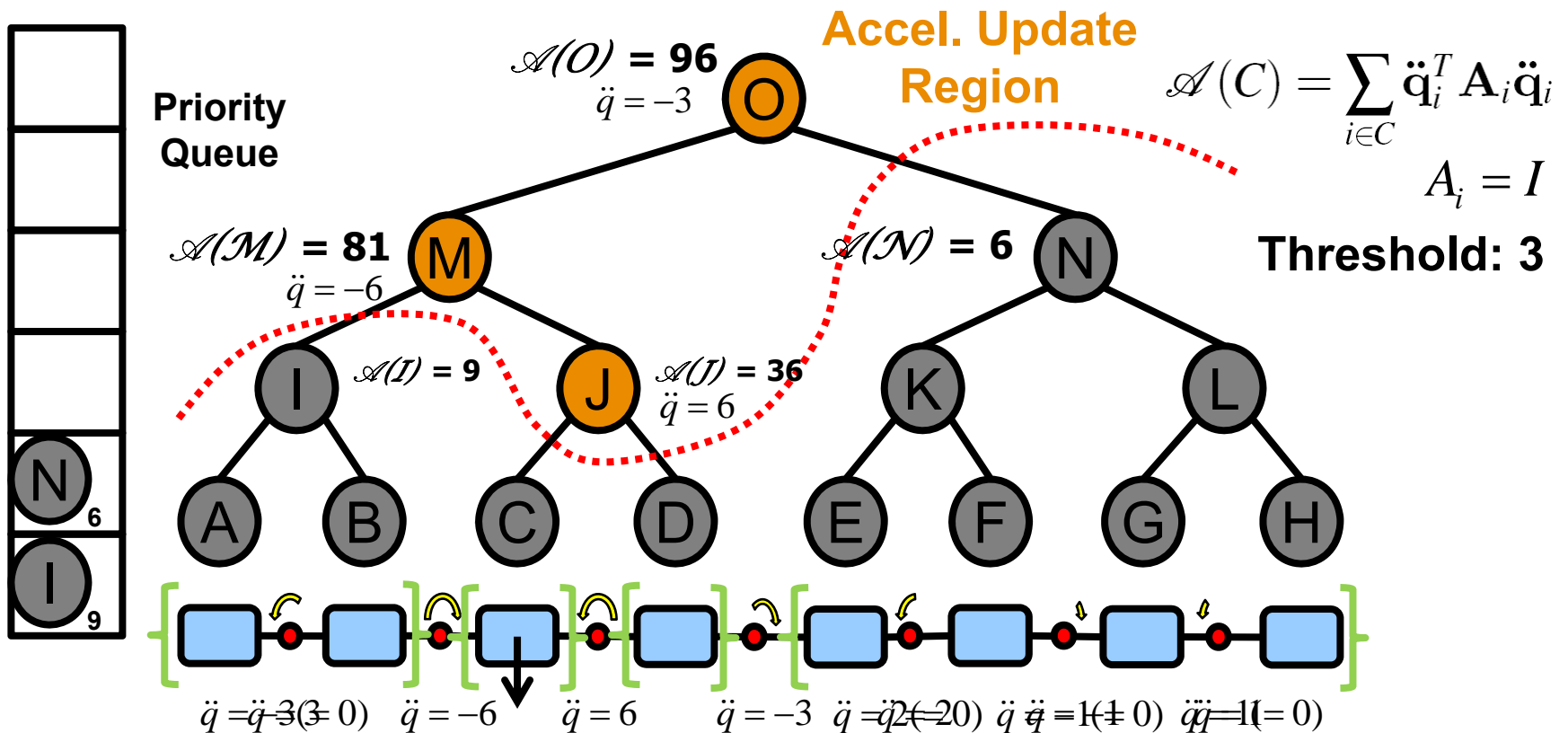
The # of simulated joints: 3



# Adaptive Forward Dynamics

- Adaptive joint selection

- Example: Back-substitution pass ( $\downarrow$ )

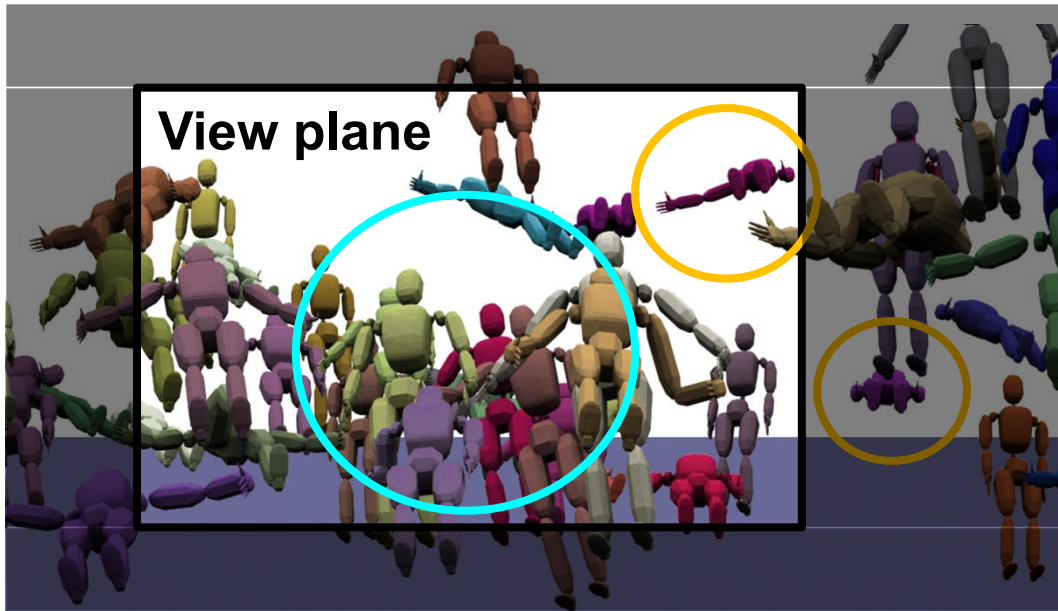


The accelerations of joints within four assemblies are *implicitly* set to zero.

The # of simulated joints: 3

# View-Dependent Forward Dynamics

- How to best utilize the motion metrics to save more computation time?
- How to minimize the error metric values with a given threshold value?



Large-scale virtual world

*Much occlusion*  
*Very far objects*  
*Many invisible objects*

# View-Dependent Forward Dynamics

---

---

- **How to best utilize the motion metrics to save more computation time?**
- **Occluded bodies**
  - **Decrease weight coefficients for occluded bodies**

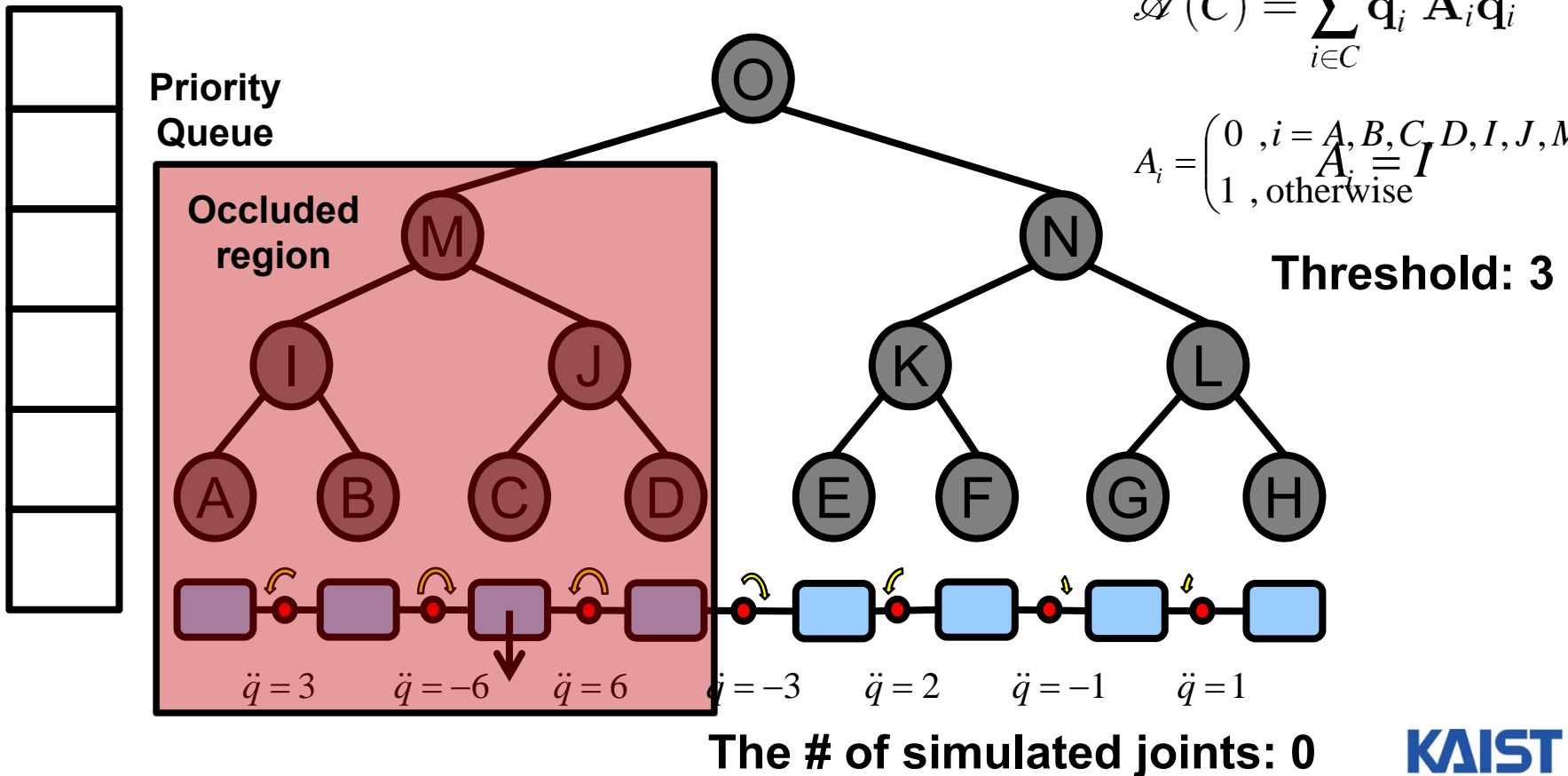
# View-Dependent Forward Dynamics

- **View-dependent joint selection**

- **Example: Back-substitution pass ( $\downarrow$ )**

$$\mathcal{A}(C) = \sum_{i \in C} \ddot{q}_i^T A_i \ddot{q}_i$$

$$A_i = \begin{cases} 0, & i = A, B, C, D, I, J, M \\ A_i = I, & \text{otherwise} \end{cases}$$



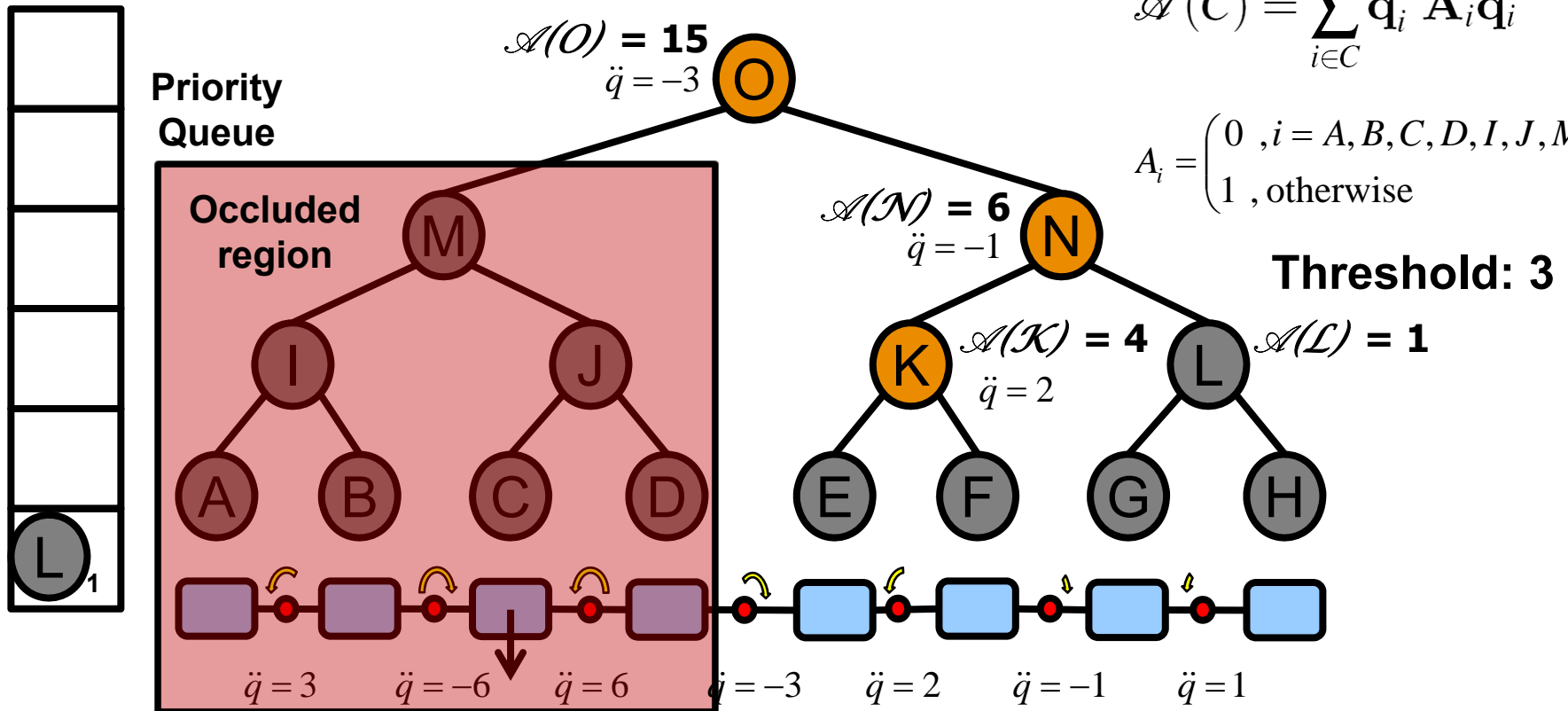
# View-Dependent Forward Dynamics

- **View-dependent joint selection**

- **Example: Back-substitution pass ( $\downarrow$ )**

$$\mathcal{A}(C) = \sum_{i \in C} \ddot{\mathbf{q}}_i^T \mathbf{A}_i \ddot{\mathbf{q}}_i$$

$$\mathbf{A}_i = \begin{cases} 0, & i = A, B, C, D, I, J, M \\ 1, & \text{otherwise} \end{cases}$$



The # of simulated joints: 3

# View-Dependent Forward Dynamics

---

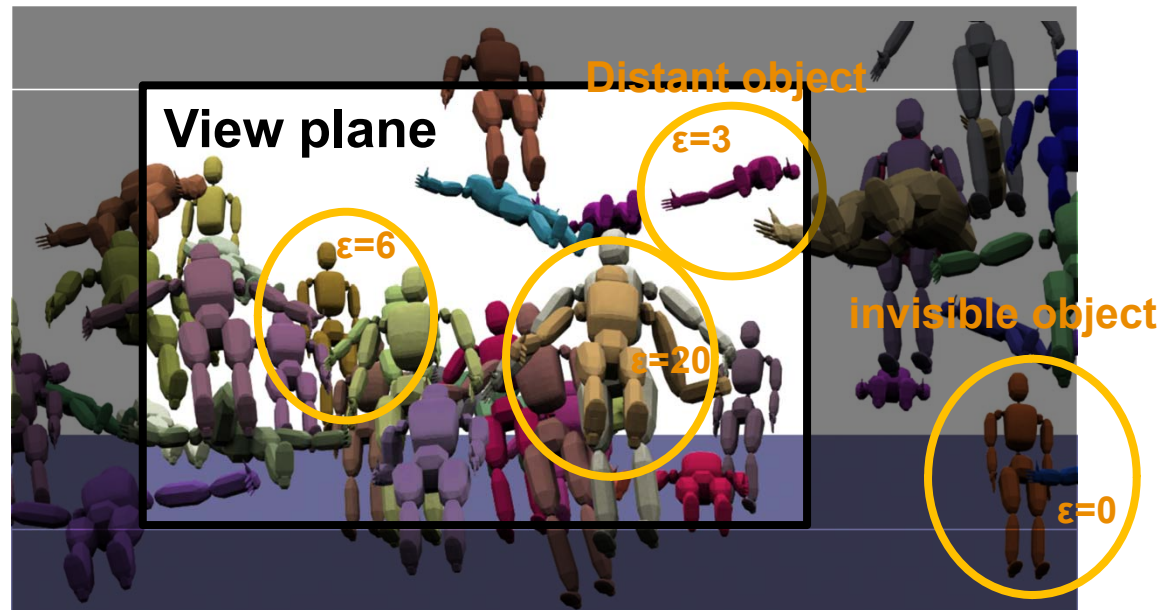
---

- **How to best utilize the motion metrics to save more computation time?**
- **Occluded bodies**
  - **Decrease weight coefficients for occluded bodies**
- **Totally invisible articulated bodies**
  - **Set the user-specified threshold value to zero**
- **Distant articulated bodies**
  - **Decrease the user-specified threshold value**

# View-Dependent Forward Dynamics

- Example

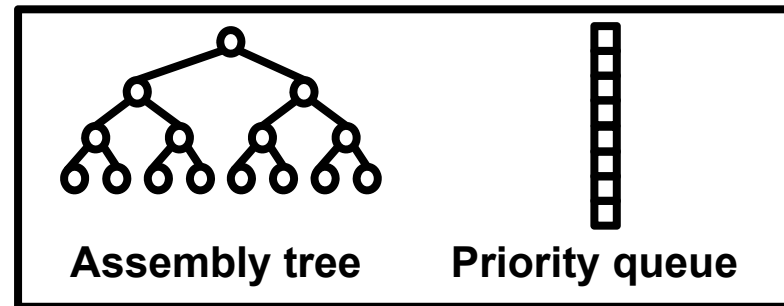
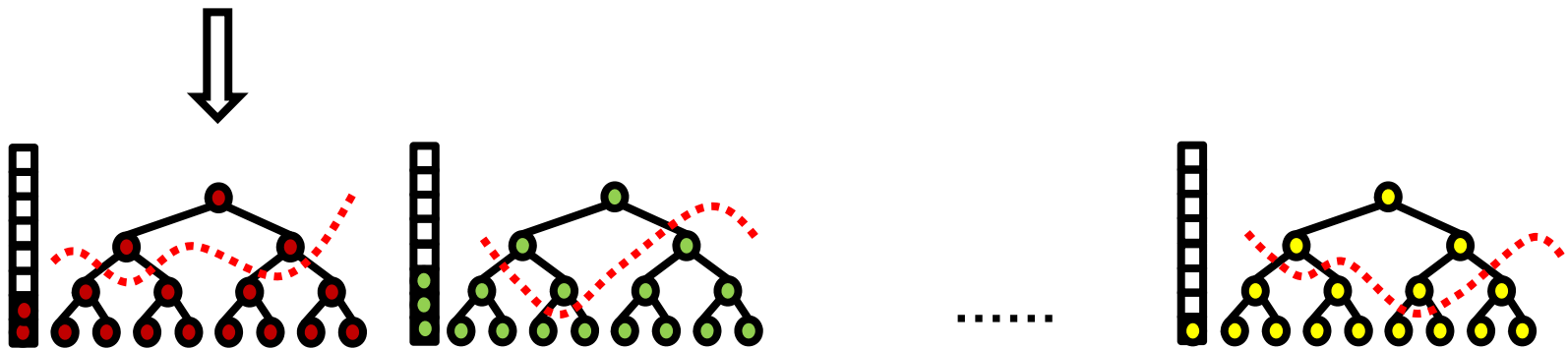
$\epsilon$ : threshold



# View-Dependent Forward Dynamics

- How to minimize the error metric values with a given threshold value?

Threshold: 100





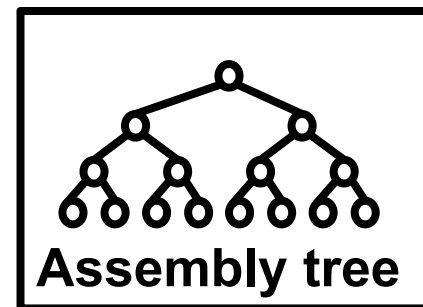
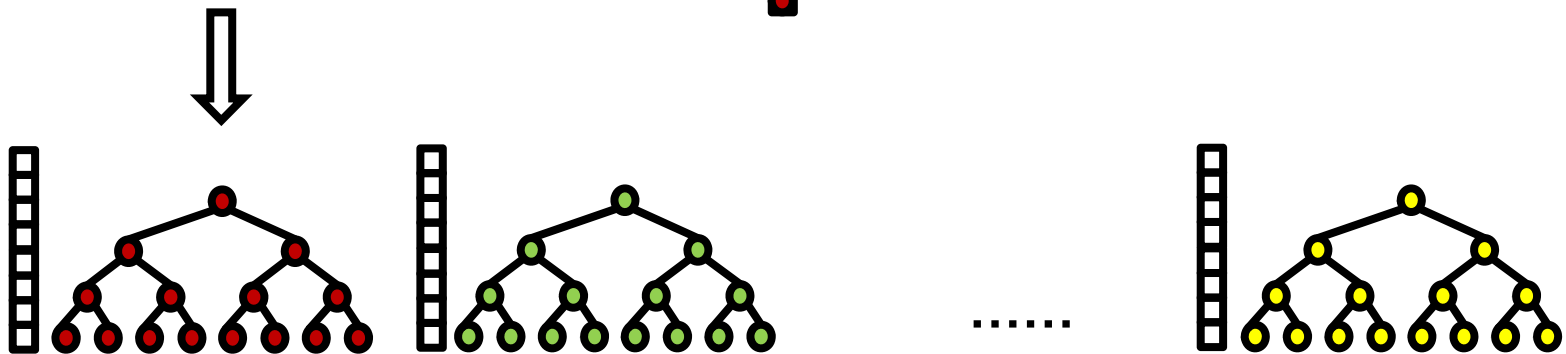
# View-Dependent Forward Dynamics

- How to minimize the error metric values with a given threshold value?

Threshold: 100



Global priority queue



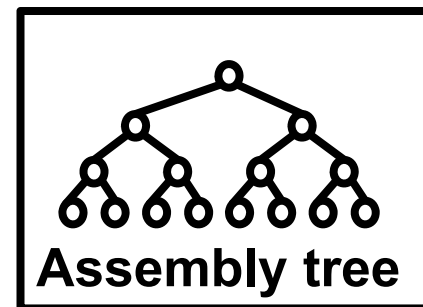
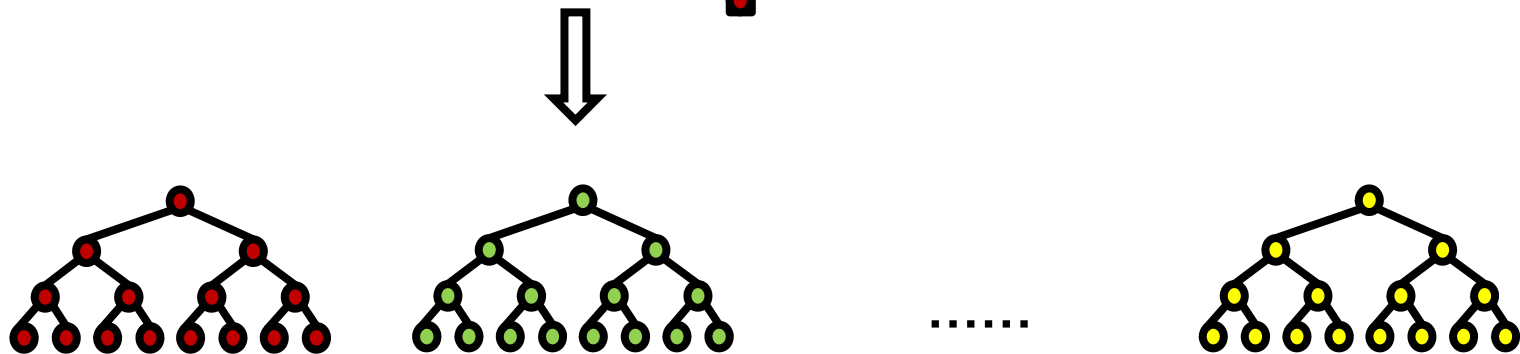
# View-Dependent Forward Dynamics

- How to minimize the error metric values with a given threshold value?

Threshold: 100



Global priority queue



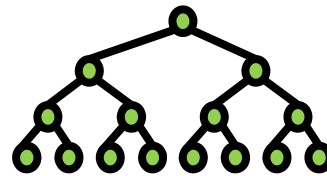
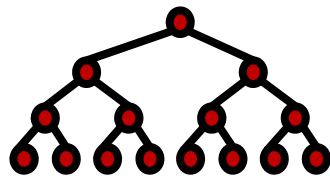
# View-Dependent Forward Dynamics

- How to minimize the error metric values with a given threshold value?

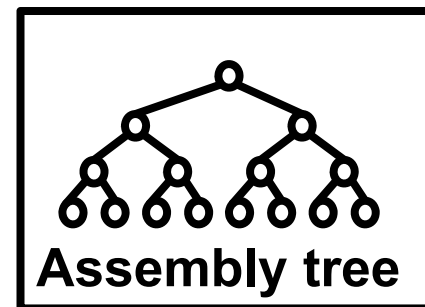
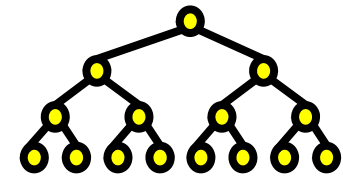
Threshold: 100



Global priority queue



.....



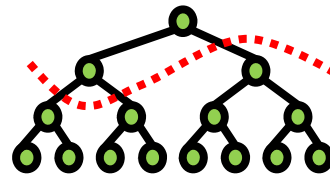
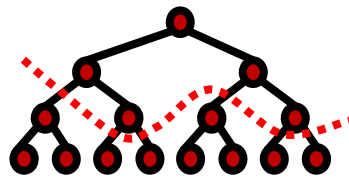
# View-Dependent Forward Dynamics

- How to minimize the error metric values with a given threshold value?

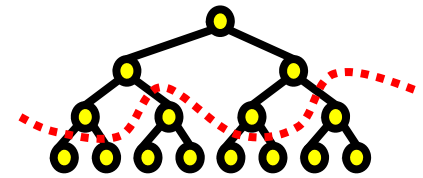
After all...



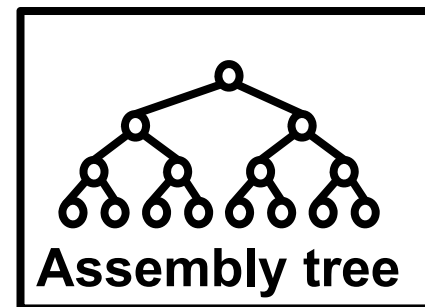
Global priority queue



.....



*The global search can minimize the global error metric value!*



# Conclusion

---

---

- **SLODs**
  - **Hybrid kinetic/dynamic model**
  - **Visibility culling**
    - **Consistency problem**
    - **Completeness problem**
  - **Adaptive forward dynamics**
    - **Control the number of simulated joints by the customizable motion metrics**
- **View-dependent forward dynamics**
  - **Effectively utilize the motion metrics with visibility info**

# DCA For Forward Dynamics

- **Appendix I**

- **Derivation of the articulated-body equation**

- I. Single handle**

$Iv = \text{constant}$

$$f = \frac{d}{dt}(Iv) = Ia + (v \times^* I - Iv \times)v = Ia + v \times^* Iv$$

$$f = Ia + p \quad (p = v \times^* Iv)$$

$$a = \Phi f + b \quad (\Phi = I^{-1}, b = -\Phi p)$$

- II. Multiple handles**

$$\begin{bmatrix} \mathbf{a}_1 \\ \mathbf{a}_2 \\ \vdots \\ \mathbf{a}_m \end{bmatrix} = \begin{bmatrix} \Phi_1 & \Phi_{12} & \cdots & \Phi_{1m} \\ \Phi_{21} & \Phi_2 & \cdots & \Phi_{2m} \\ \vdots & \vdots & \ddots & \vdots \\ \Phi_{m1} & \Phi_{m2} & \cdots & \Phi_m \end{bmatrix} \begin{bmatrix} \mathbf{f}_1 \\ \mathbf{f}_2 \\ \vdots \\ \mathbf{f}_m \end{bmatrix} + \begin{bmatrix} \mathbf{b}_1 \\ \mathbf{b}_2 \\ \vdots \\ \mathbf{b}_m \end{bmatrix}$$