

GAMES 105

Fundamentals of Character Animation

Lecture 04:

Character Kinematics (cont.) & Keyframe Animation

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GAMES105 课程交流



VCL @ PKU

Welcome & Course Information



群名称:GAME105课程交流群
群号:533469817

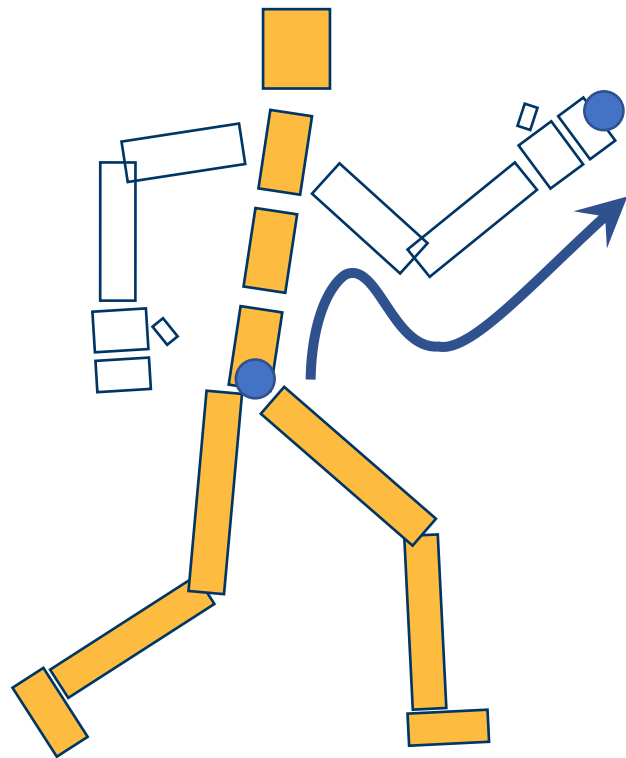
Lab 1 released

- Exercise:
 - Codebase: <https://github.com/GAMES-105/GAMES-105>
 - Submission: <http://cn.ces-alpha.org/course/register/GAMES-105-Animation-2022/>
 - Register code: **GAMES-FCA-2022**
- BBS: <https://github.com/GAMES-105/GAMES-105/discussions>
- QQ Group: 533469817

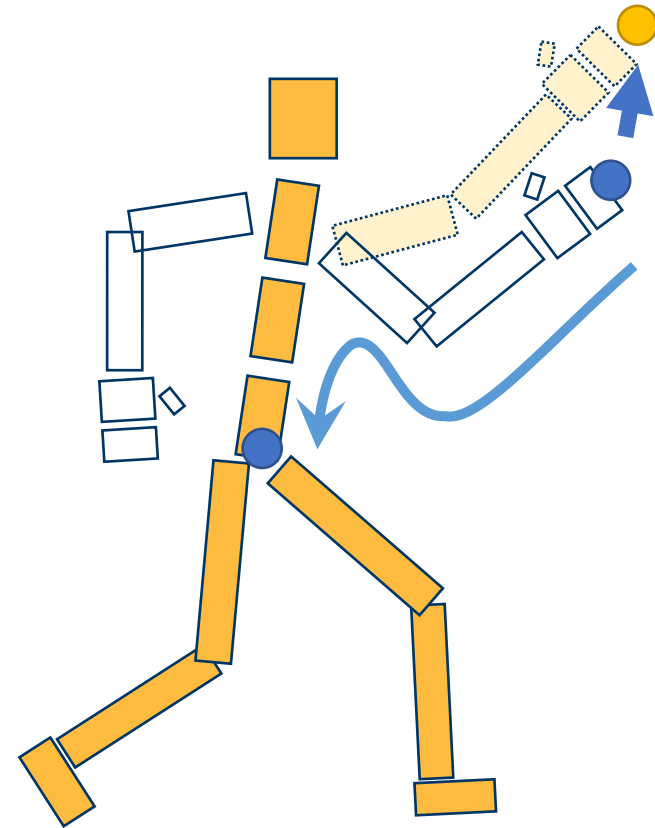
Outline

- Character Kinematics (cont.)
 - Motion Retargeting
 - Full-body IK
- Keyframe Animation
 - Interpolation and splines

Recap: Character Kinematics

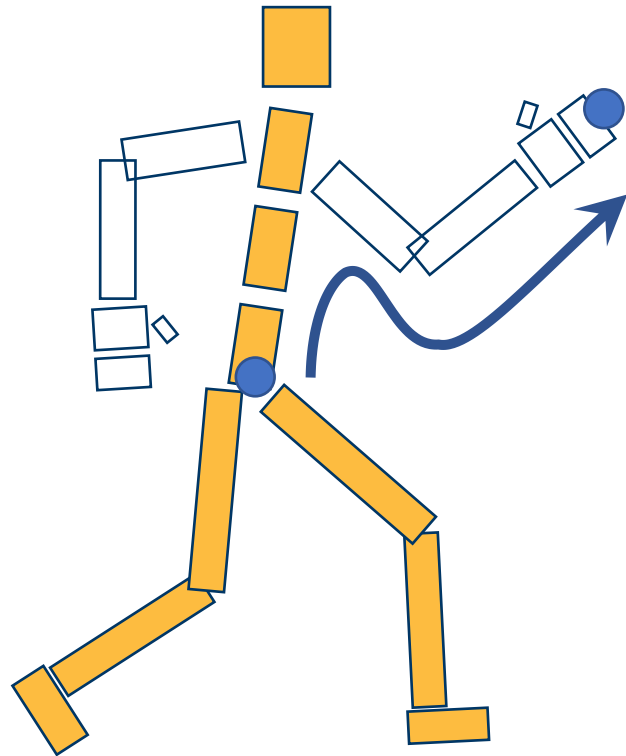


Forward Kinematics

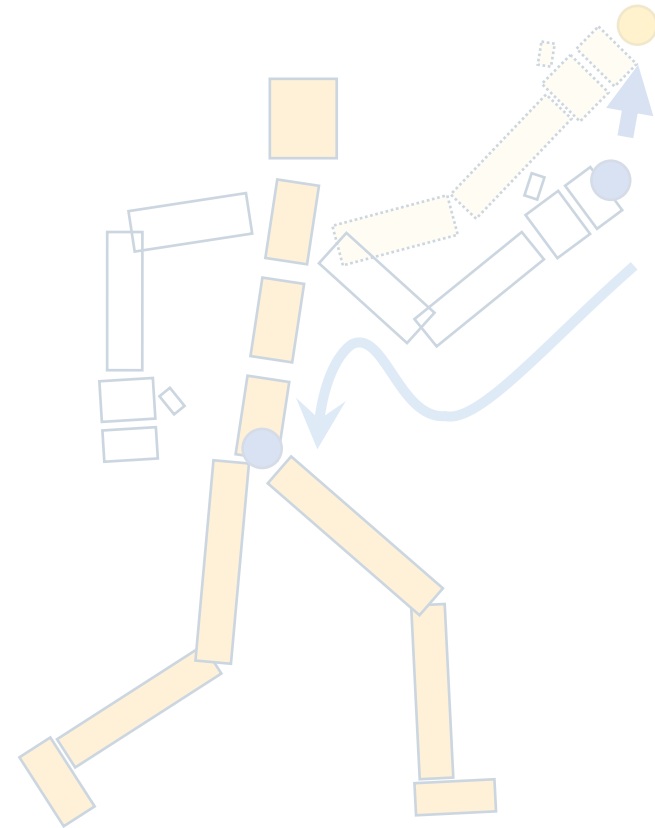


Inverse Kinematics

Recap: Character Kinematics

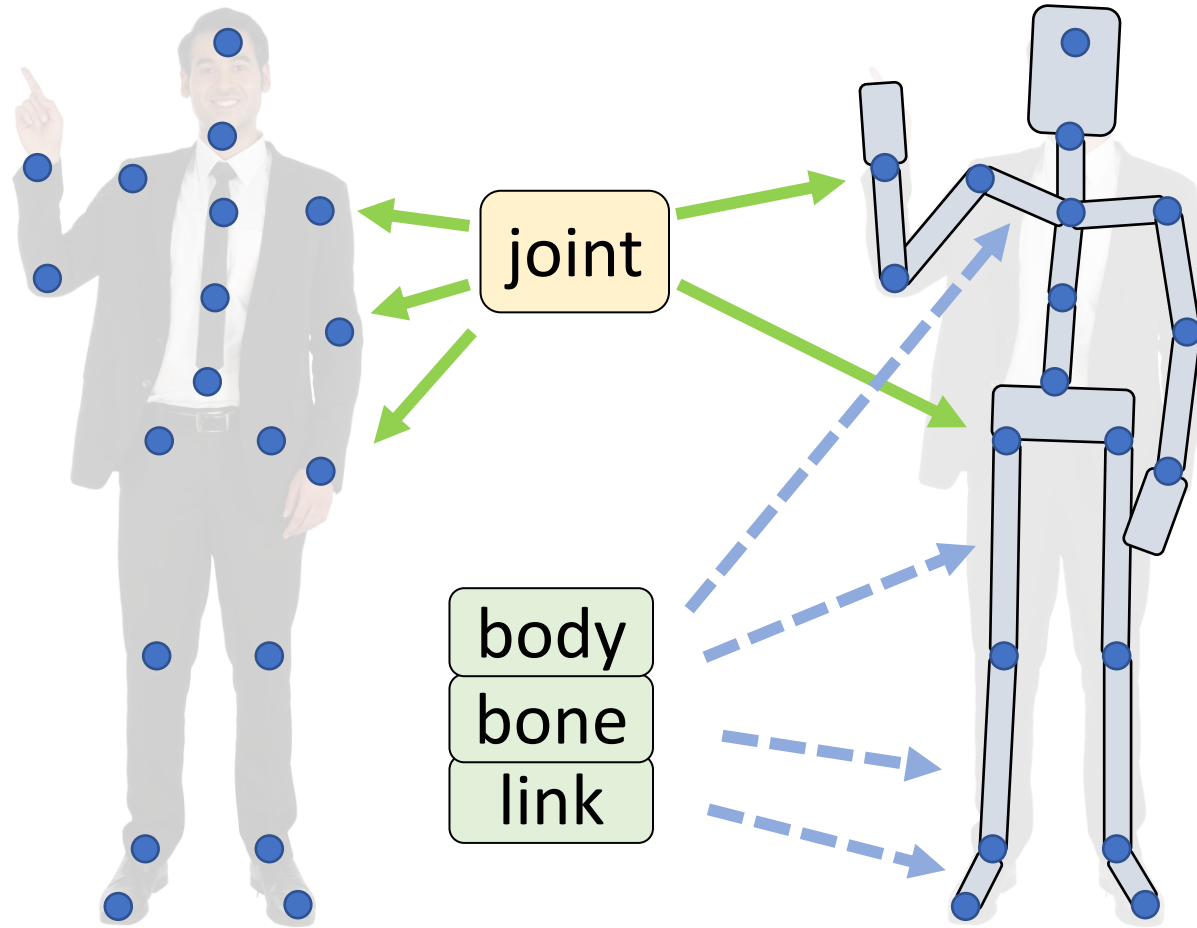


Forward Kinematics

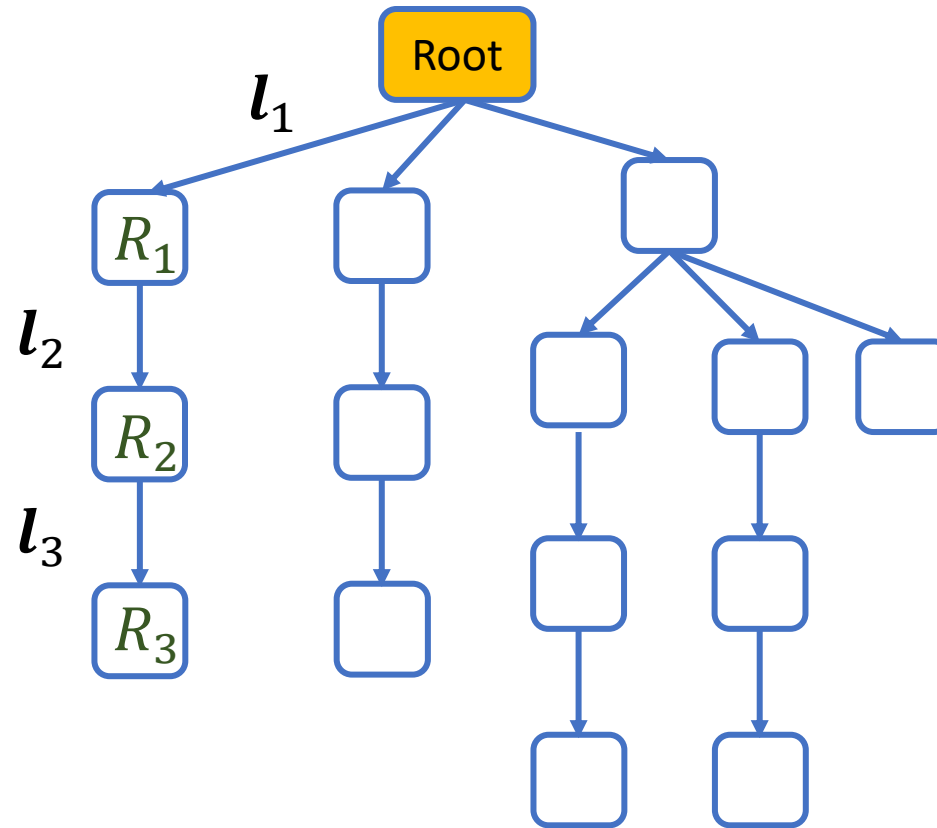
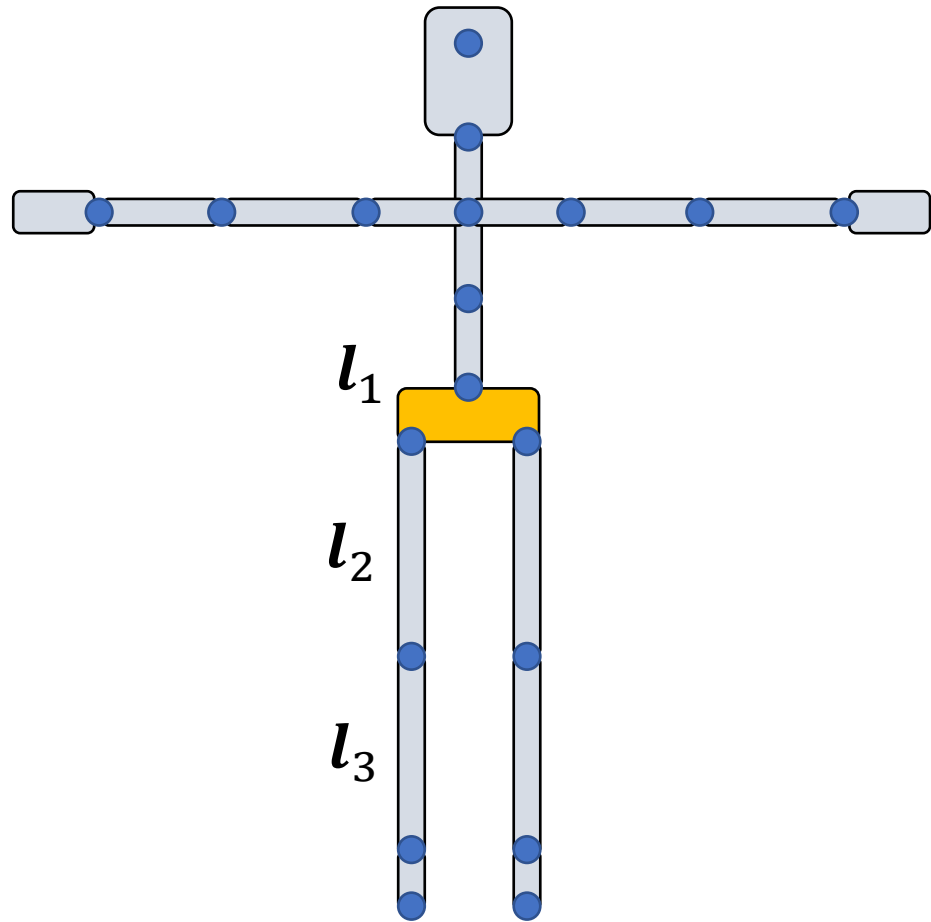


Inverse Kinematics

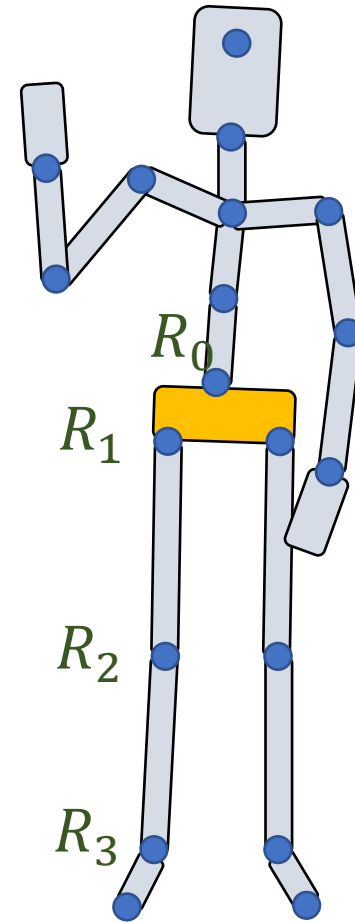
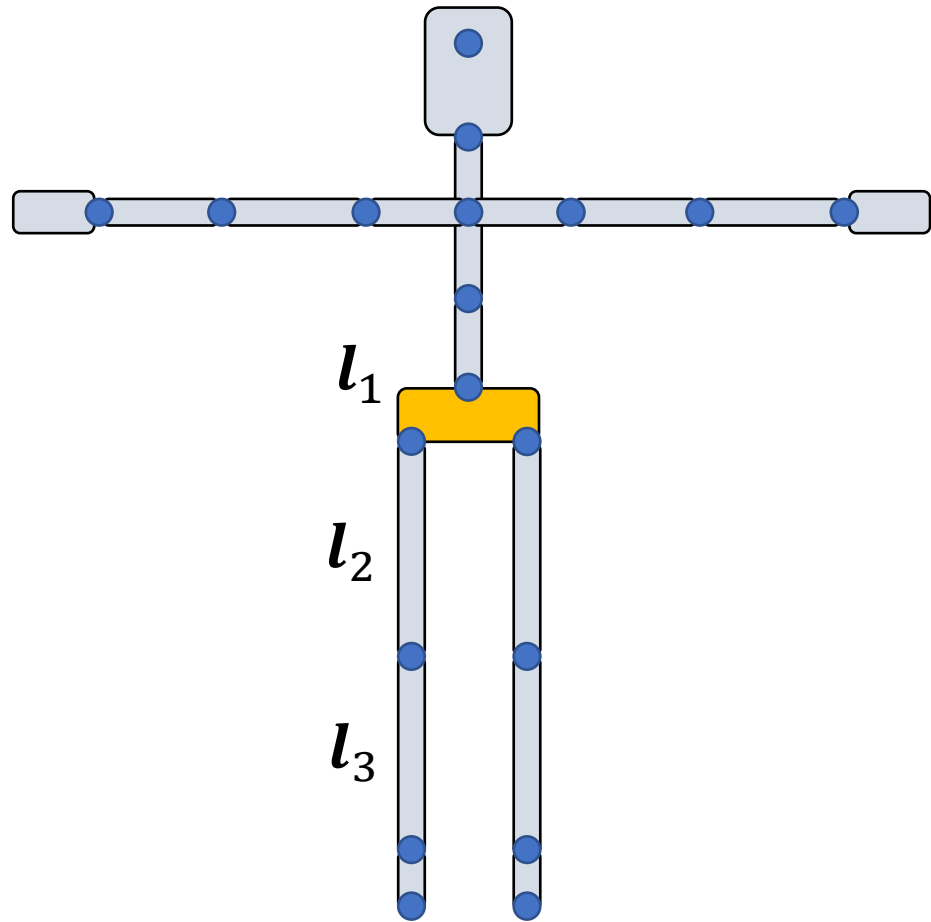
Recap: Forward Kinematics



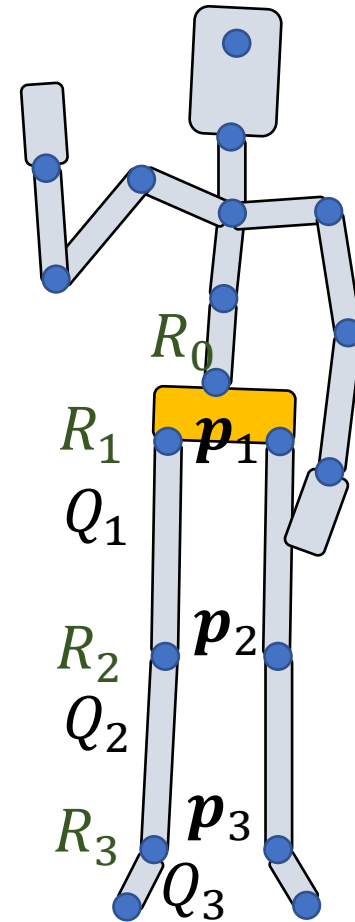
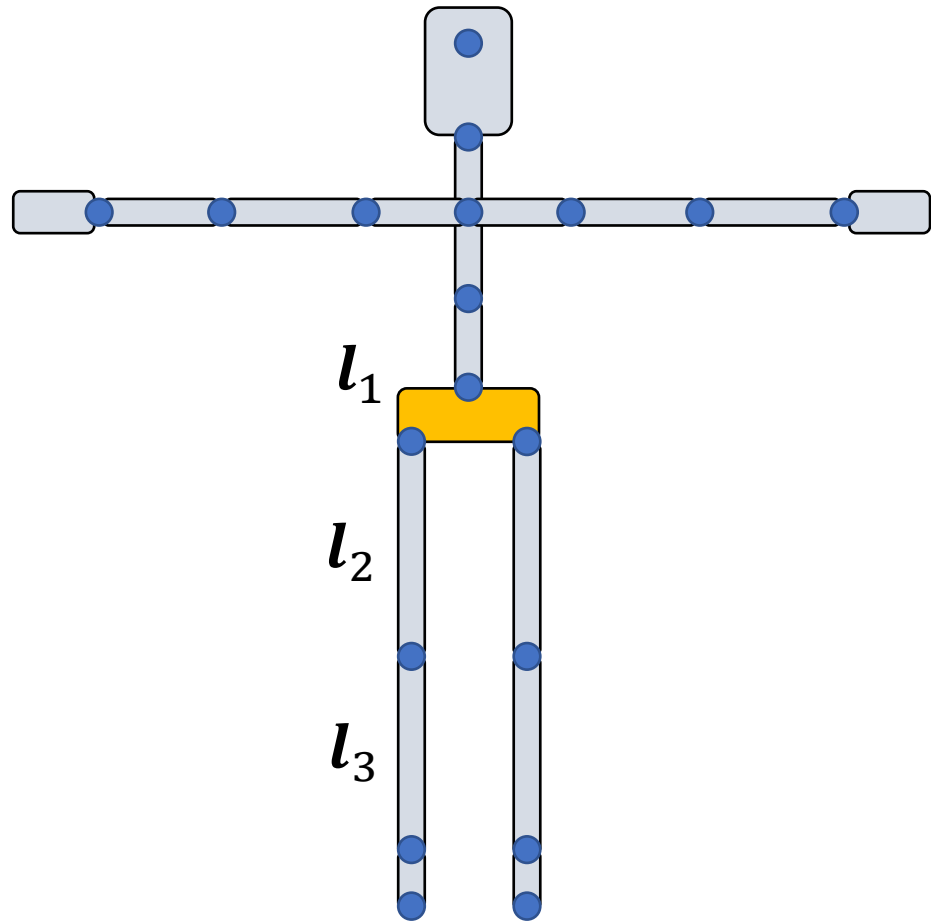
Recap: Skeleton



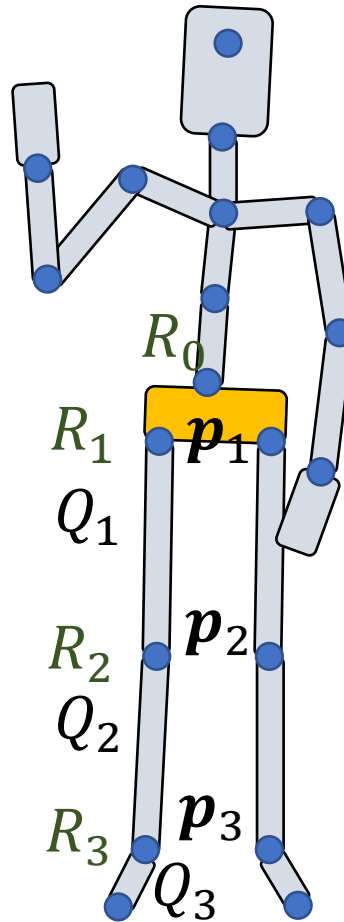
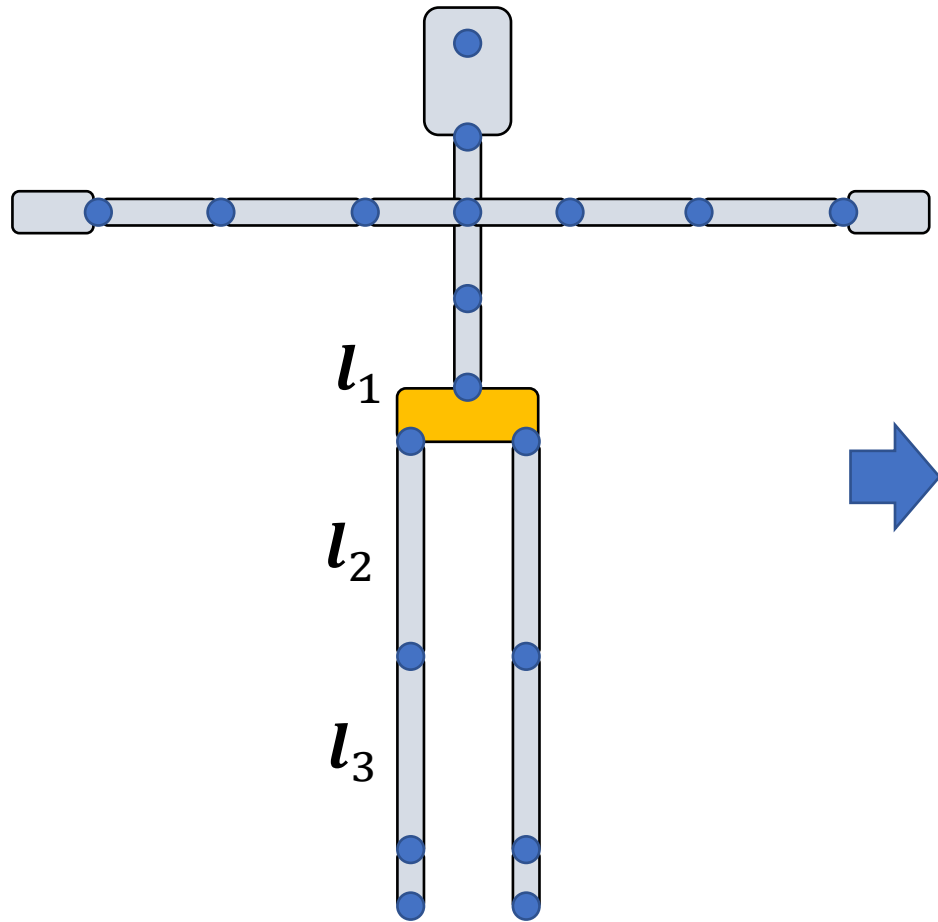
Recap: Forward Kinematics



Recap: Forward Kinematics



Recap: Forward Kinematics



$$Q_0 = R_0$$

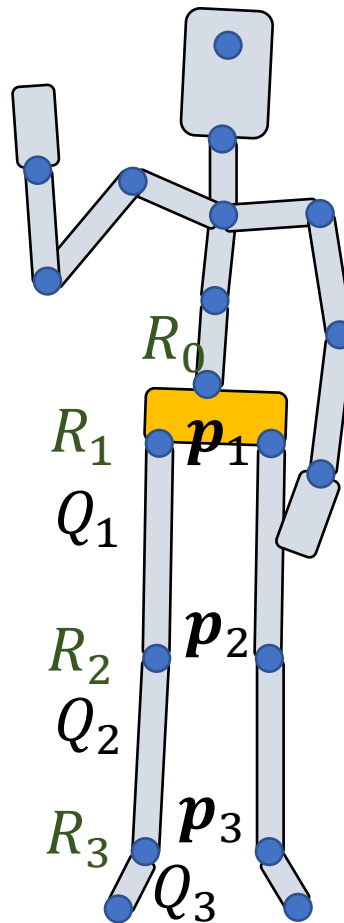
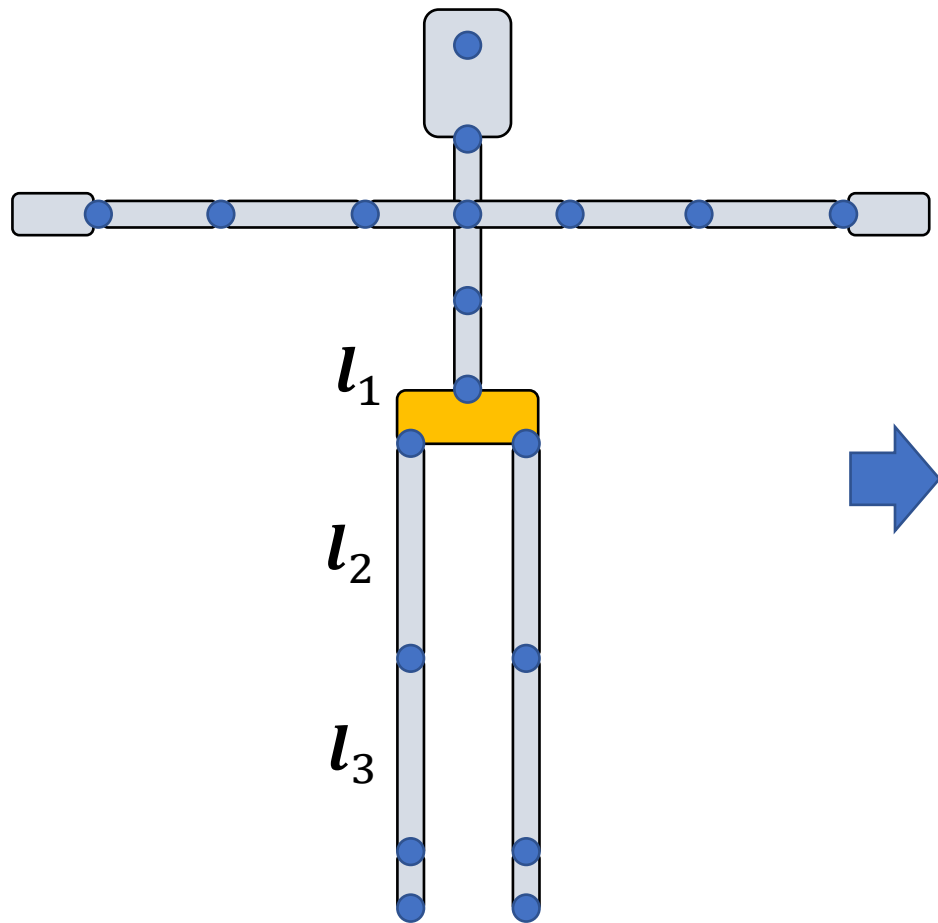
$$Q_1 = R_0 R_1 = Q_0 R_1$$

$$Q_2 = R_0 R_1 R_2 = Q_1 R_2$$

$$p_1 = p_0 + Q_0 l_1$$

$$p_2 = p_0 + Q_0 l_1 + Q_1 l_2$$
$$= p_1 + Q_1 l_2$$

Recap: Forward Kinematics



$$Q_0 = R_0$$

$$Q_1 = R_0R_1 = Q_0R_1$$

$$Q_2 = R_0R_1R_2 = Q_1R_2$$

$$\mathbf{p}_1 = \mathbf{p}_0 + Q_0\mathbf{l}_1$$

$$\begin{aligned}\mathbf{p}_2 &= \mathbf{p}_0 + Q_0\mathbf{l}_1 + Q_1\mathbf{l}_2 \\ &= \mathbf{p}_1 + Q_1\mathbf{l}_2\end{aligned}$$

$$R_1 = Q_0^{-1}Q_1$$

$$R_2 = Q_1^{-1}Q_2$$

Recap: motion data in a file

- BVH files

- One of the most-used file format for motion data
- View in blender, FBX review, Motion Builder, etc.
- Text-based, easy to read and edit

- Format

- HIERARCHY: defining **T-pose** of the character
- MOTION: root position and Euler angles of each joints

See: <https://research.cs.wisc.edu/graphics/Courses/cs-838-1999/Jeff/BVH.html>

The diagram illustrates the BVH file format structure. It shows a HIERARCHY section defining joints and their properties, and a MOTION section containing numerical data for two frames.

HIERARCHY Section:

```

HIERARCHY
ROOT Hips
{
  OFFSET 0 0 0
  CHANNELS 6 Xposition Yposition Zposition Zrotation Xrotation Yrotation
  JOINT LeftHip
  {
    OFFSET 3.5 0 0
    CHANNELS 3 Zrotation Xrotation Yrotation
    JOINT LeftKnee
    {
      OFFSET 0 -19.0555 0
      CHANNELS 3 Zrotation Xrotation
      JOINT LeftHeel
      {
        OFFSET -21.1464 0
        CHANNELS 3 Zrotation Xrotation
        JOINT LeftFoot
        {
          OFFSET 9.64661
          CHANNELS 3 Zrotation Xrotation
          JOINT LeftToe
          {
            OFFSET 0 0 0
            CHANNELS 3 Zrotation Xrotation
            JOINT LeftBall
            {
              OFFSET 0 0 0
              CHANNELS 3 Zrotation Xrotation
              JOINT LeftAnkle
            }
          }
        }
      }
    }
  }
}
...

```

MOTION Section:

```

MOTION
Frames: 2
Frame Time: 0.04166667
-9.533684    4.447926    -0.566564    -7.757381    -1.735414
6.289016    -1.825344    -6.106647    3.973667
-14.391472  -3.461282    -16.504230    3.973544
2.533497    -28.283911  -6.862538    6.191492
2.951538    -3.418231    7.634442    11.325822
-18.352753  15.051558   -7.514462    8.397663
2.494318    -1.543435    2.970936    -25.086460
7.093068    -1.507532    -2.633332    3.858087
12.803010   -28.692566  2.151862    -9.164188
-12.596124  4.366460    -8.244940    -1.784412
4.285263    -0.621559

```

Callouts:

- position channels:** Points to the Xposition, Yposition, and Zposition channels in the Hips joint definition.
- rotation channels:** Points to the Zrotation, Xrotation, and Yrotation channels in the Hips joint definition.
- distance to parent joint:** Points to the OFFSET 9.64661 value for the LeftFoot joint.
- Euler axes, in extrinsic / fixed angles convention. Here $R = R_z R_x R_y$:** Points to the rotation channels in the LeftFoot joint definition.

Recap: motion data in a file

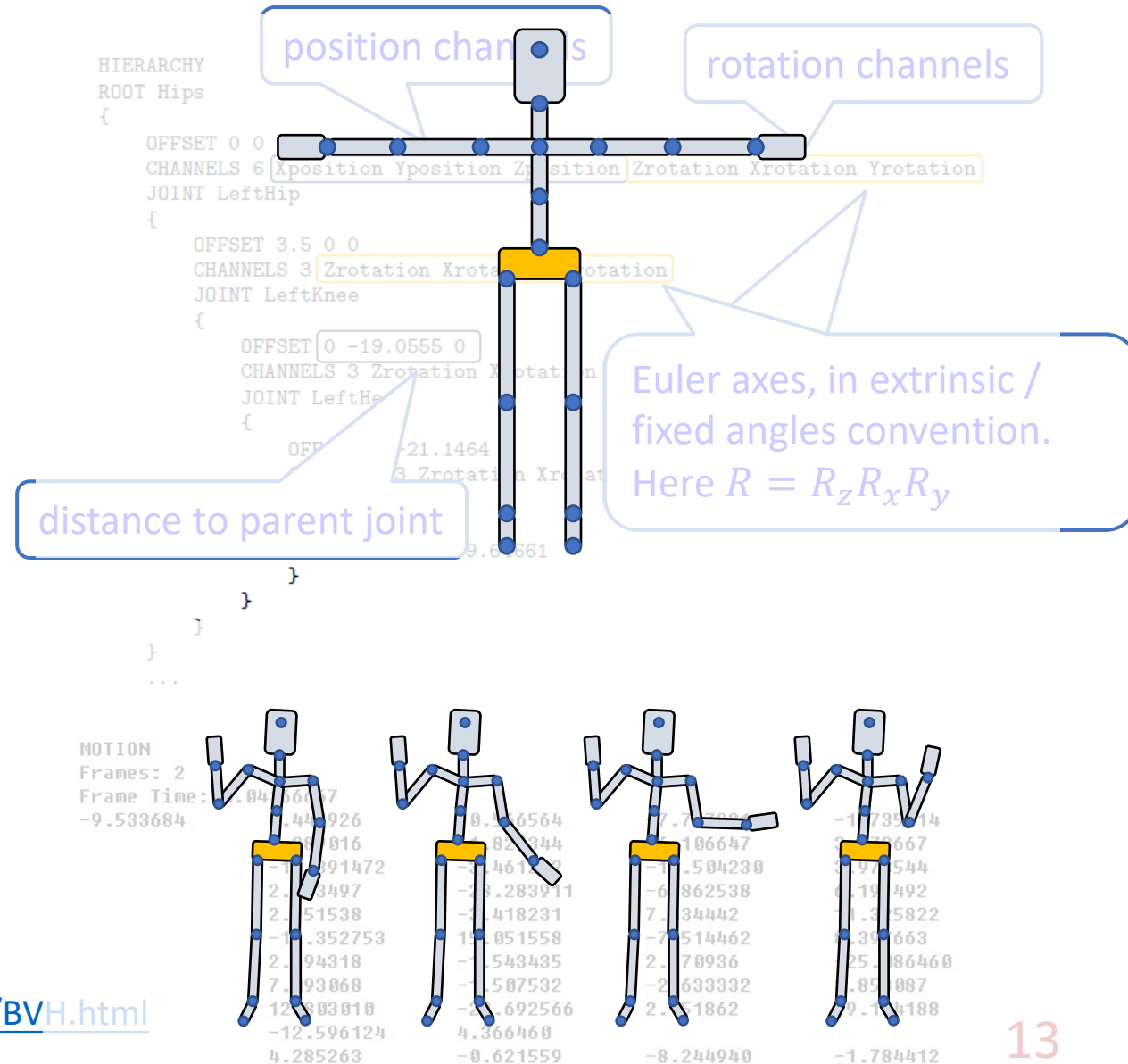
- BVH files

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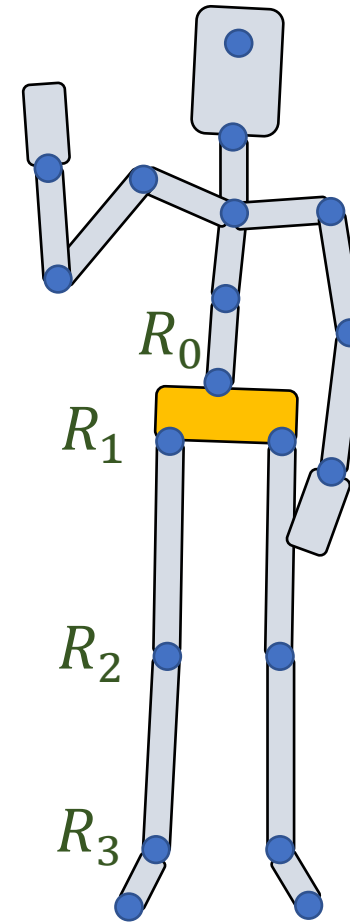
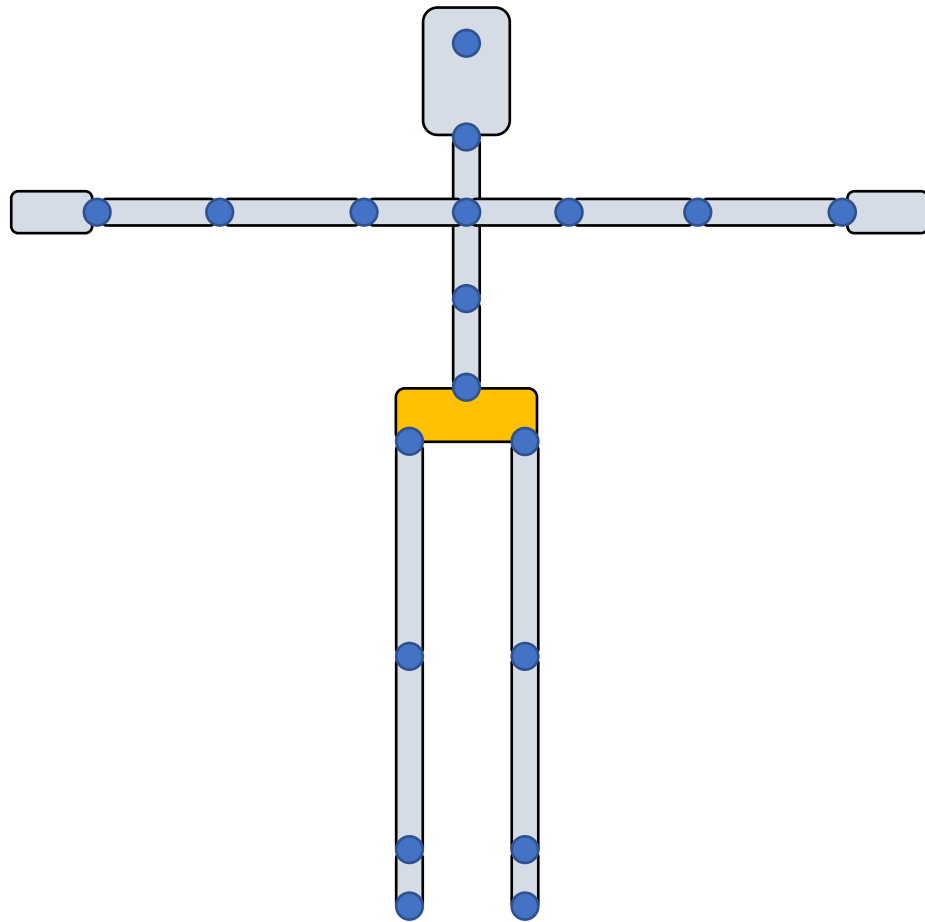
- Format

- HIERARCHY: defining **T-pose** of the character
- MOTION: root position and Euler angles of each joints

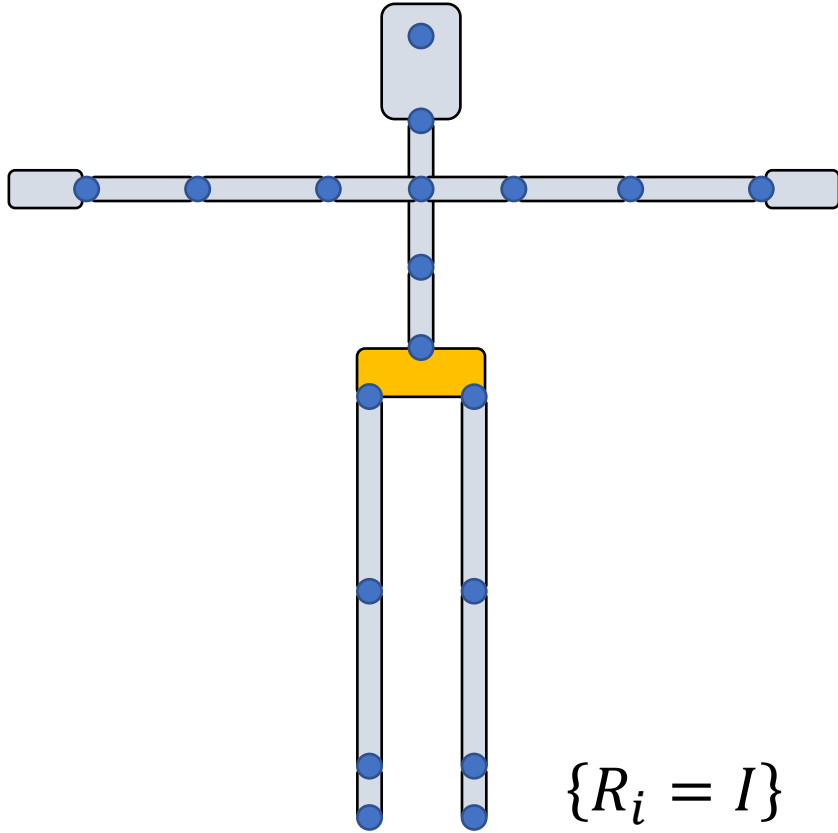
See: <https://research.cs.wisc.edu/graphics/Courses/cs-838-1999/Jeff/BVH.html>



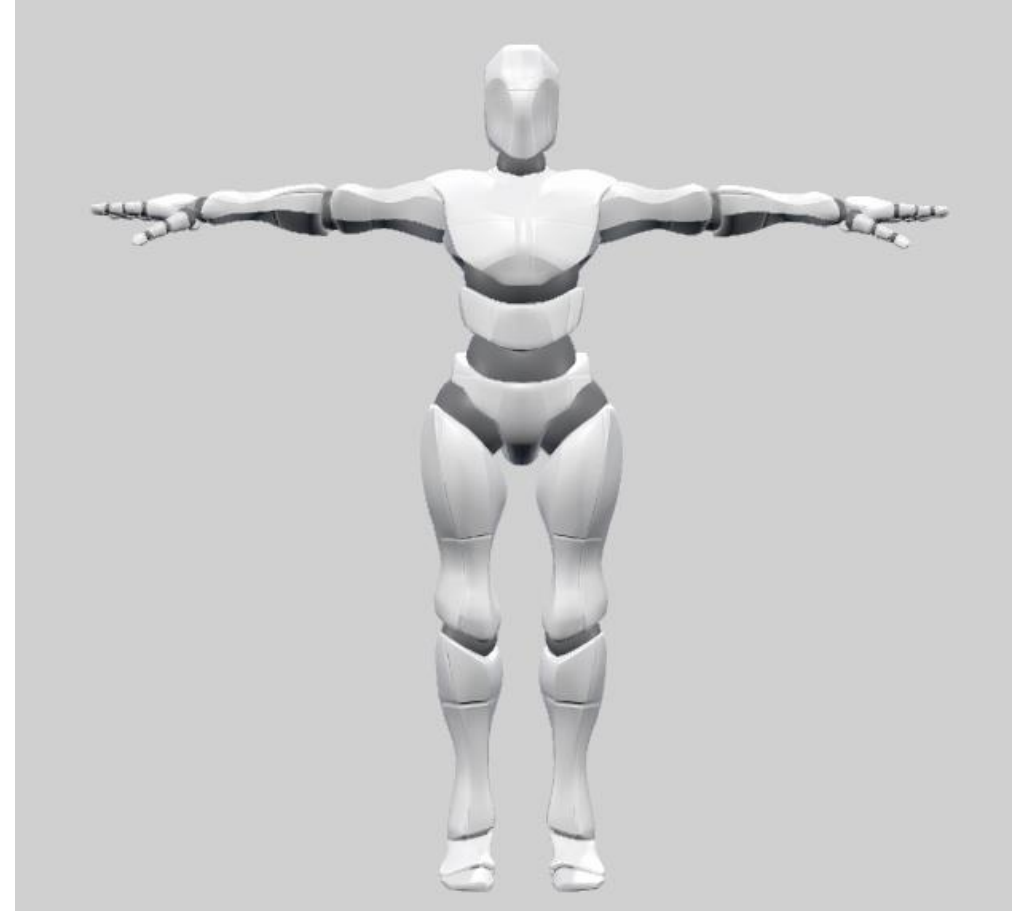
Posed Character



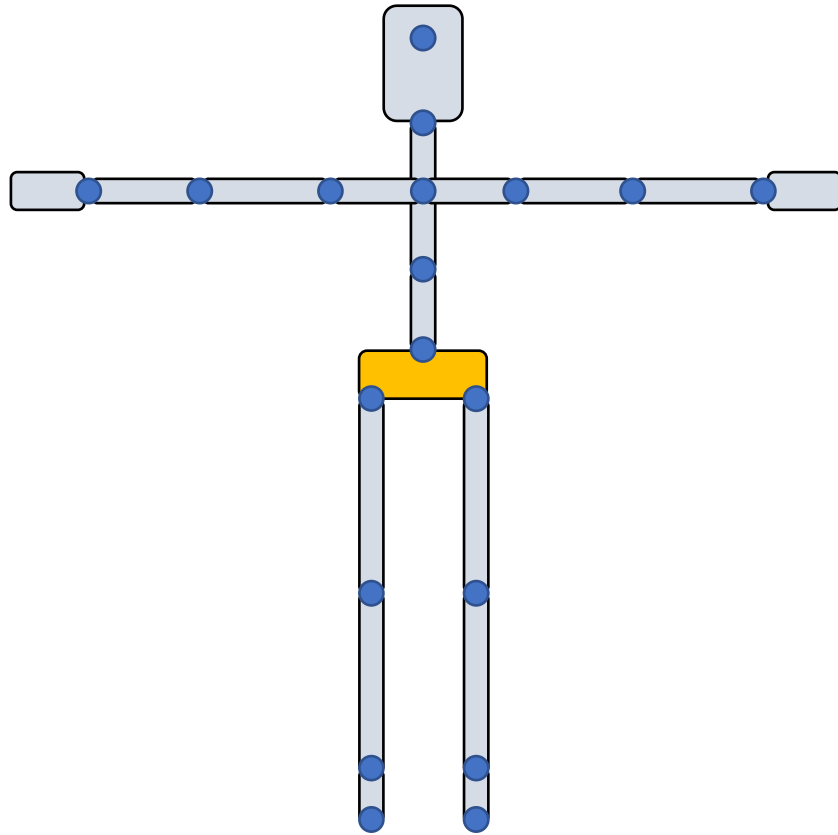
T-Pose



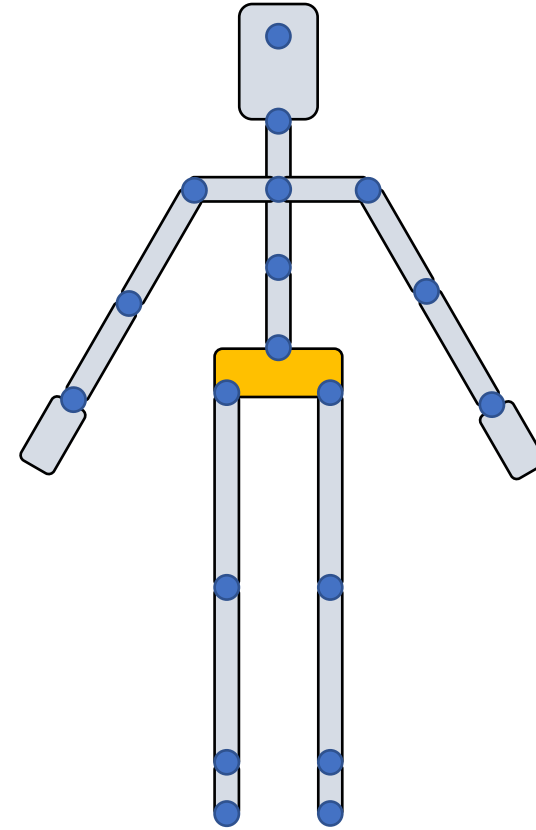
The pose with **zero/identity** rotation
Bind pose / Reference pose



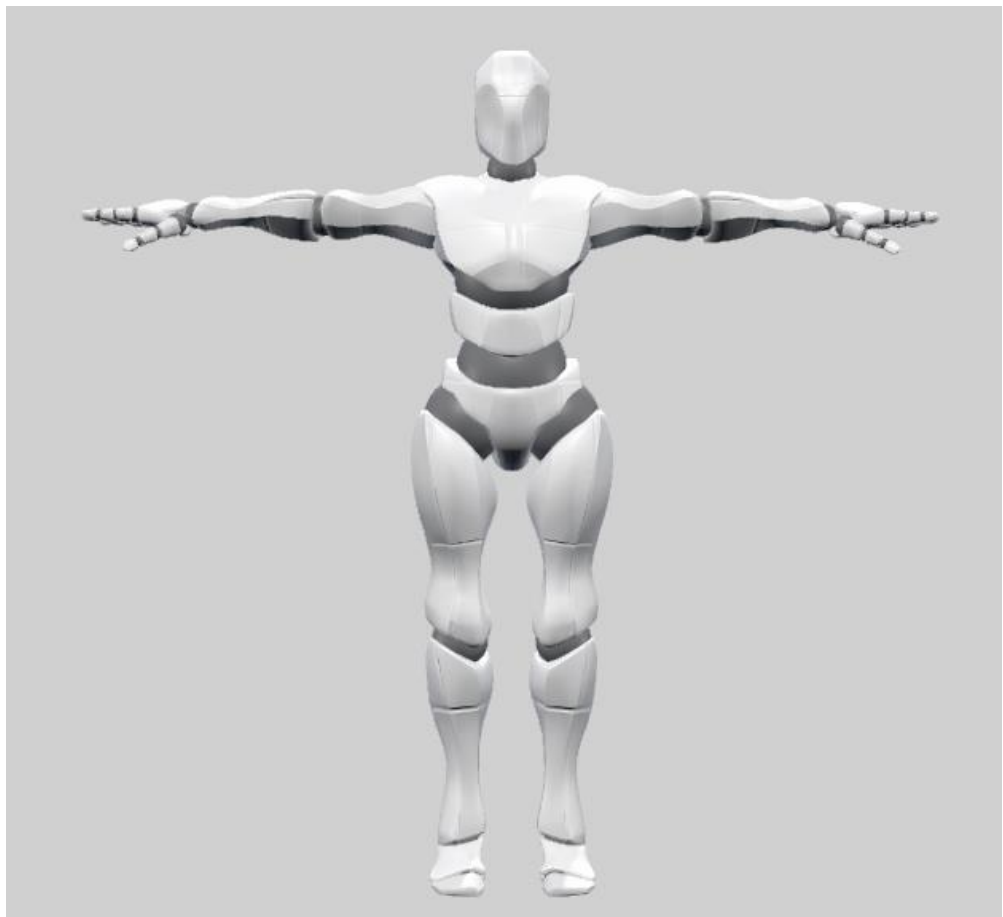
T-Pose? A-Pose?



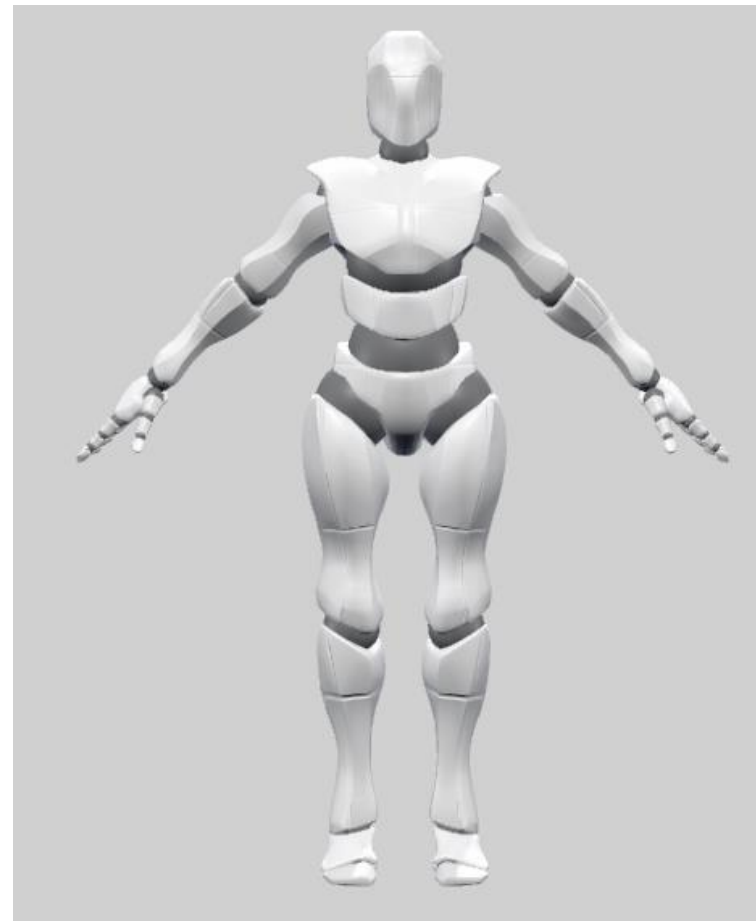
or



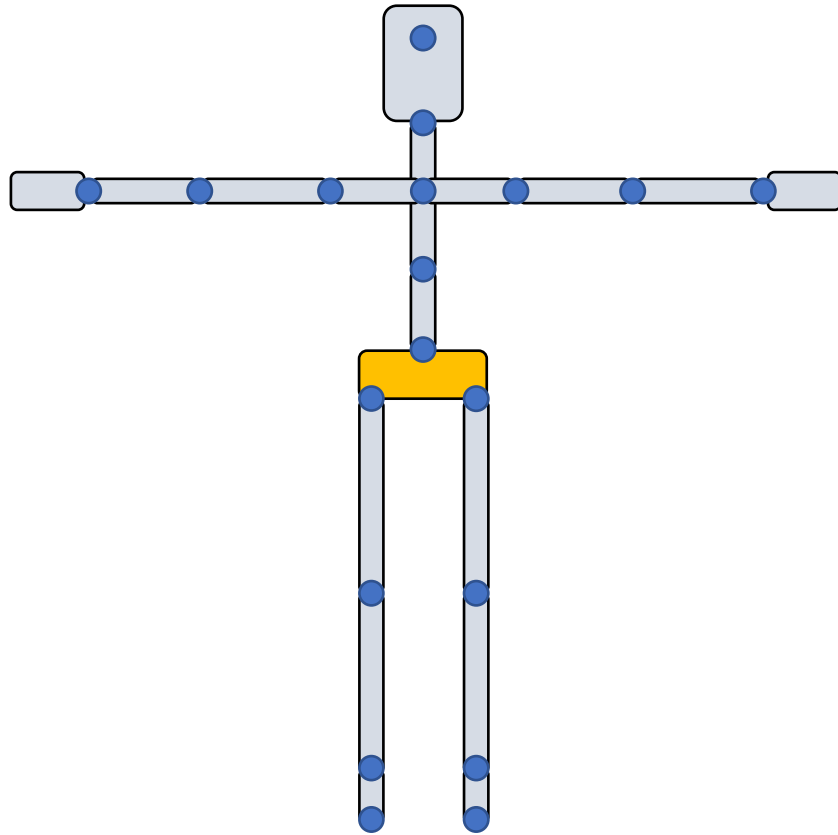
T-Pose? A-Pose?



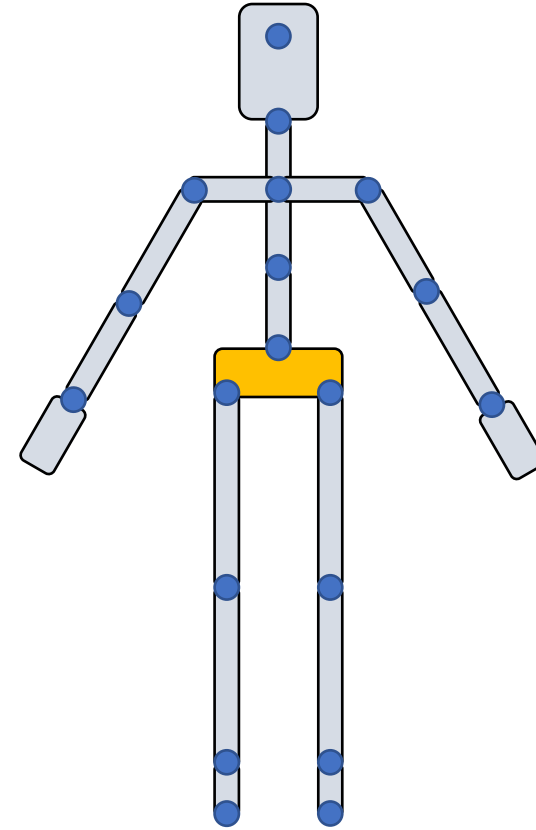
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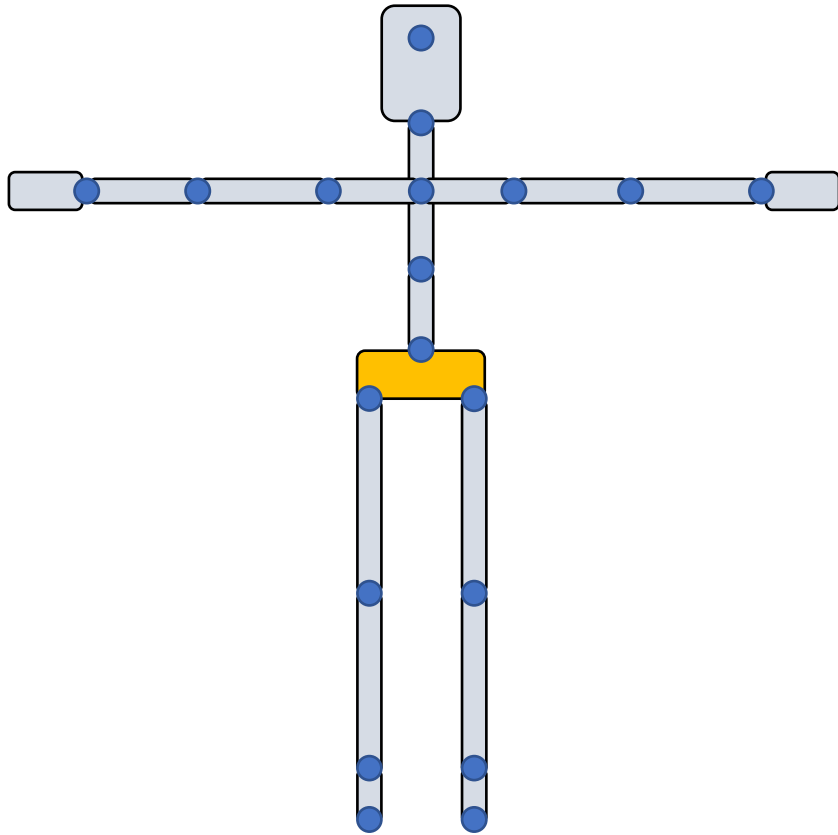
T-Pose? A-Pose?



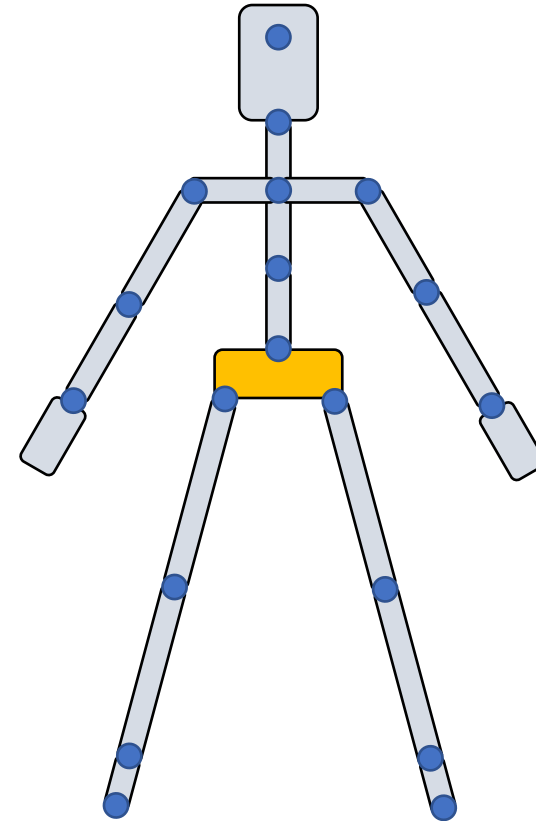
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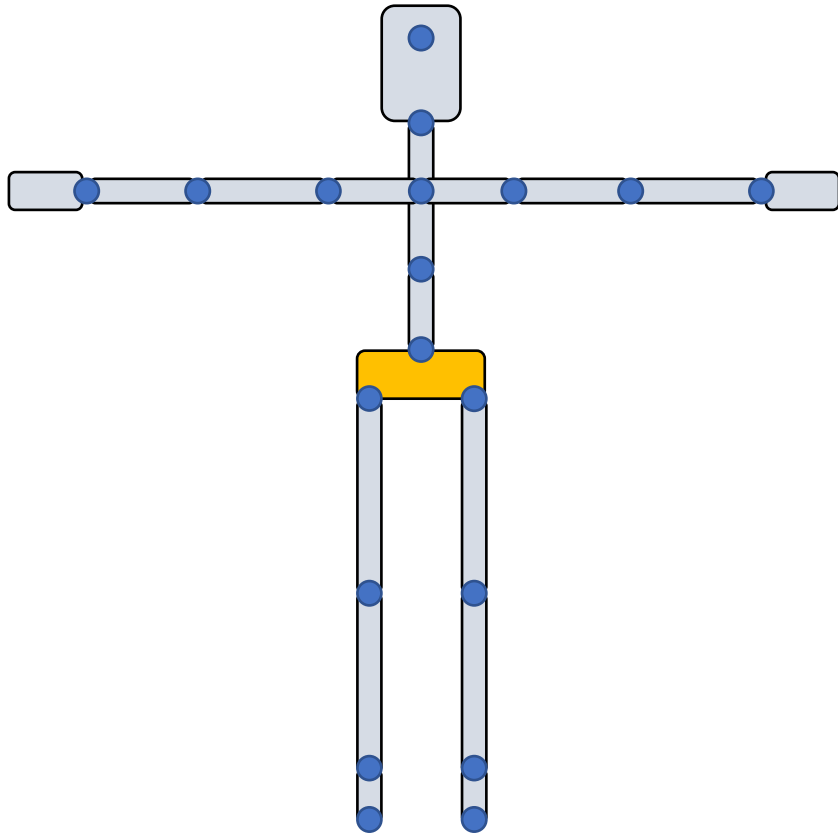
T-Pose? A-Pose?



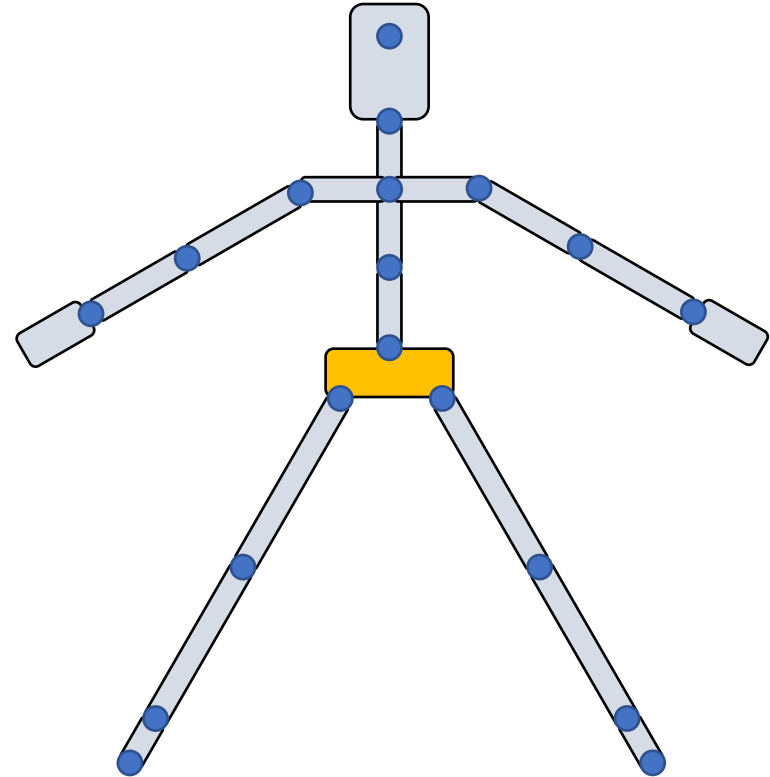
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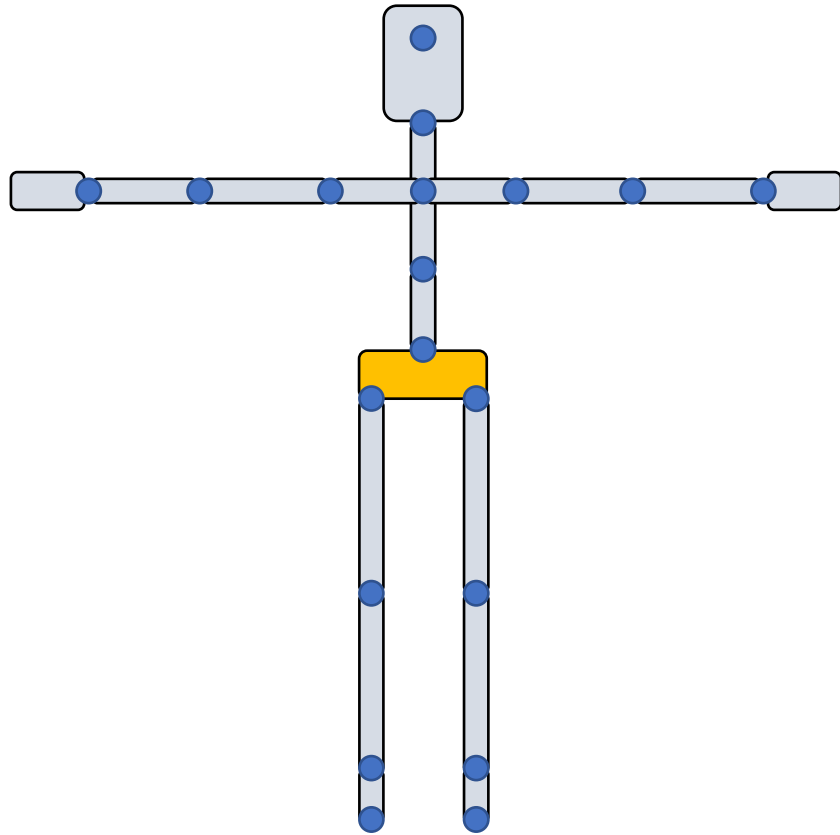
T-Pose? A-Pose?



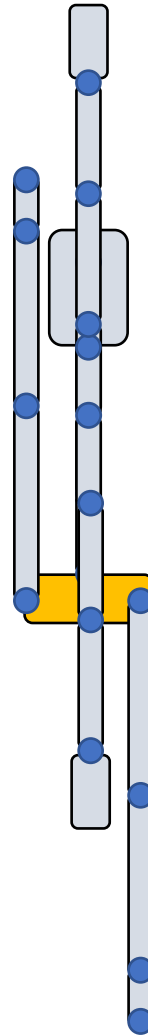
or



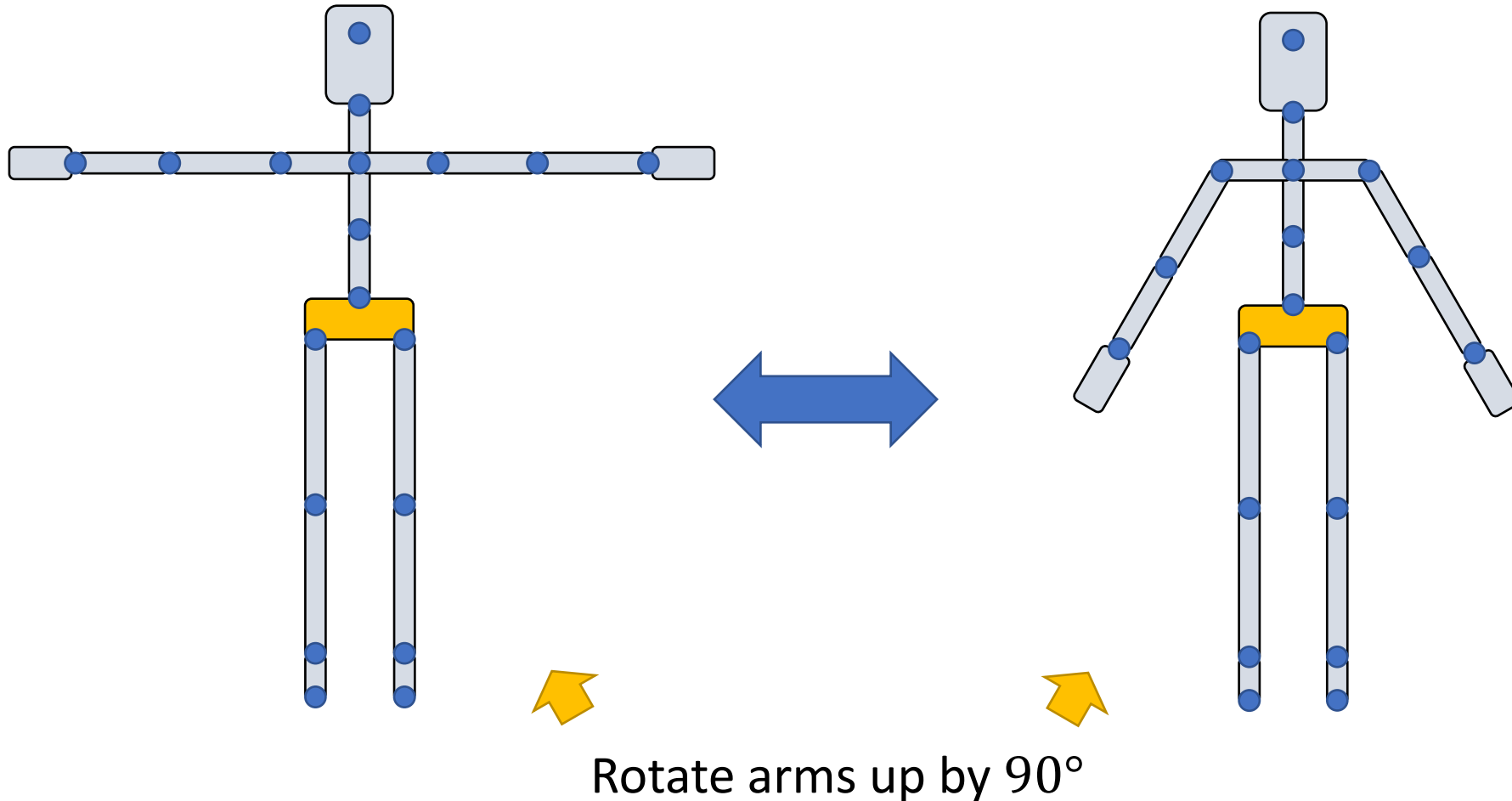
T-Pose? A-Pose?



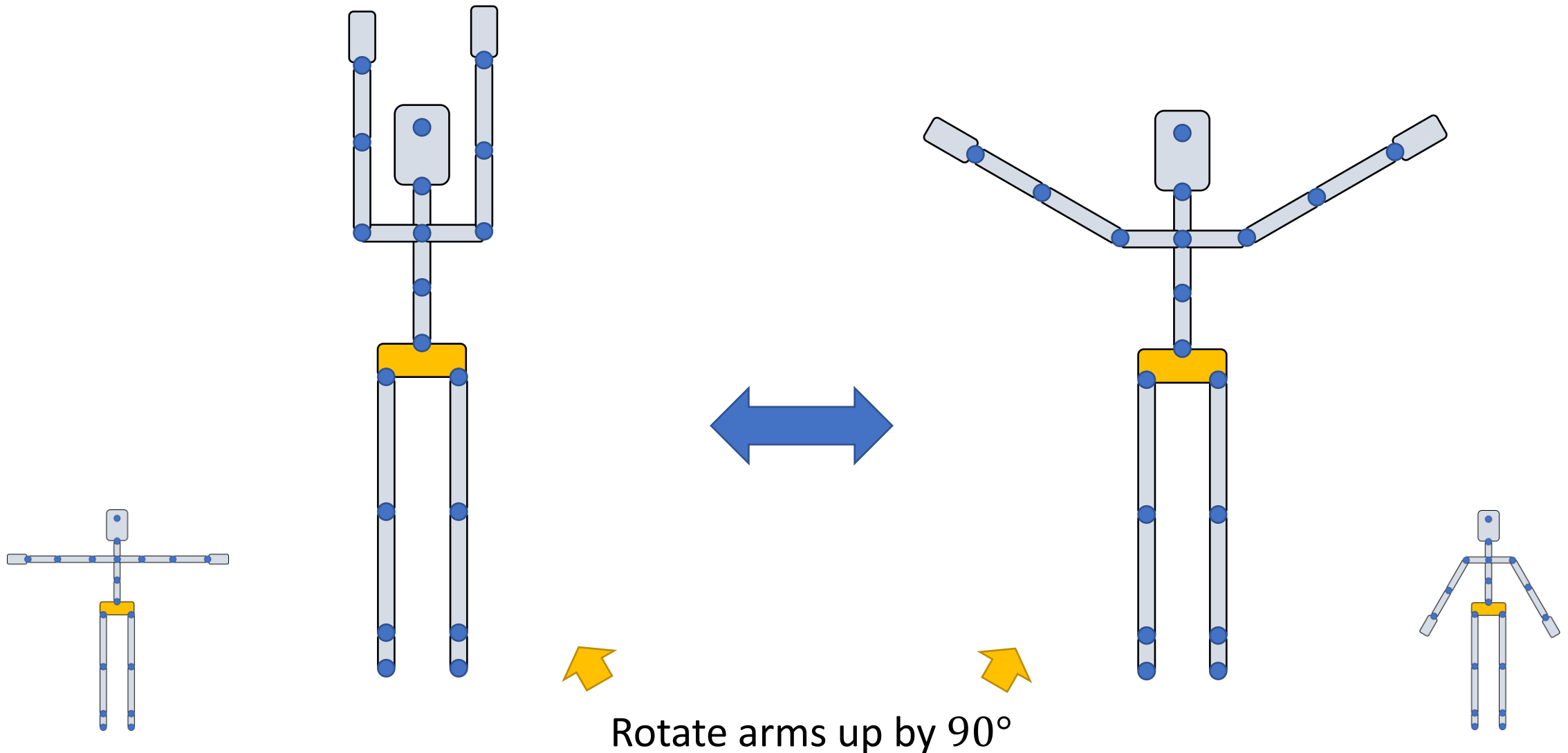
or



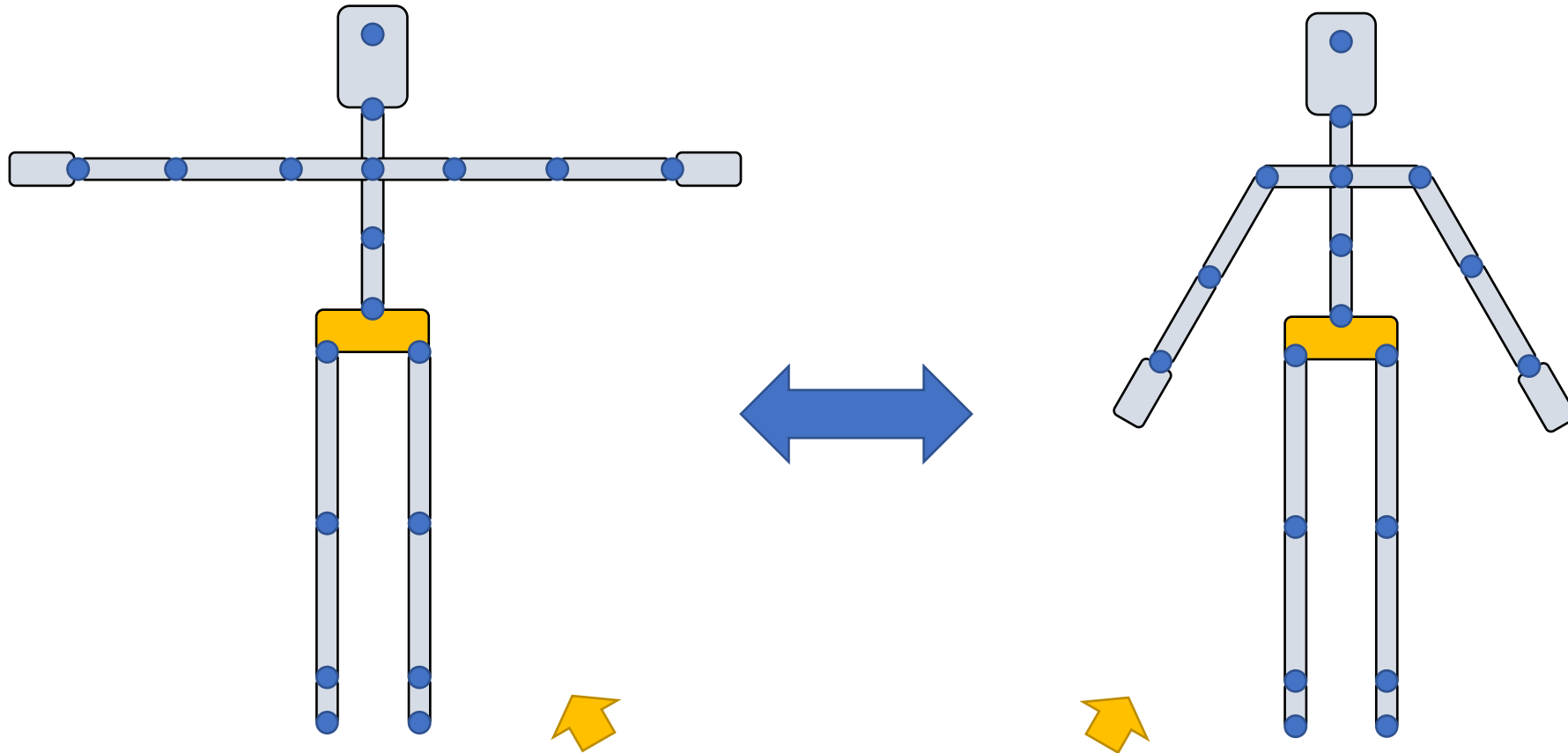
Same motion under different reference poses



Same motion under different reference poses

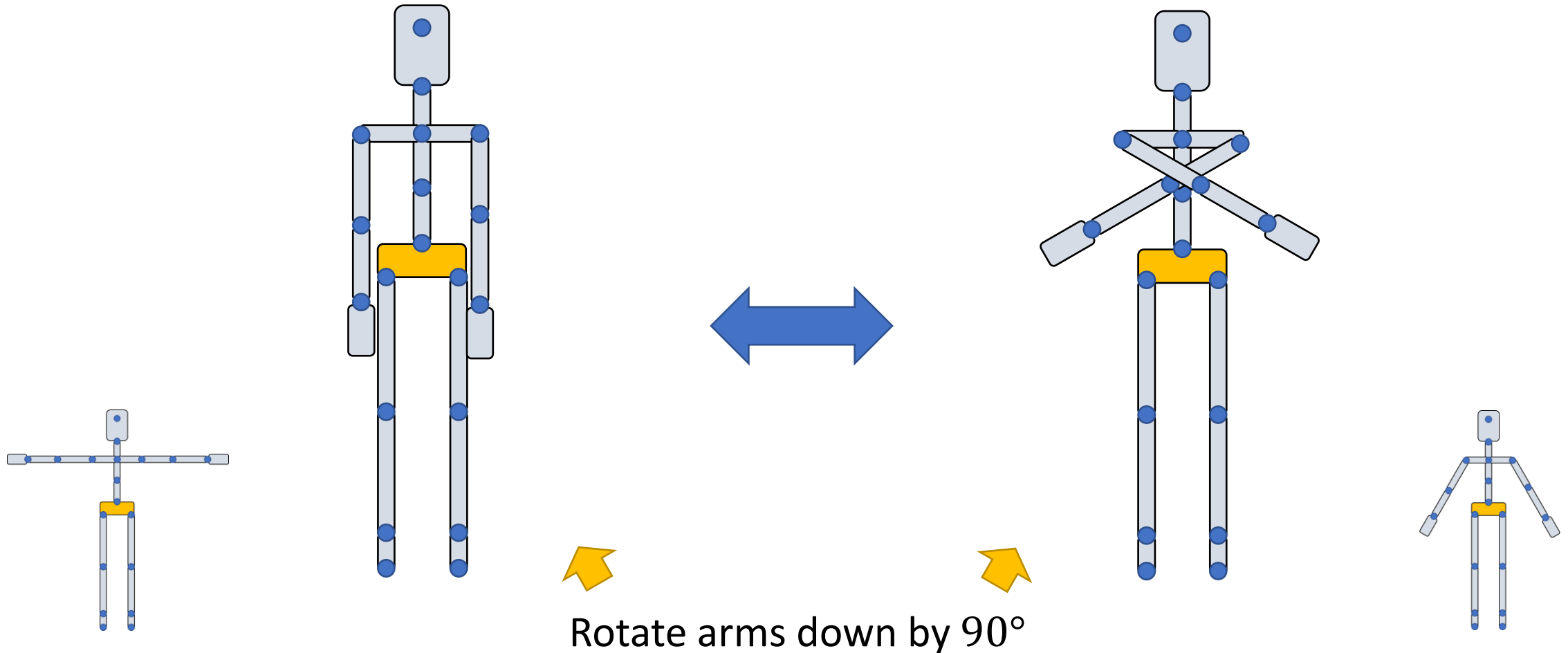


Same motion under different reference poses

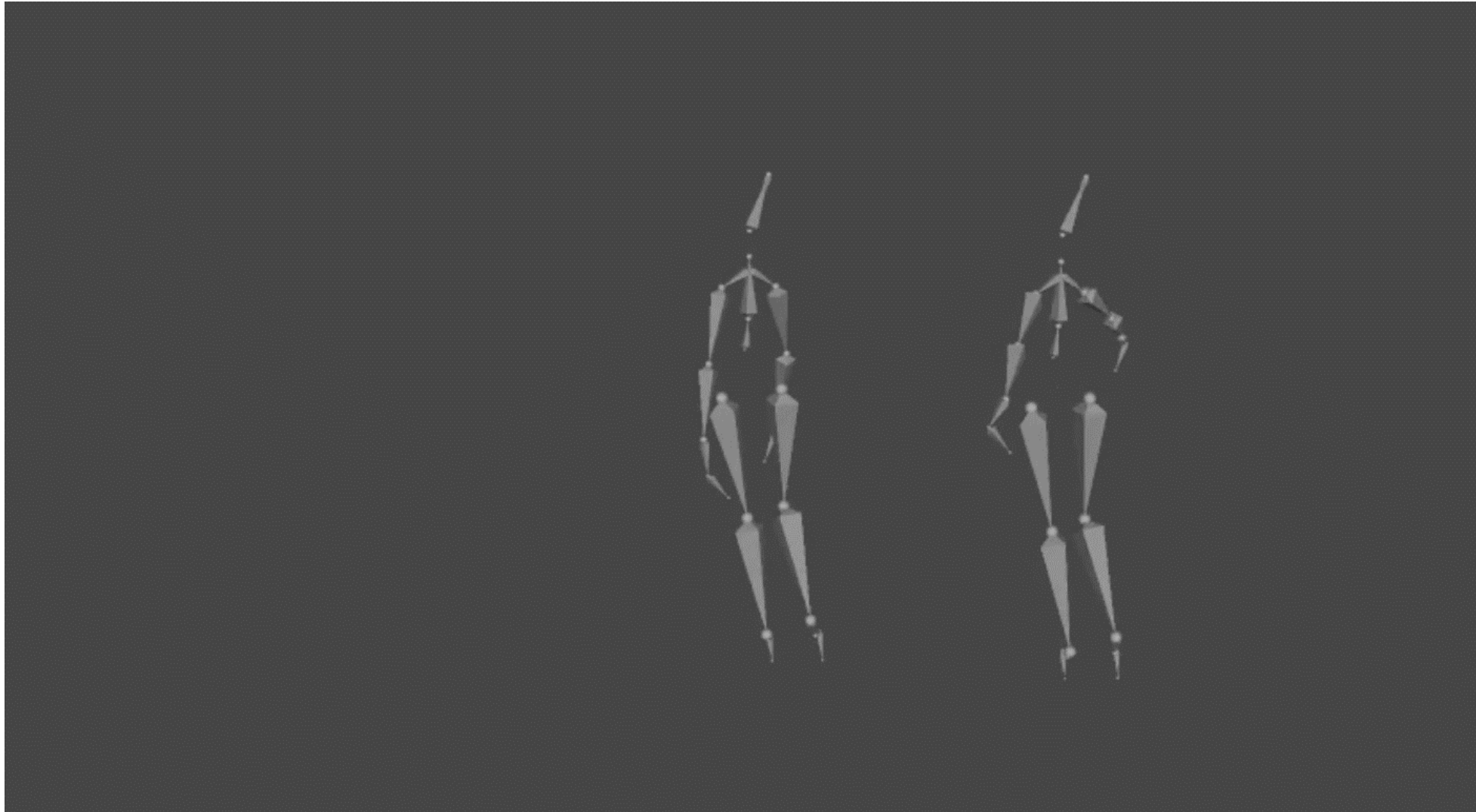


Rotate arms down by 90°

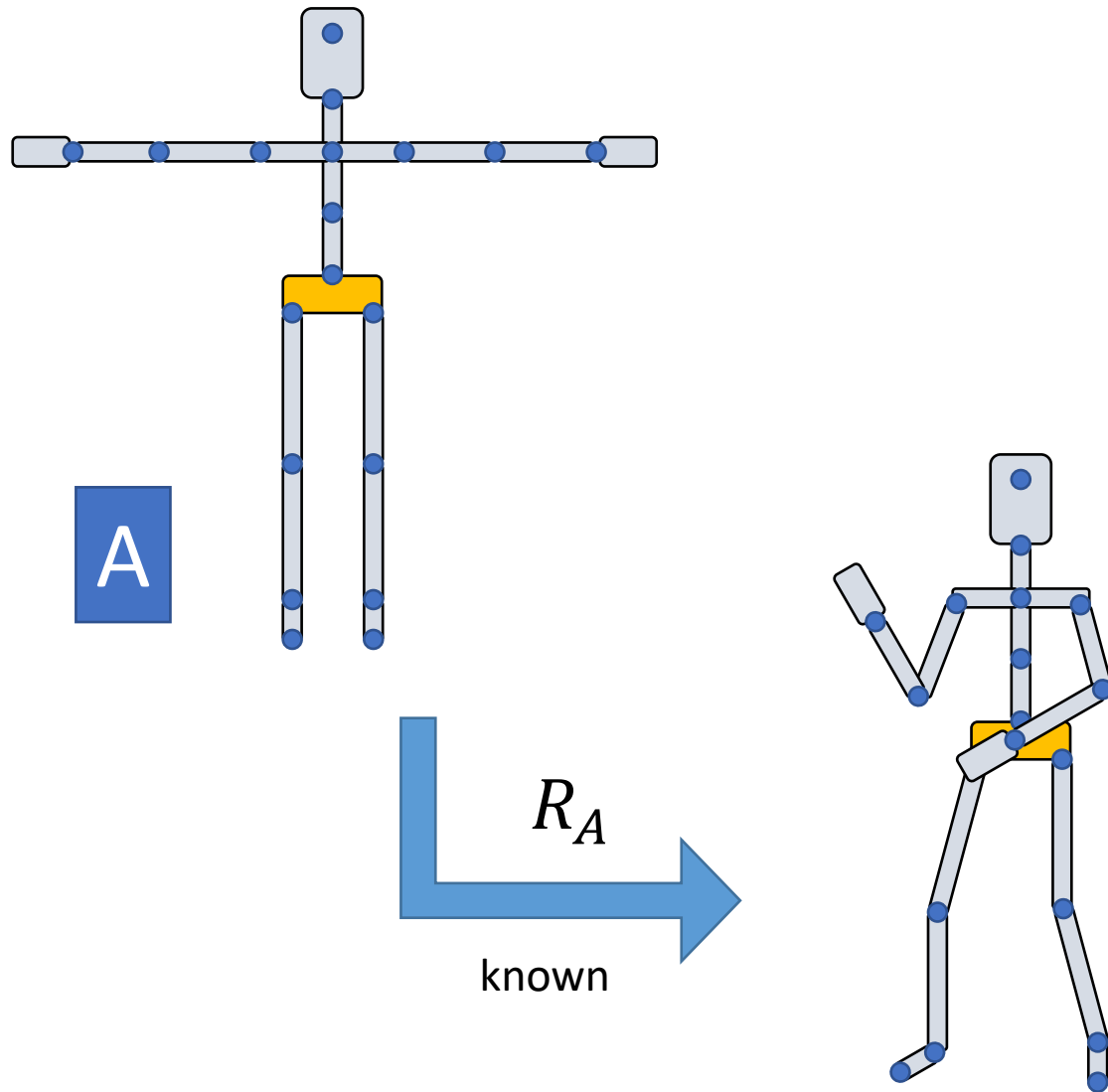
Same motion under different reference poses



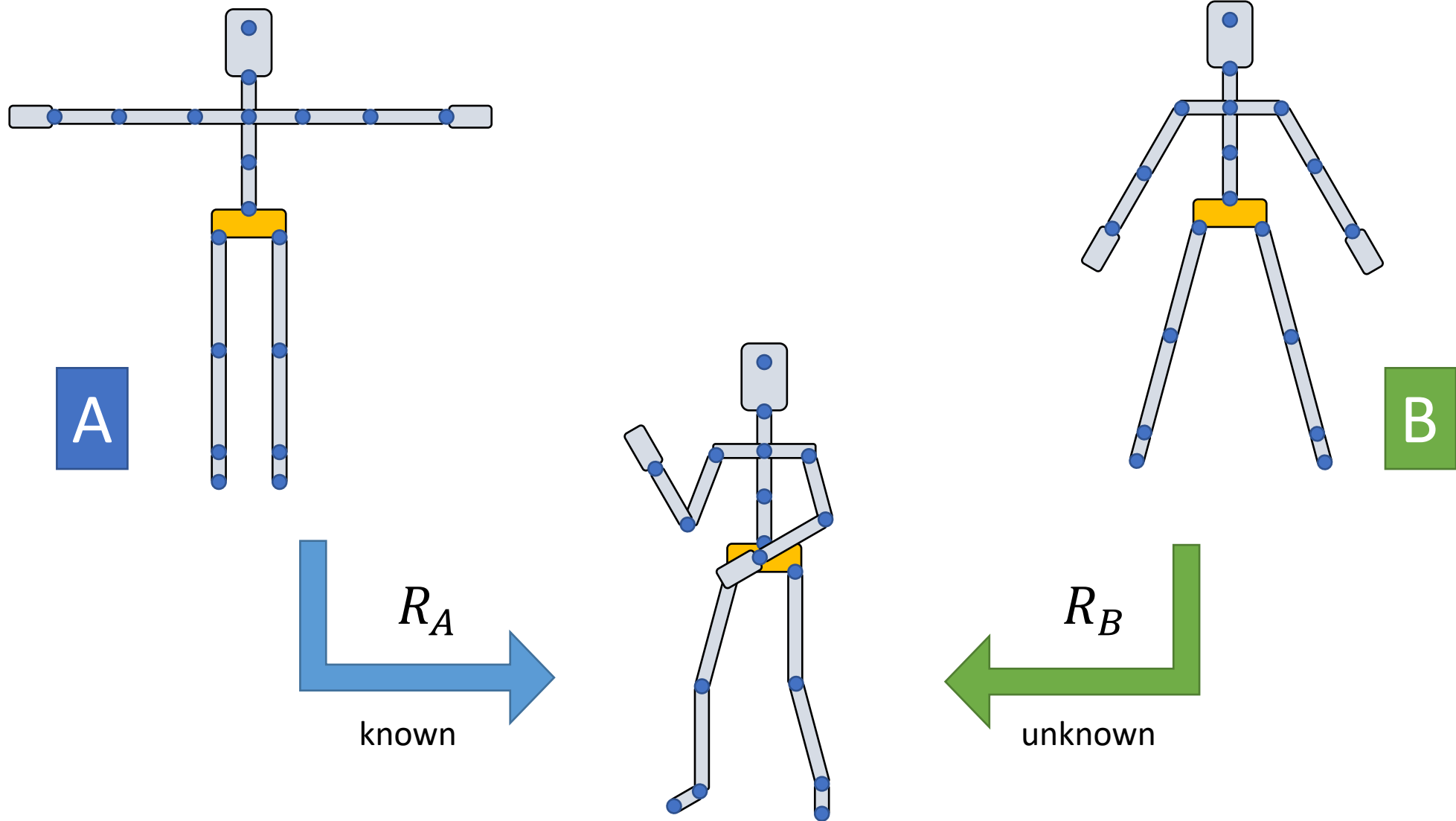
Same motion under different reference poses



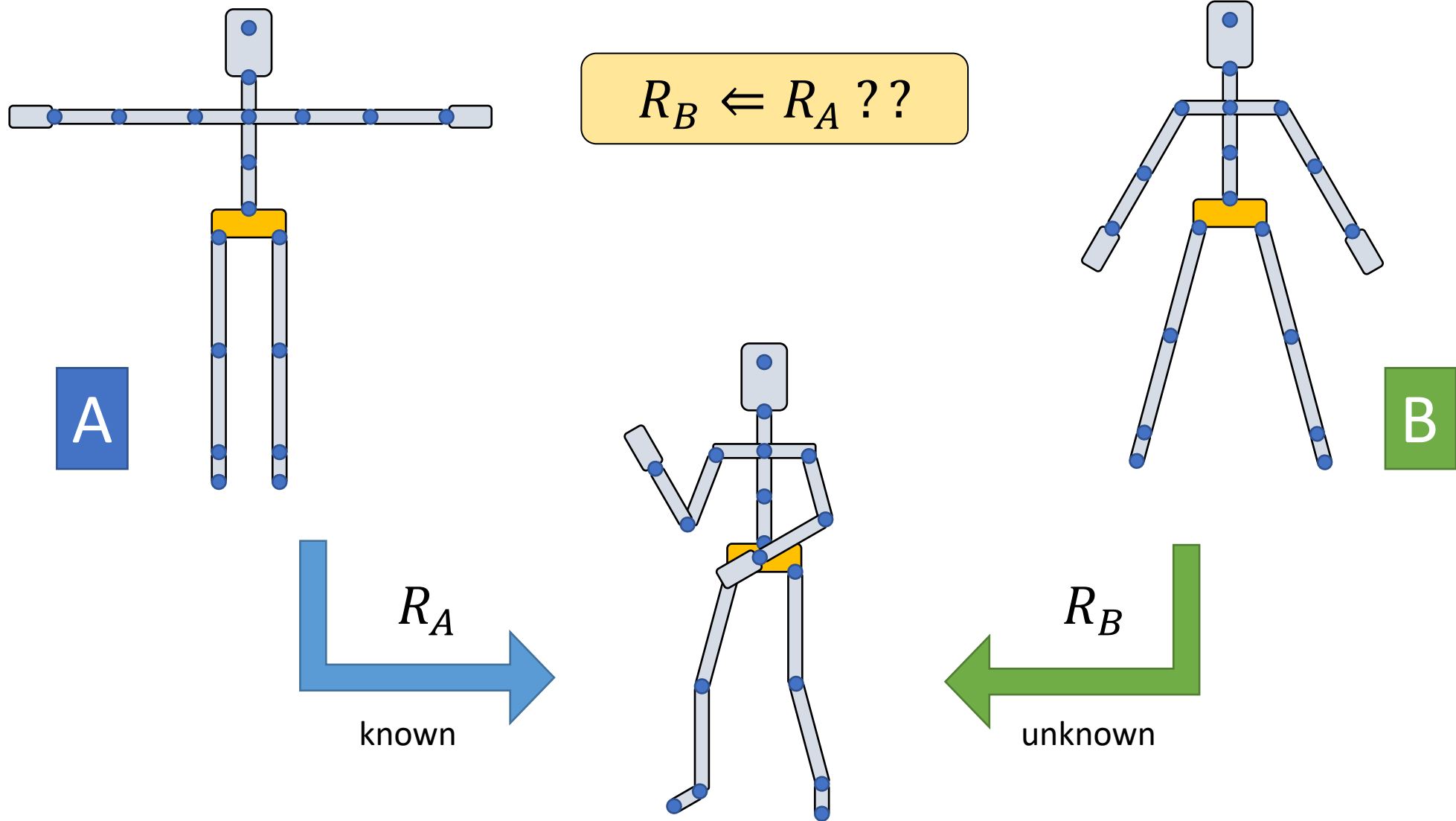
Retargeting between reference poses



Retargeting between reference poses



Retargeting between reference poses

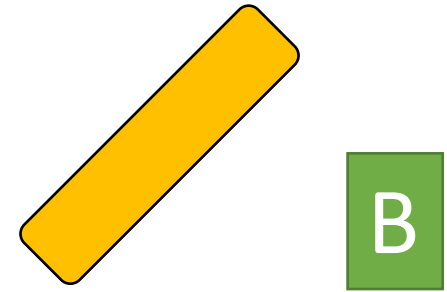


Retargeting for a single object

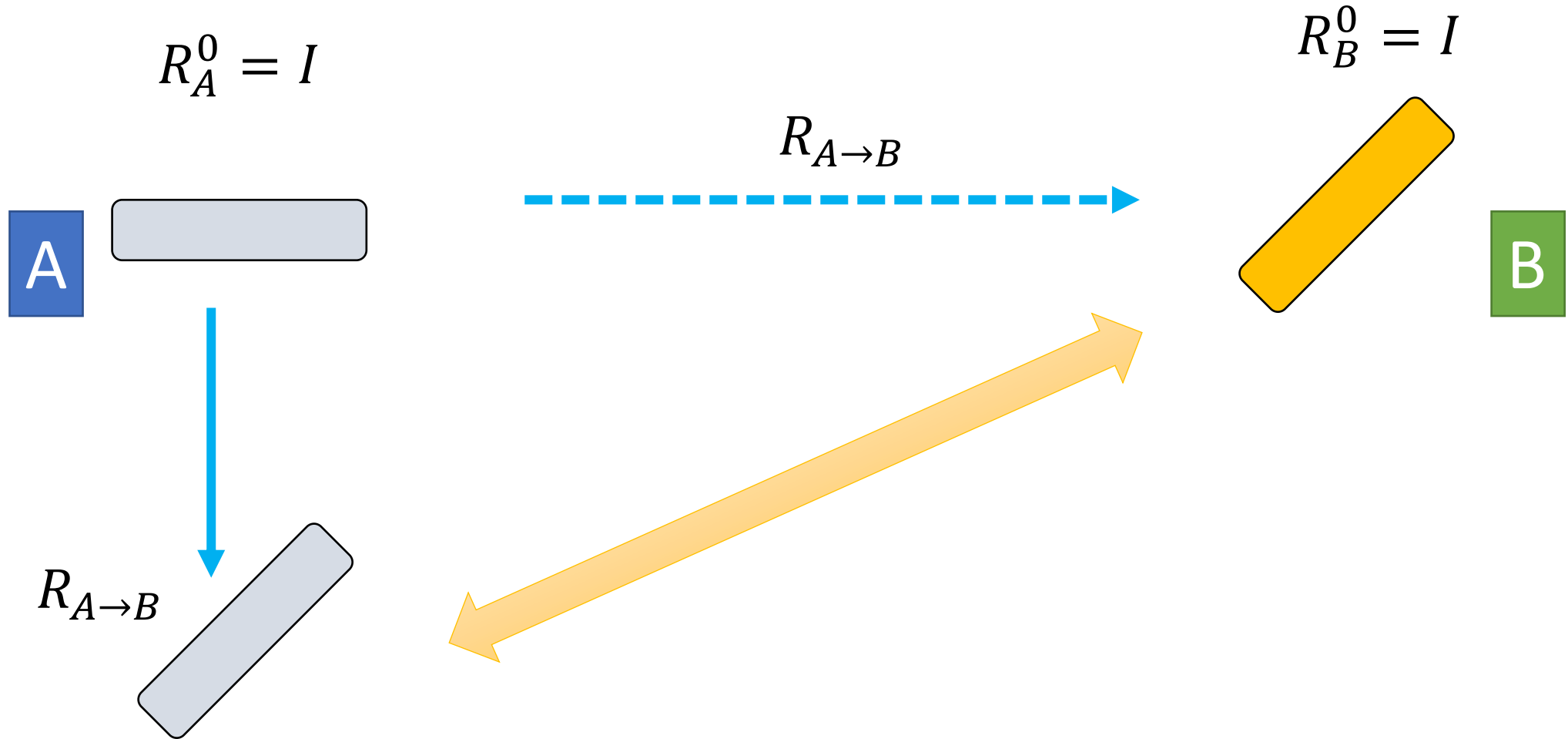
$$R_A^0 = I$$



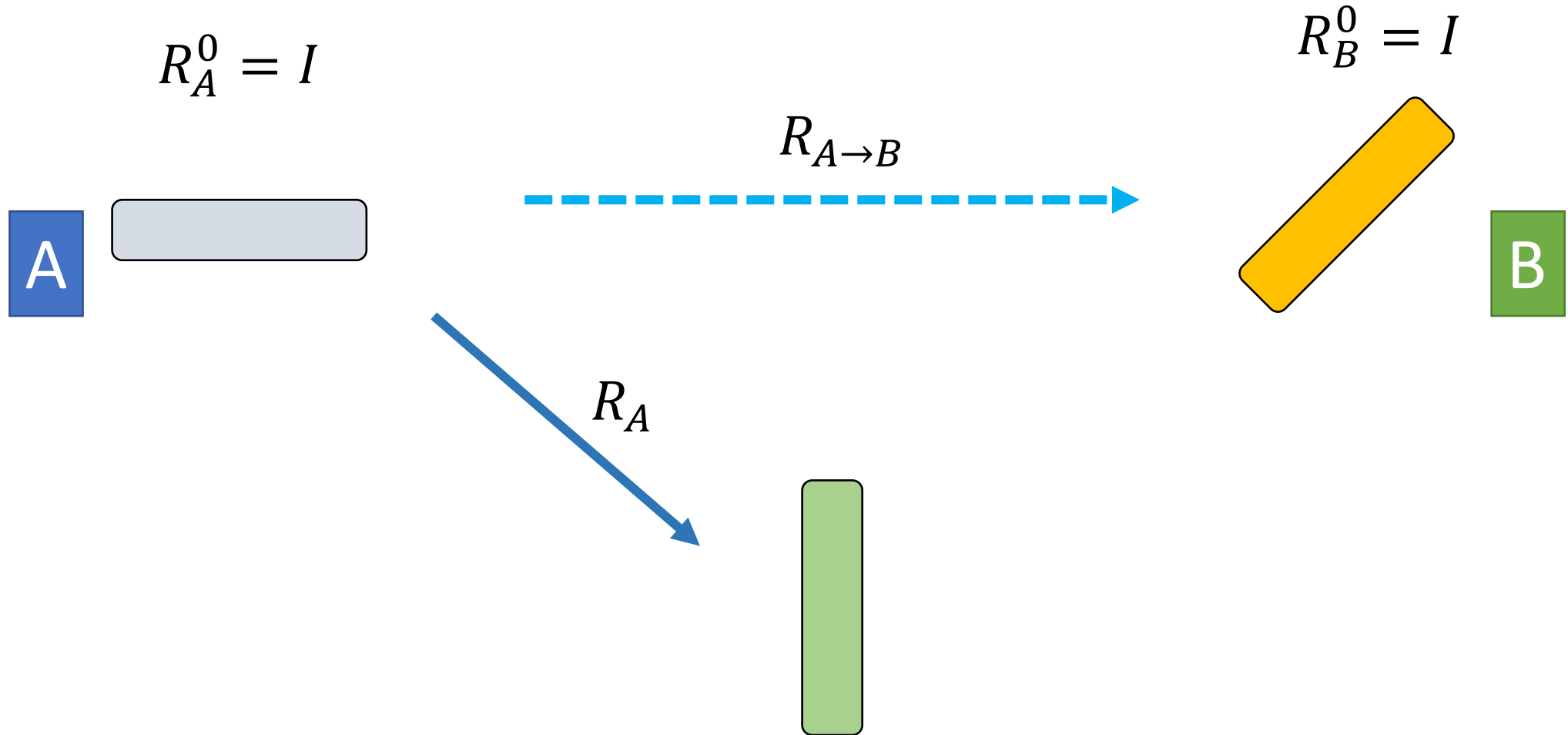
$$R_B^0 = I$$



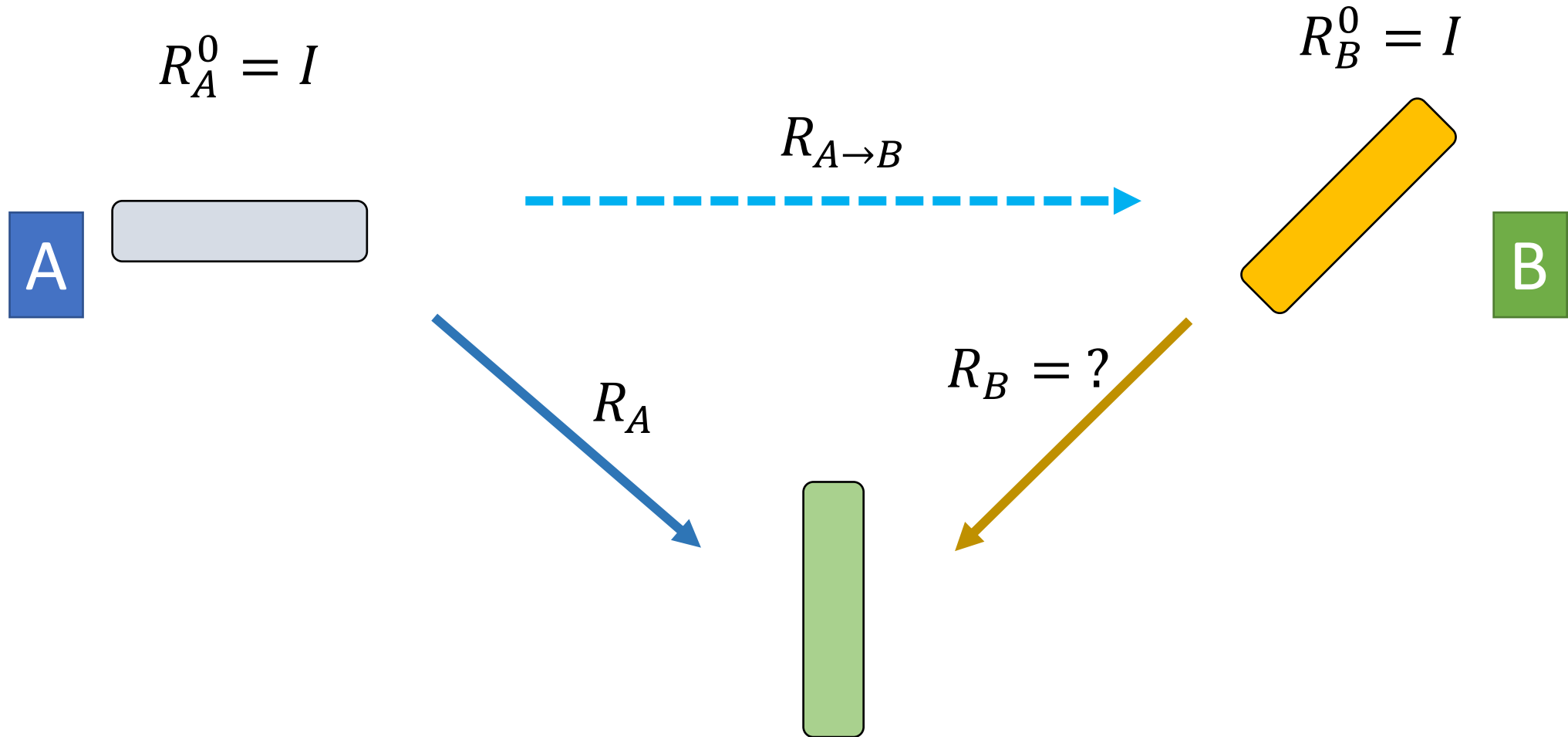
Retargeting for a single object



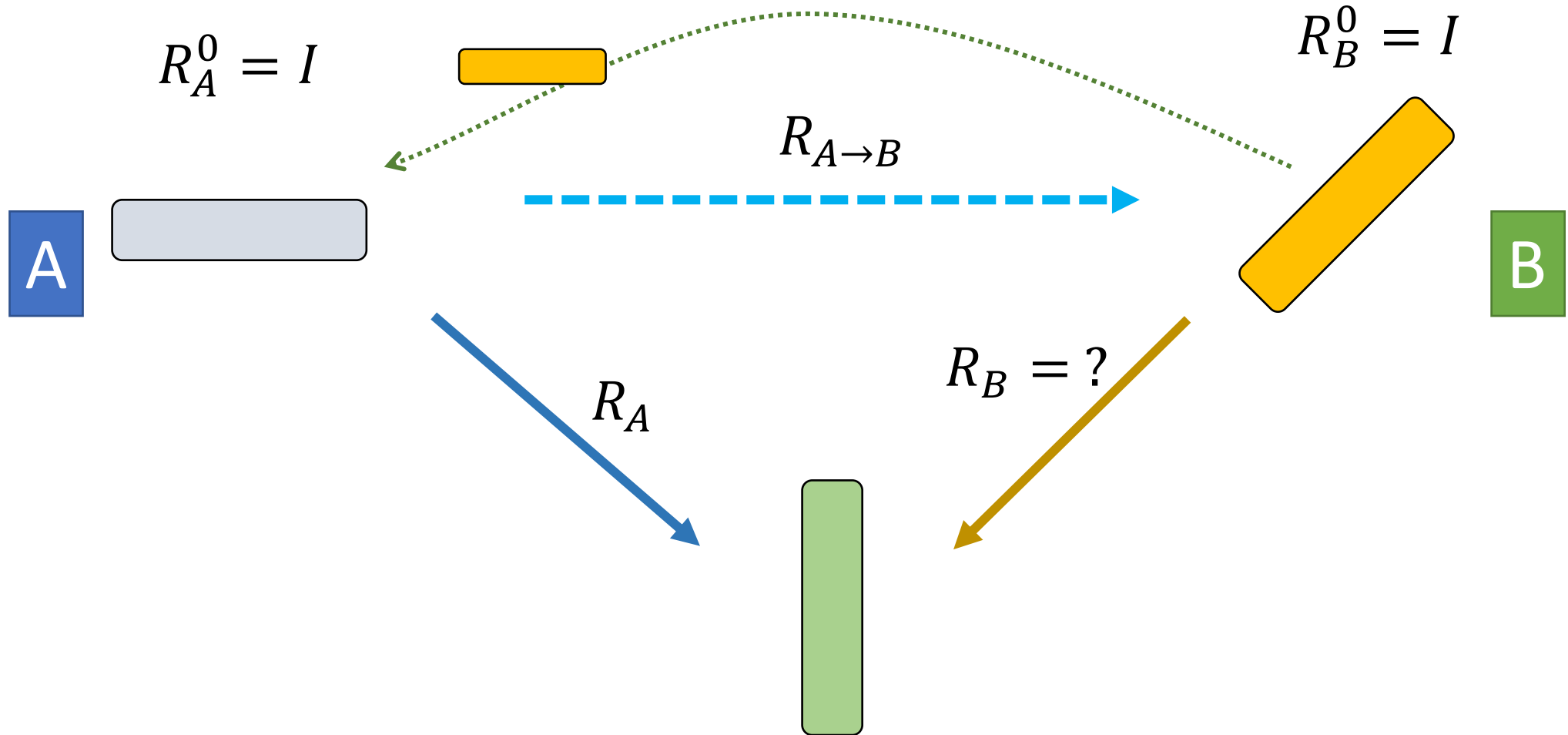
Retargeting for a single object



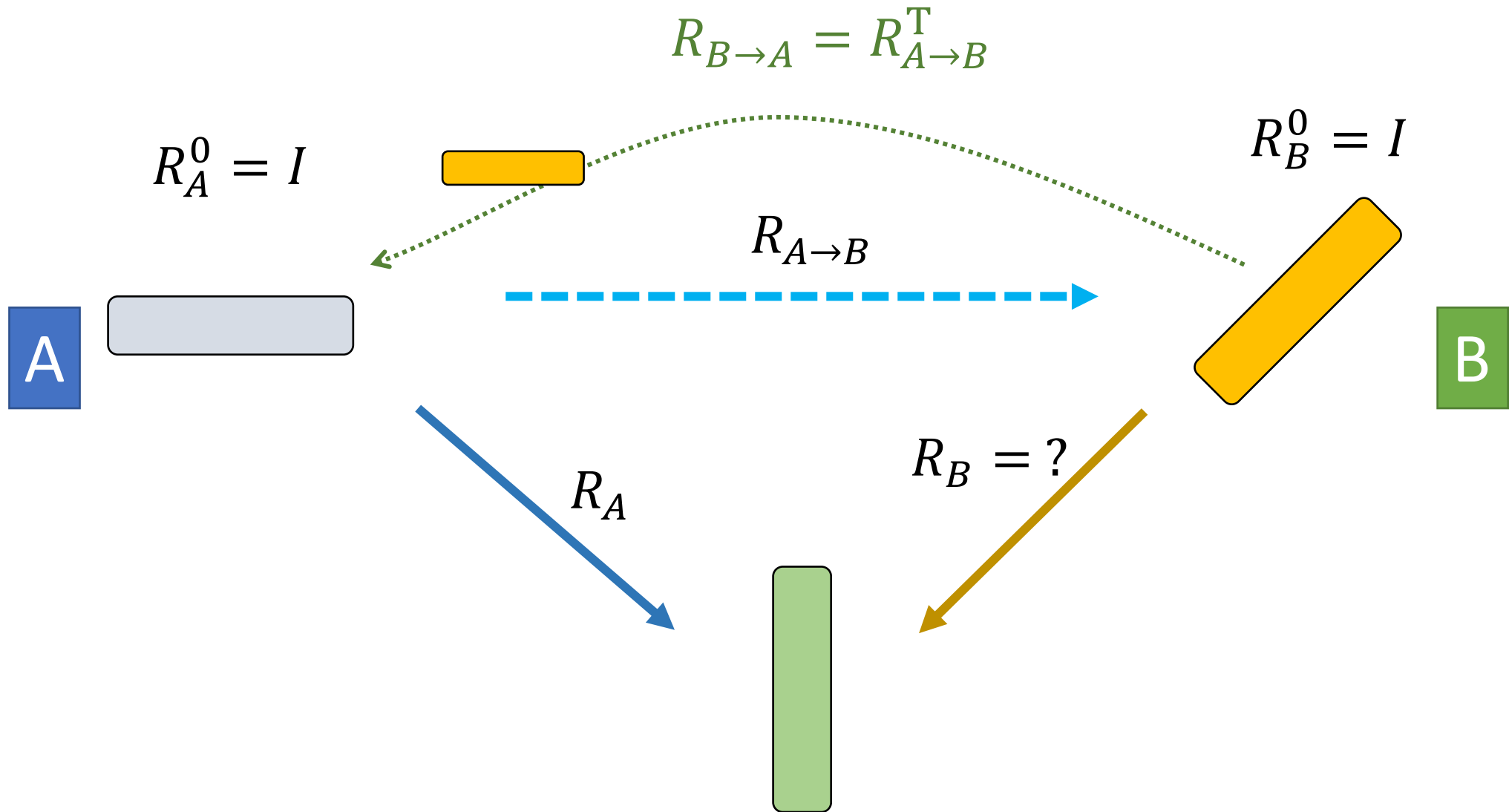
Retargeting for a single object



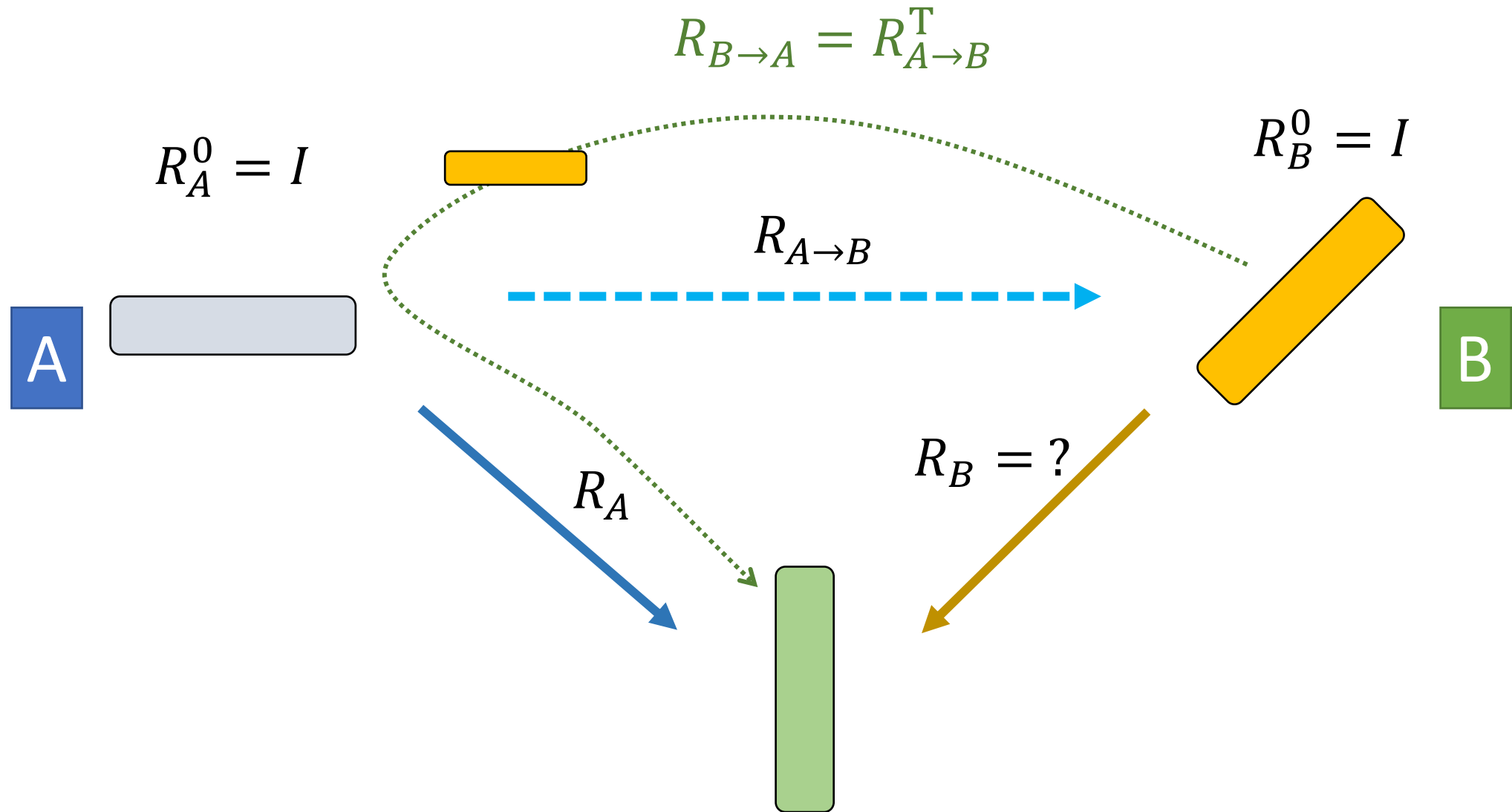
Retargeting for a single object



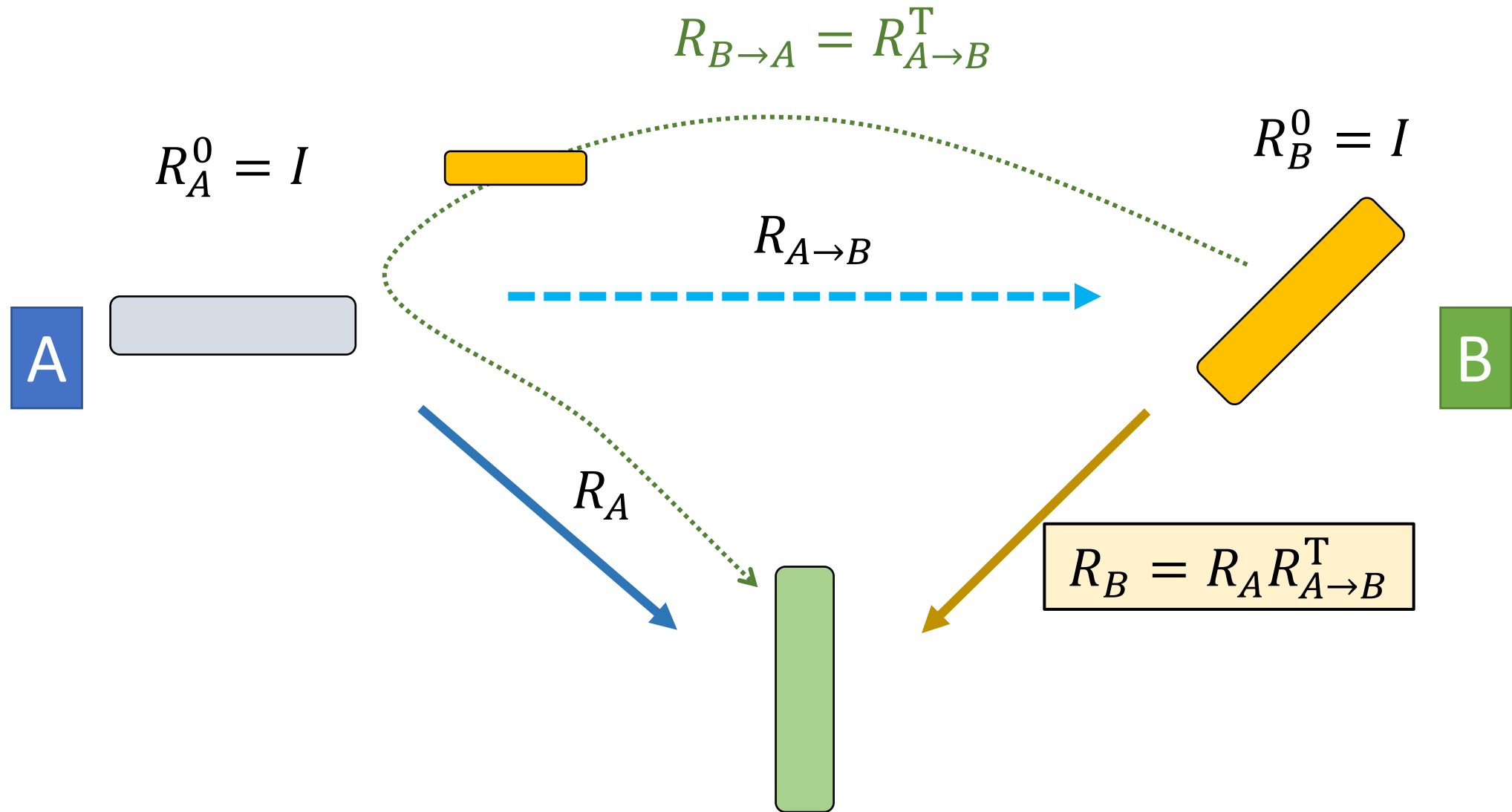
Retargeting for a single object



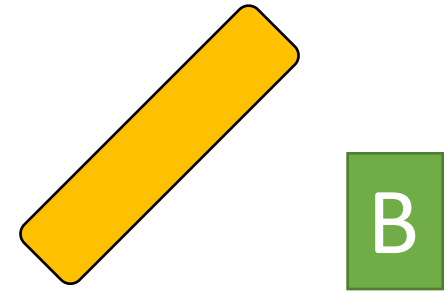
Retargeting for a single object



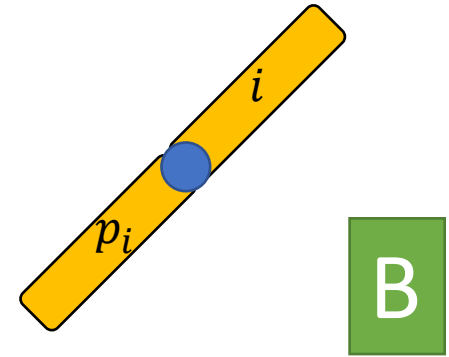
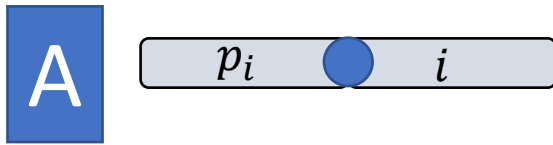
Retargeting for a single object



Retargeting for a single object

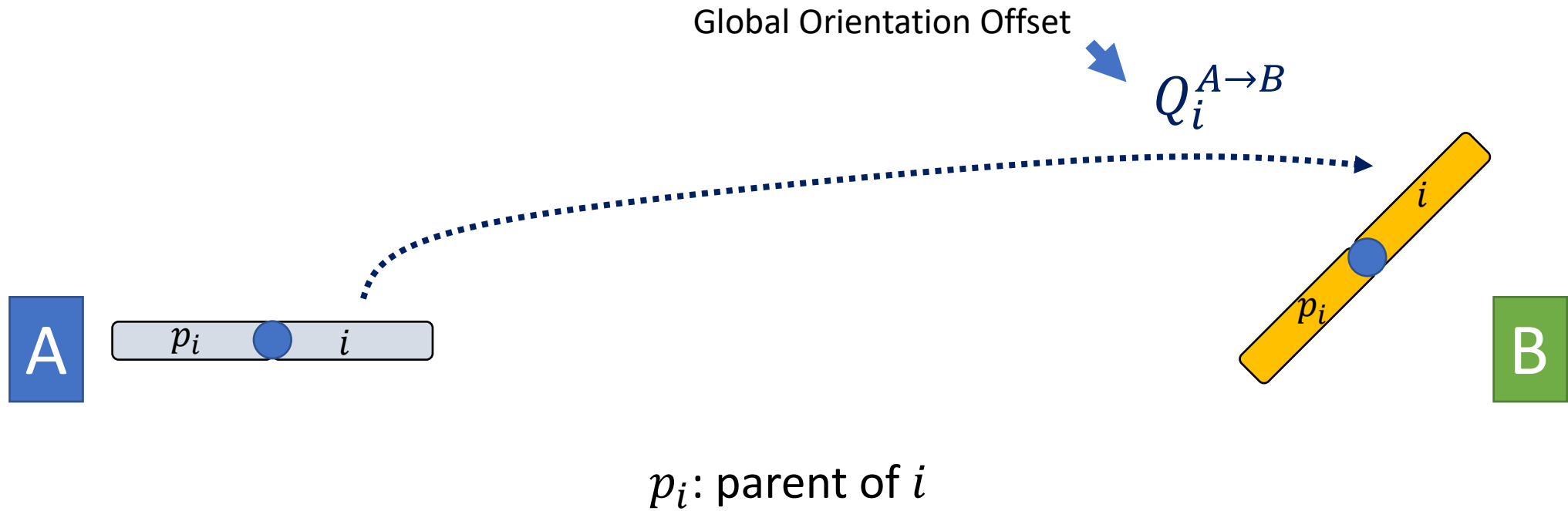


Retargeting for a chain of links

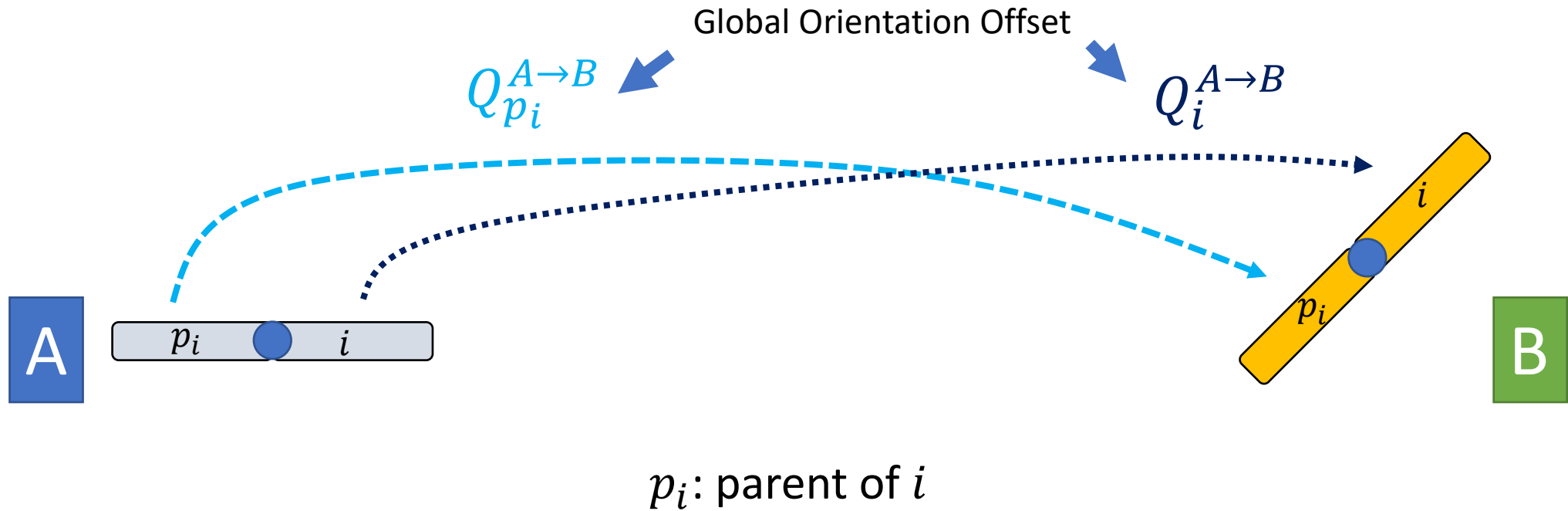


p_i : parent of i

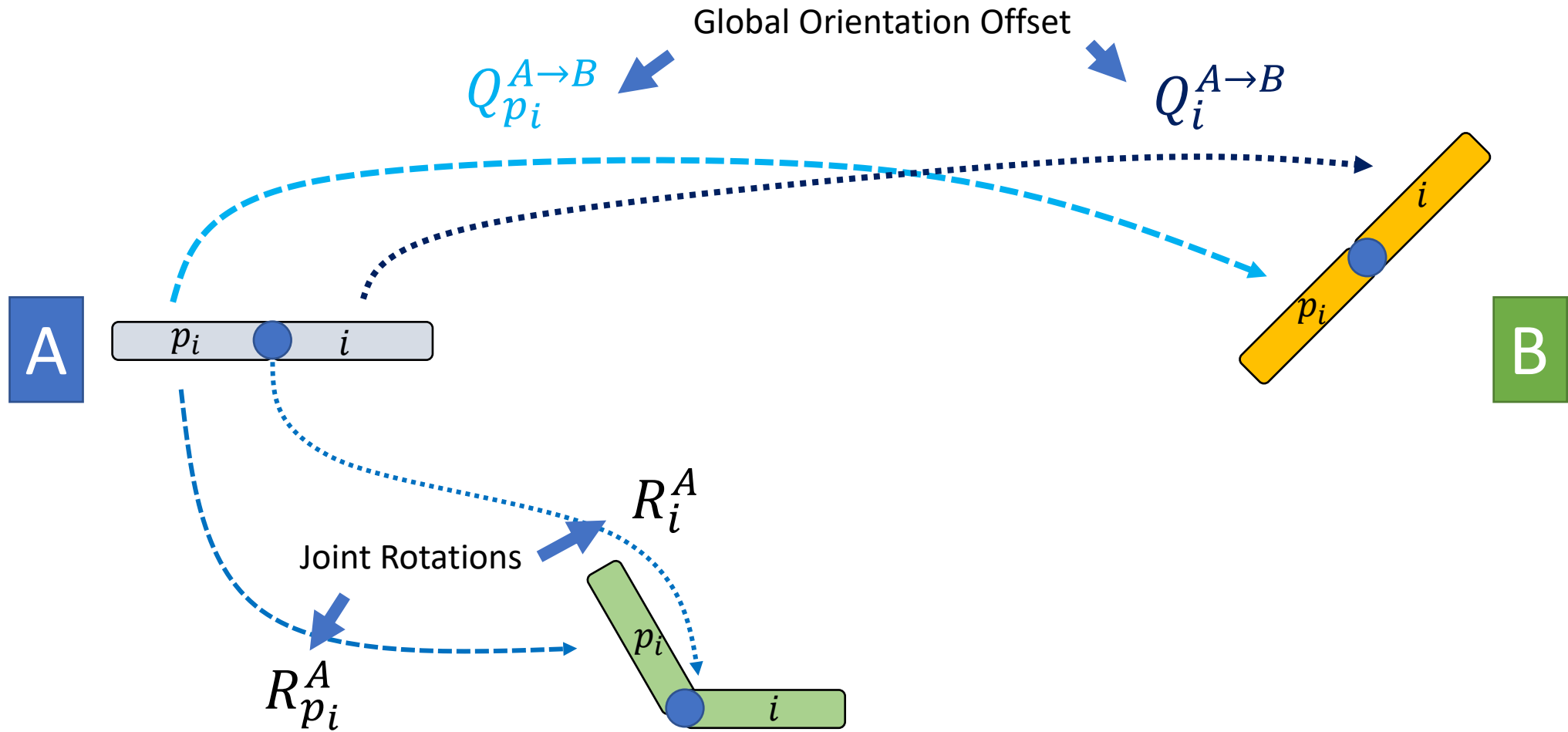
Retargeting for a chain of links



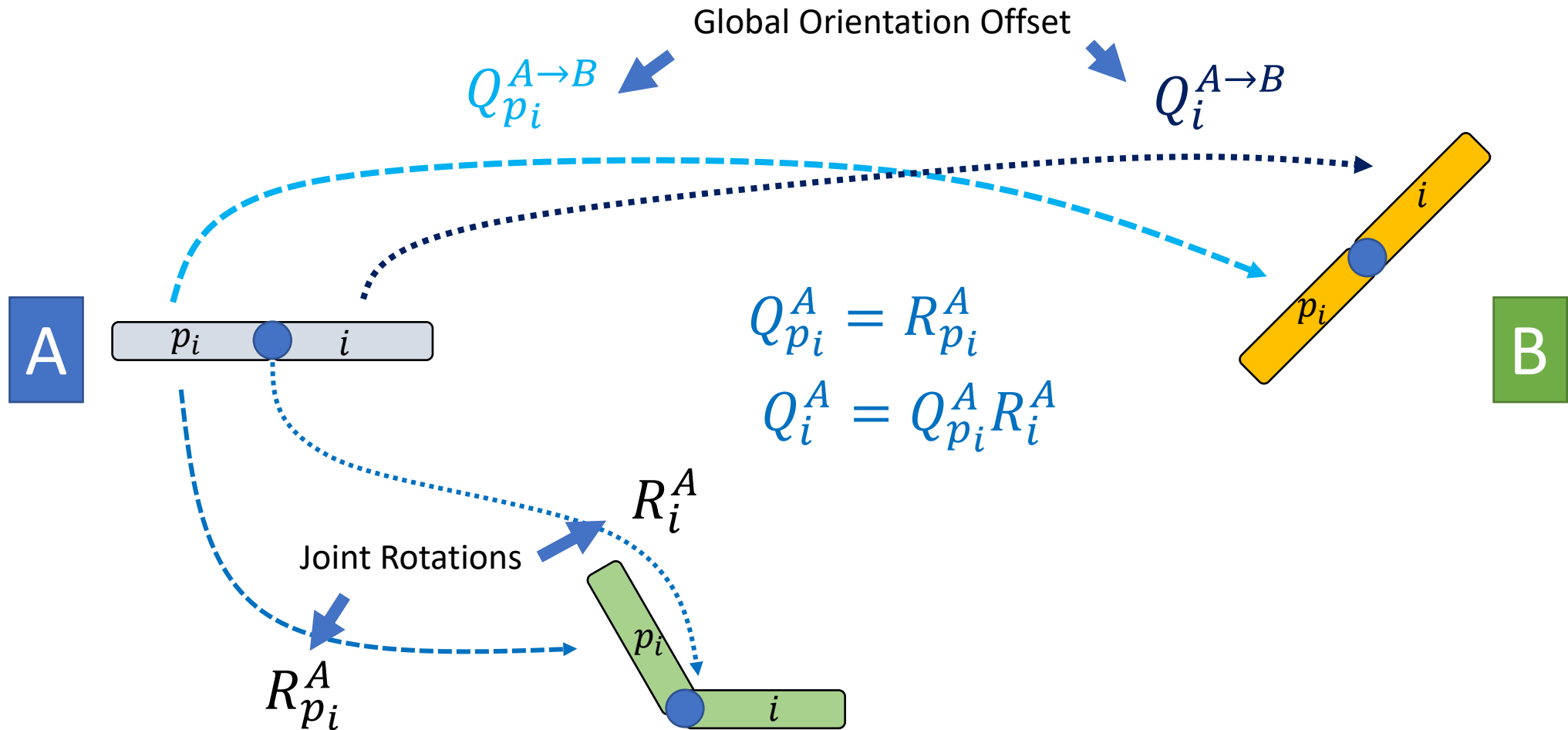
Retargeting for a chain of links



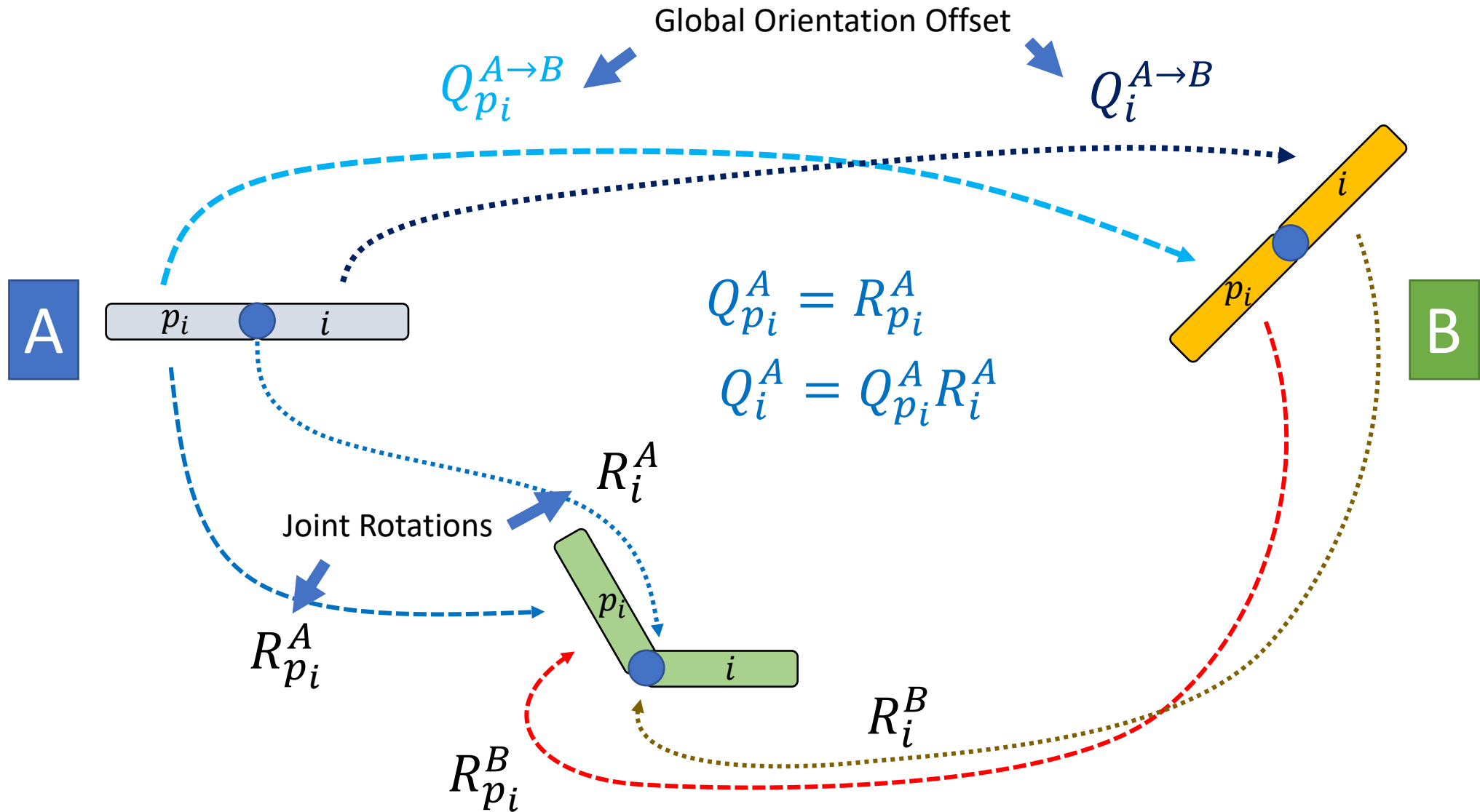
Retargeting for a chain of links



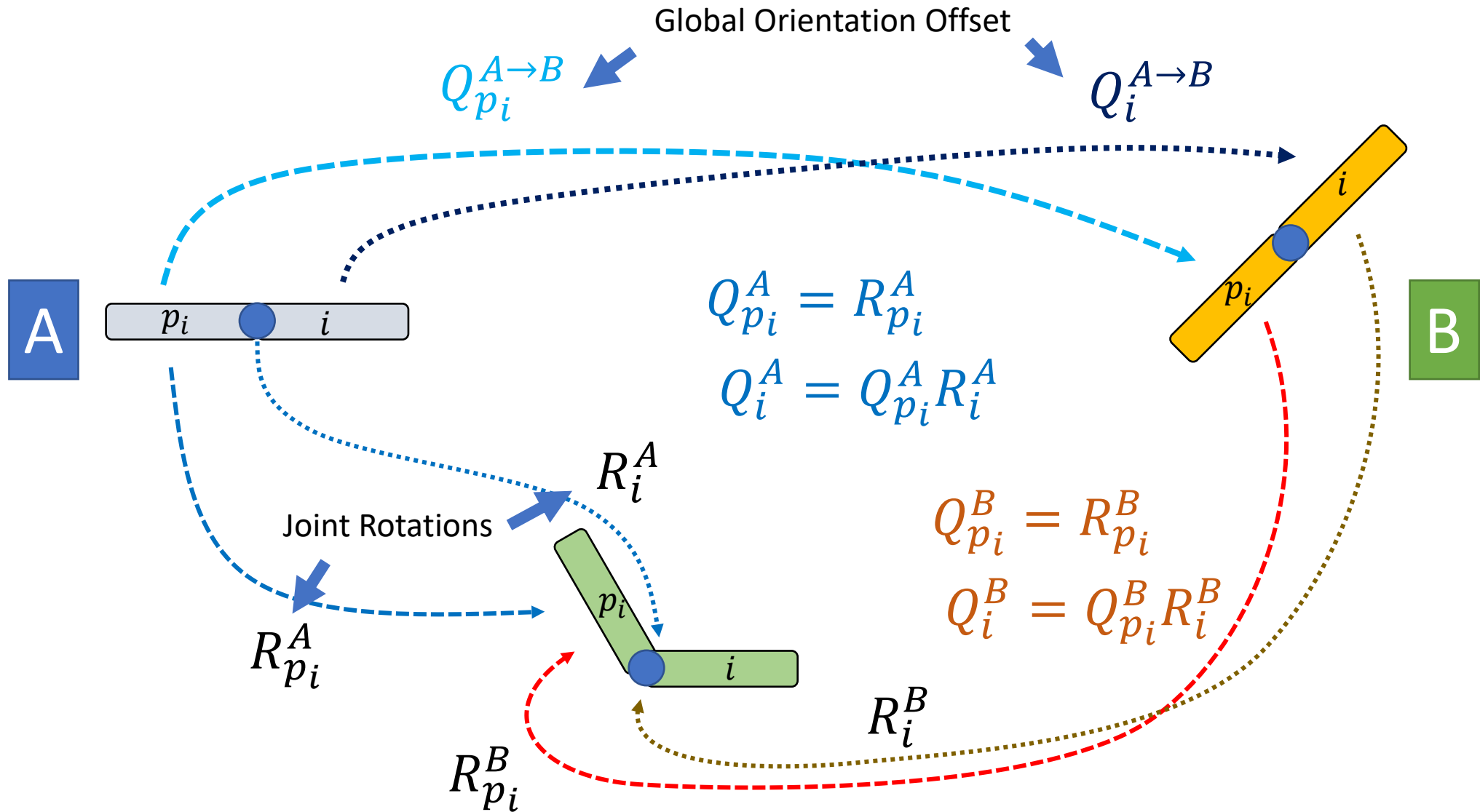
Retargeting for a chain of links



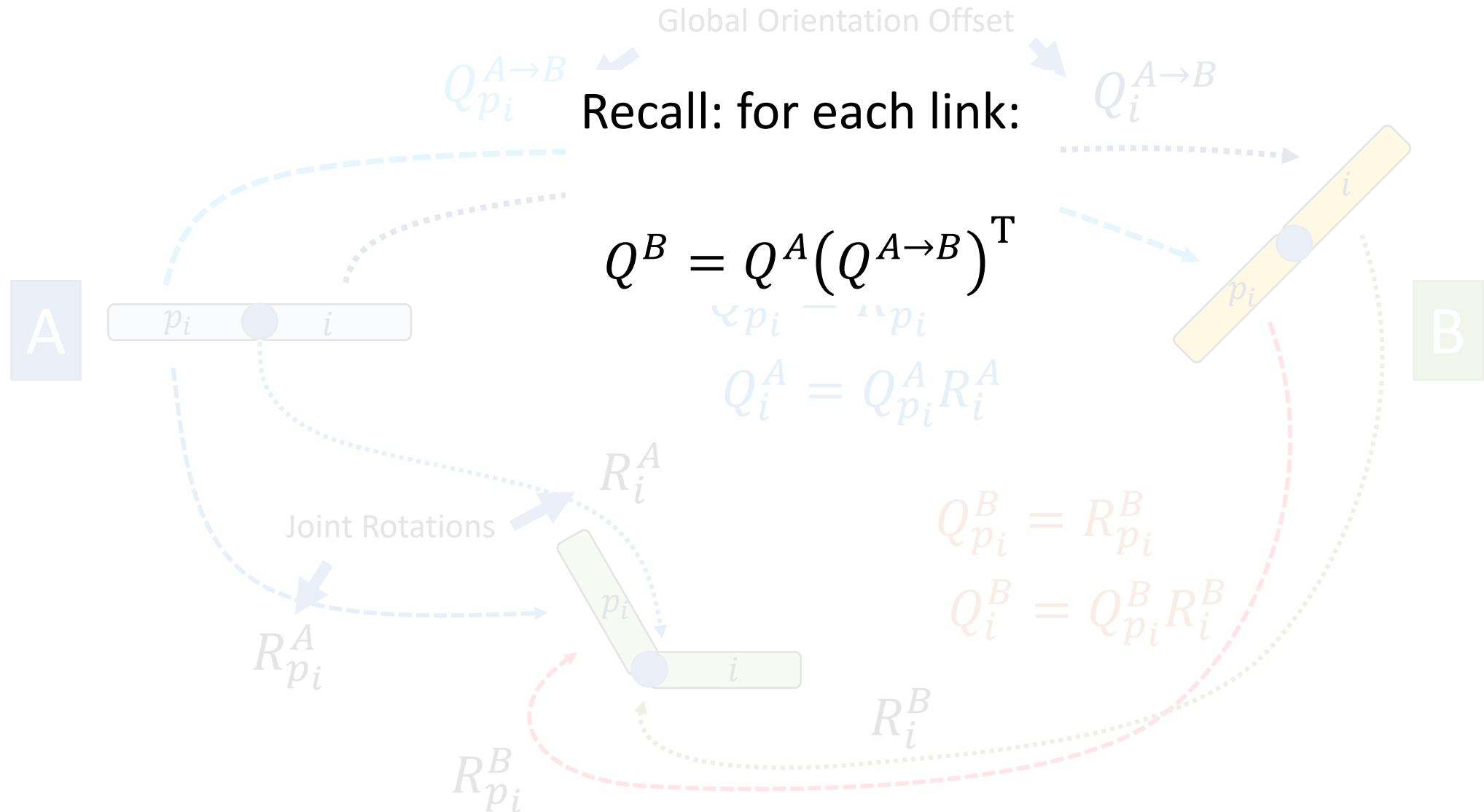
Retargeting for a chain of links



Retargeting for a chain of links



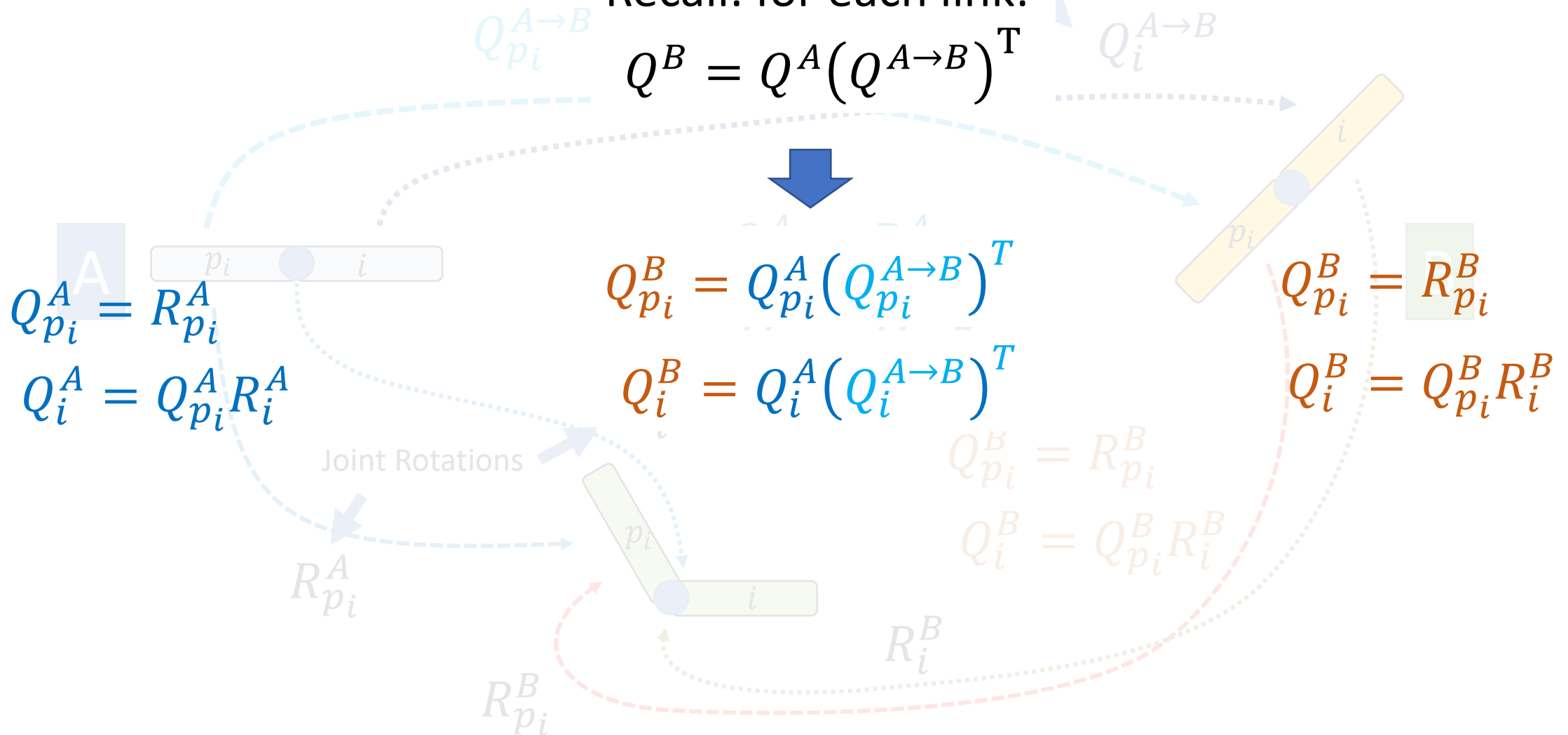
Retargeting for a chain of links



Retargeting for a chain of links

Recall: for each link:

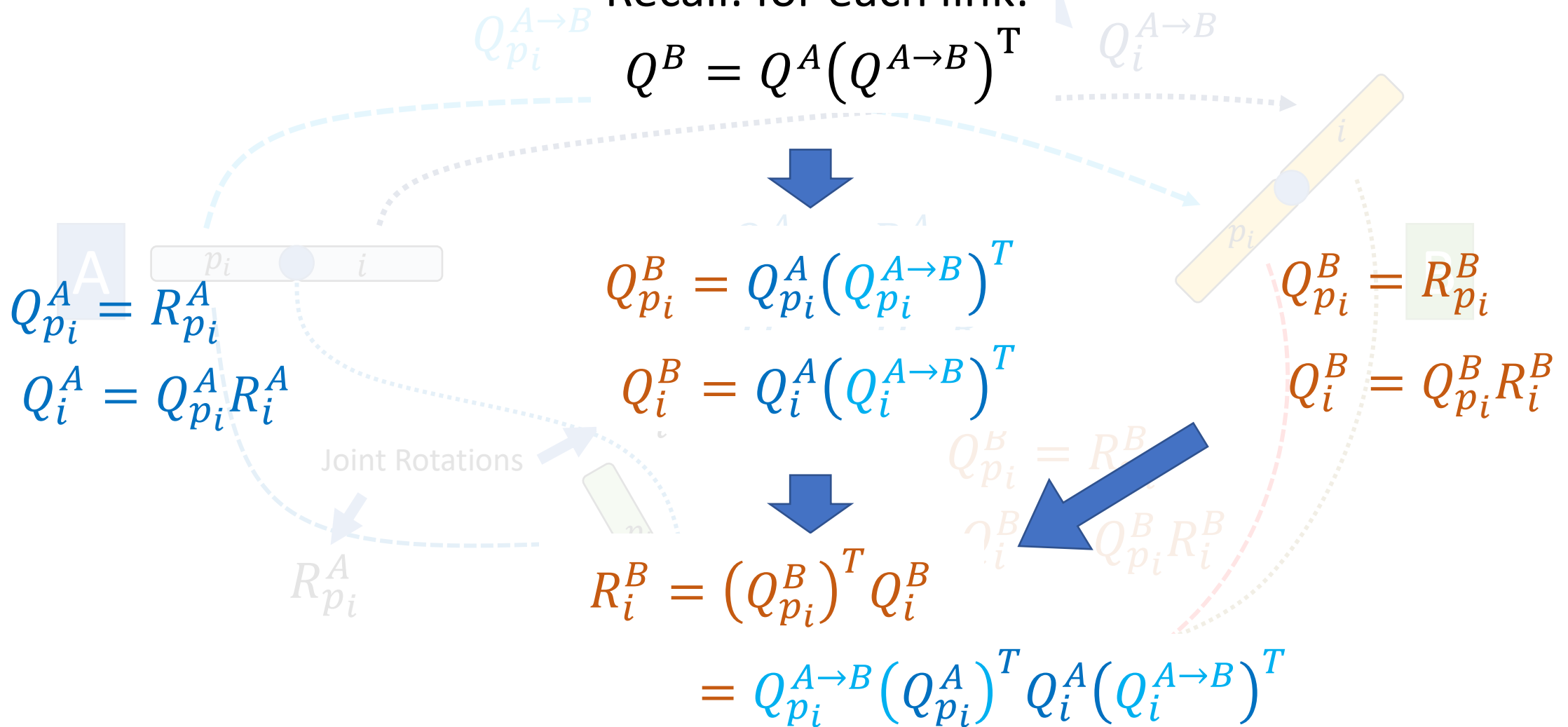
$$Q^B = Q^A (Q^{A \rightarrow B})^T$$



Retargeting for a chain of links

Recall: for each link:

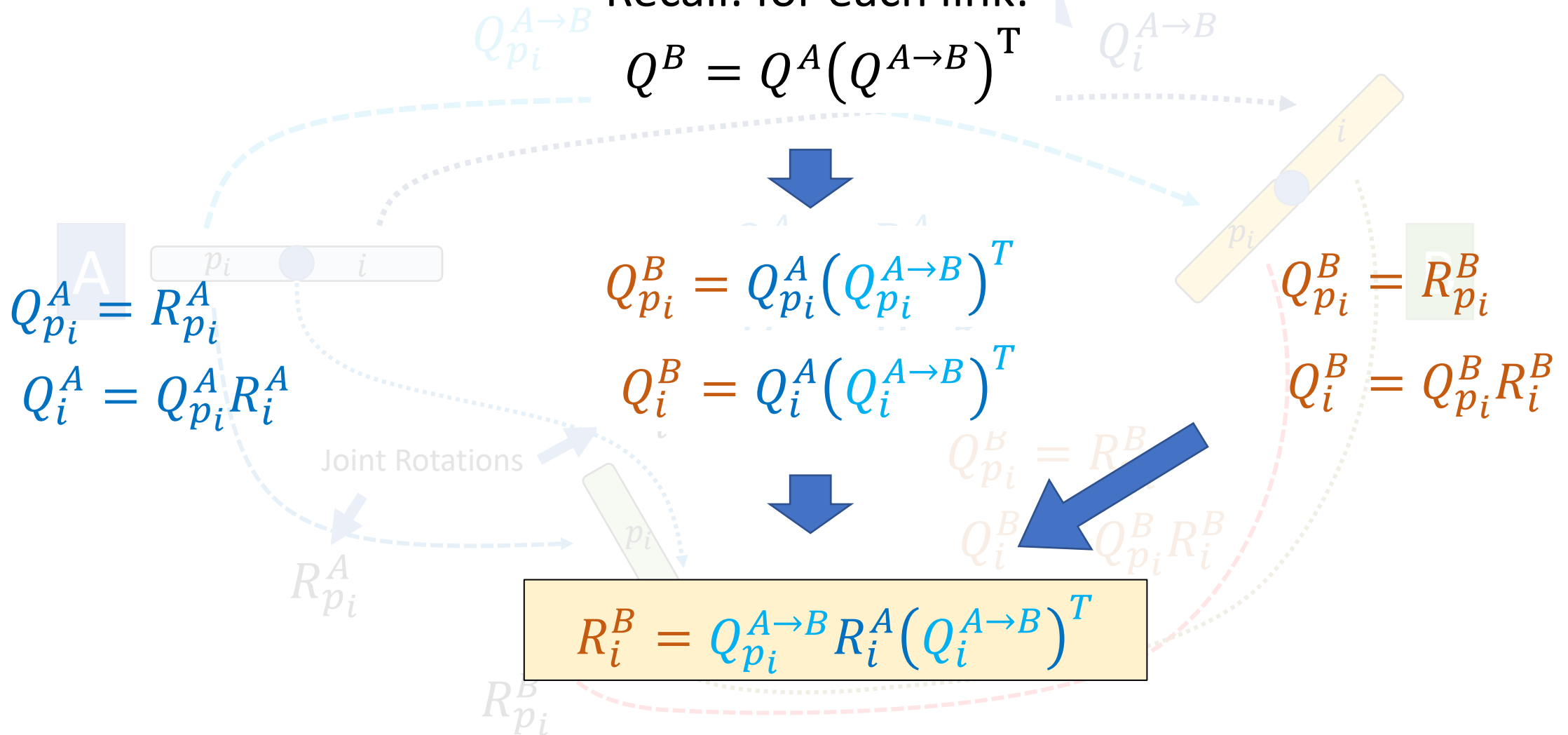
$$Q^B = Q^A (Q^{A \rightarrow B})^T$$



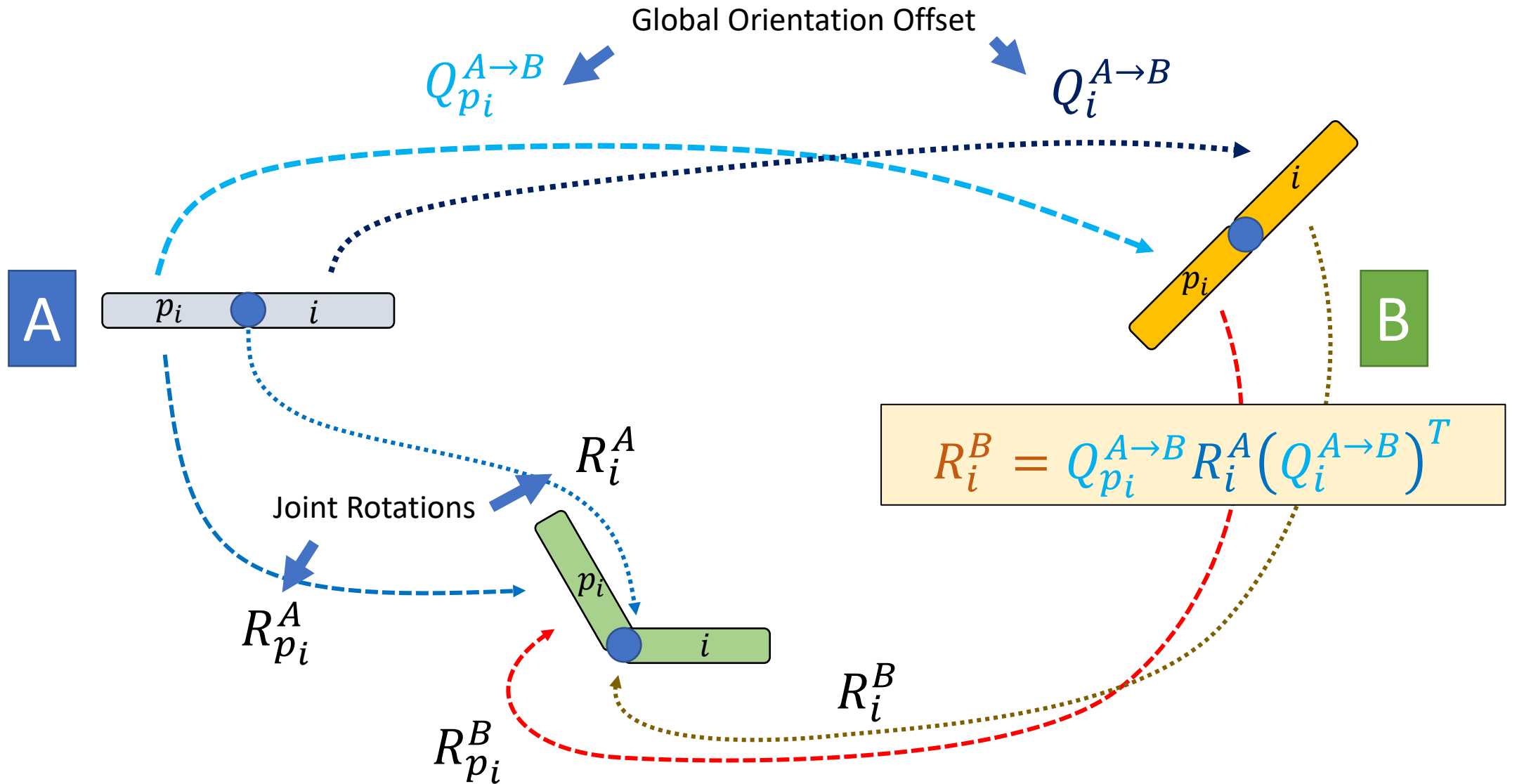
Retargeting for a chain of links

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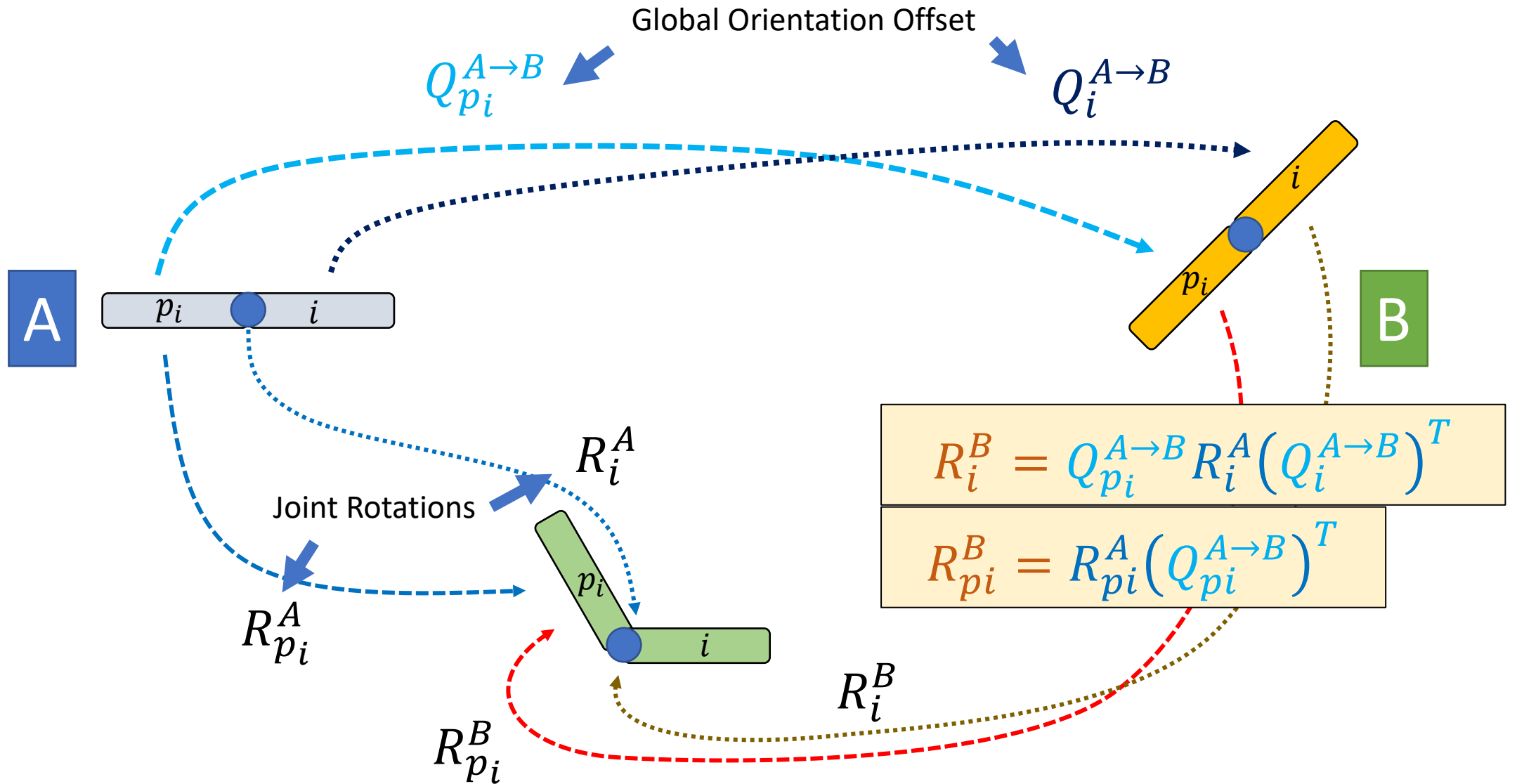
$$Q^B = Q^A (Q^{A \rightarrow B})^T$$



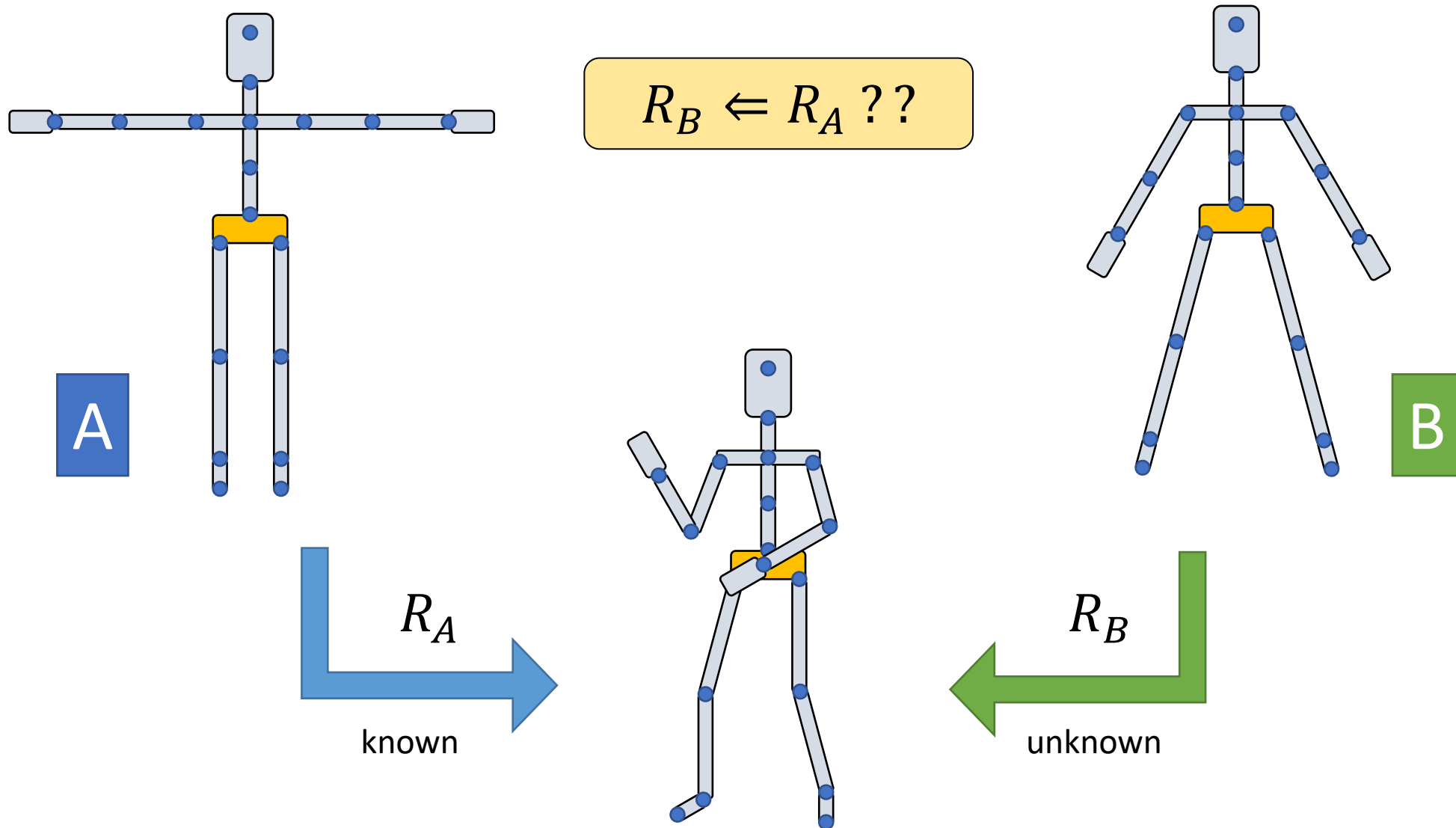
Retargeting for a chain of links



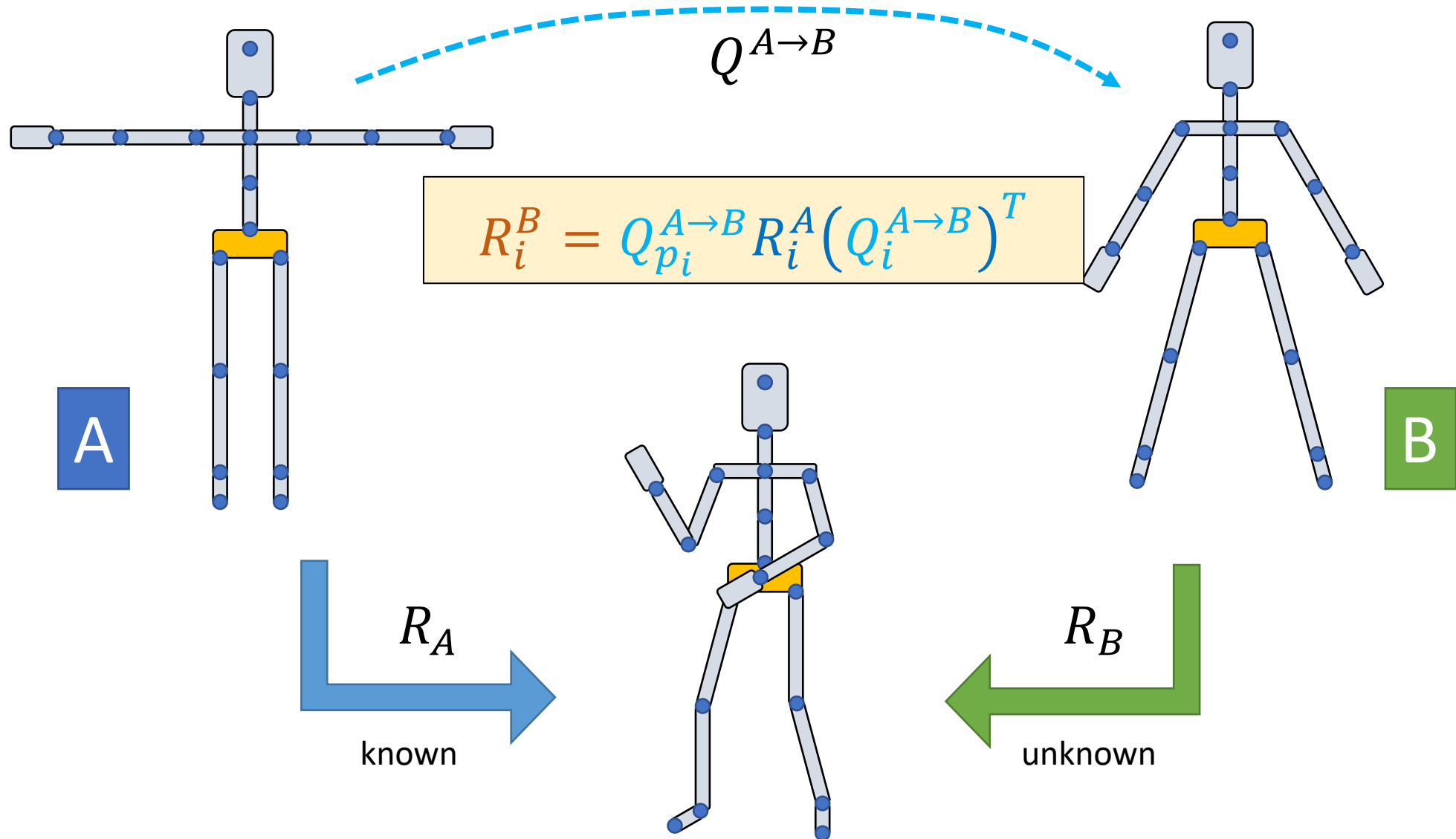
Retargeting for a chain of links



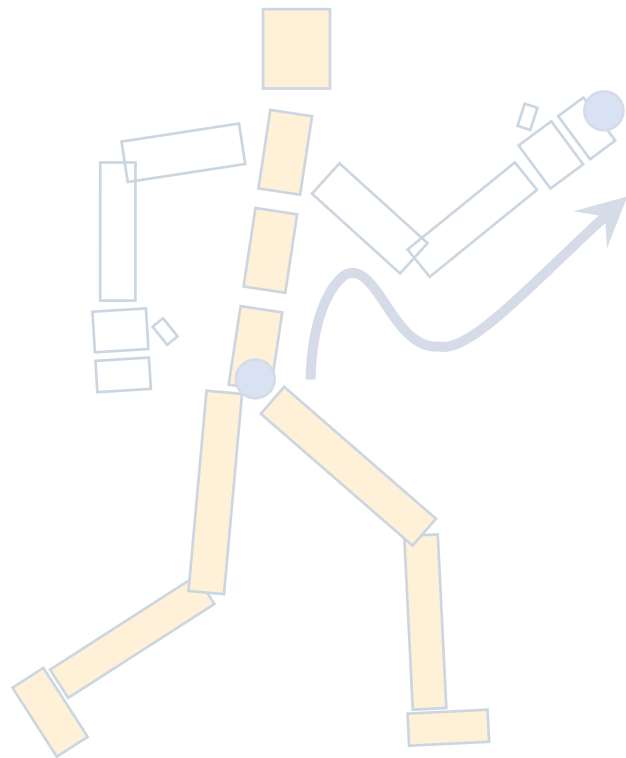
Retargeting between reference poses



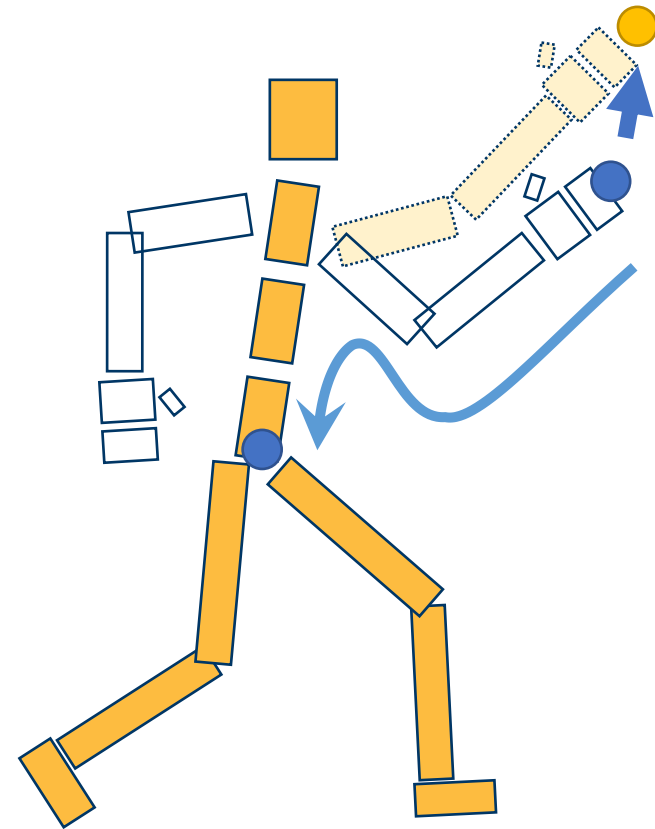
Retargeting between reference poses



Recap: Character Kinematics

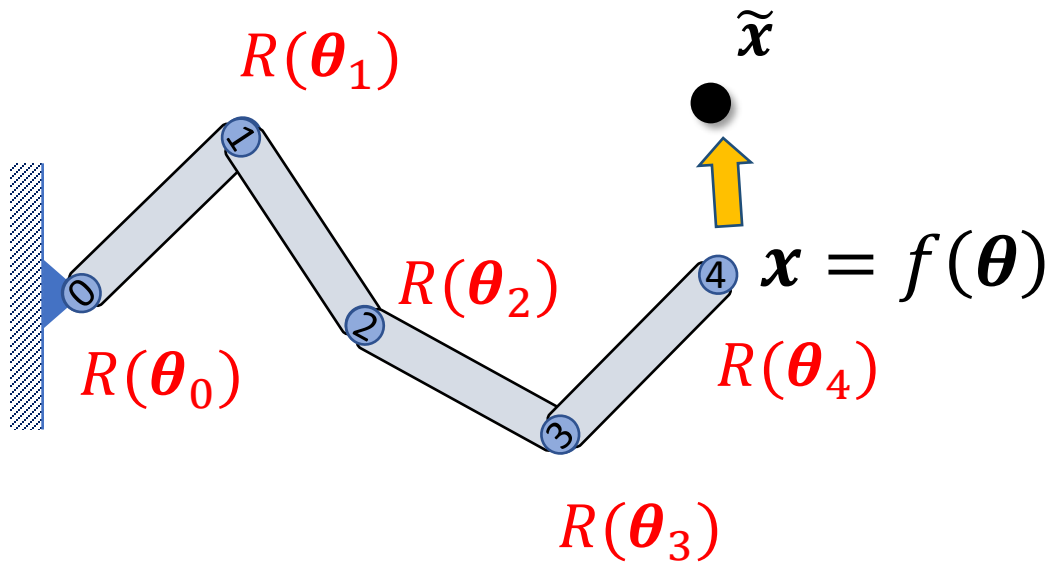


Forward Kinematics



Inverse Kinematics

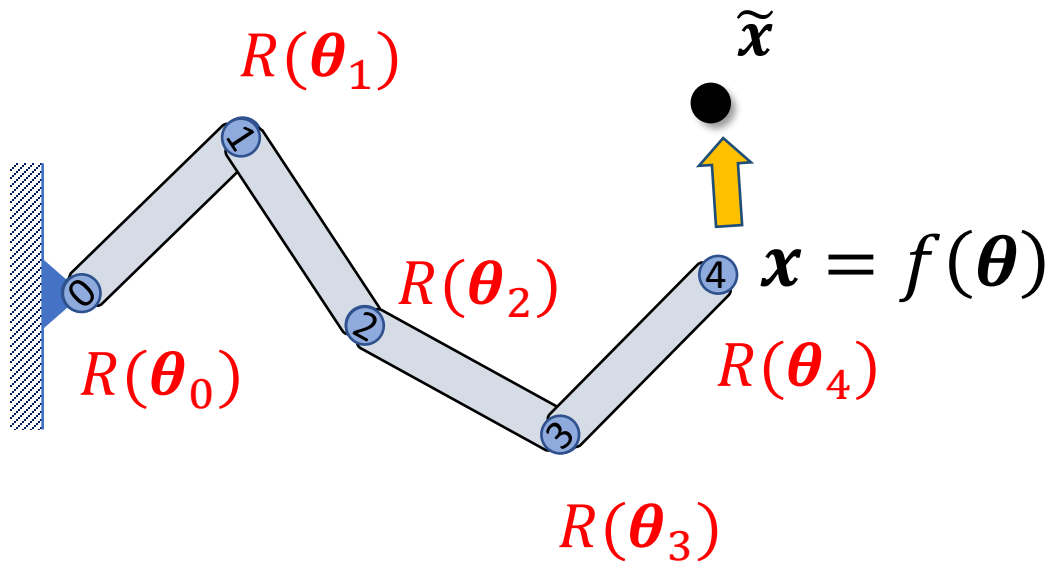
Recap: IK as an Optimization Problem



Find θ such that

$$\tilde{x} - f(\theta) = 0$$

Recap: IK as an Optimization Problem



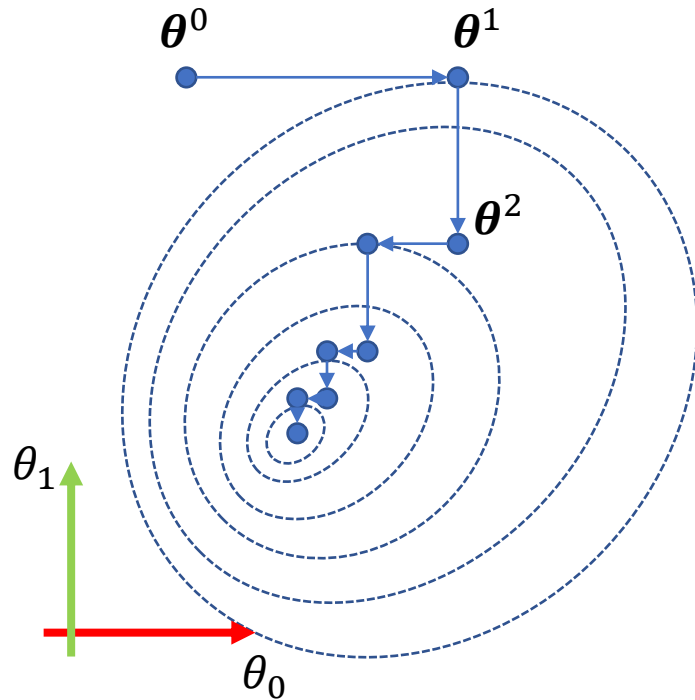
Find θ to optimize

$$\min_{\theta} \frac{1}{2} \|f(\theta) - \tilde{x}\|_2^2$$

Recap: Cyclic Coordinate Descent (CCD)

Update parameters along each axis of the coordinate system

Iterate cyclically through all axes

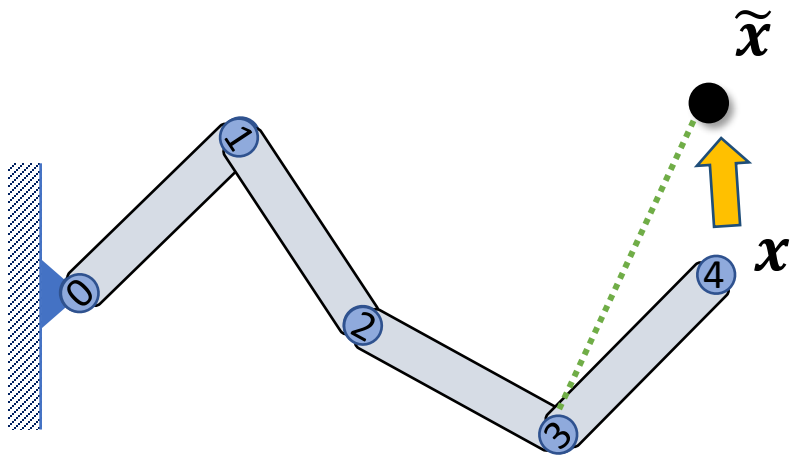


$$\min_{\theta_j} \frac{1}{2} \|f(\theta_0^i, \dots, \theta_j^i, \dots, \theta_n^i) - \tilde{\mathbf{x}}\|_2^2$$



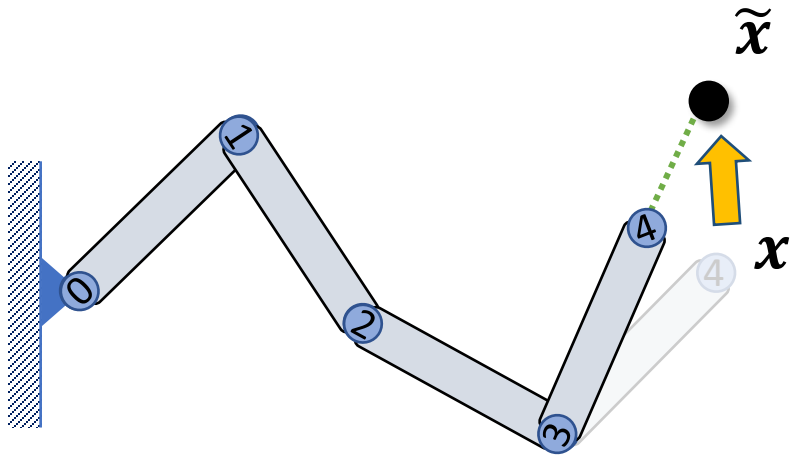
$$\theta^{i+1} = (\theta_0^i, \dots, \theta_j^{i+1}, \dots, \theta_n^i)$$

Cyclic Coordinate Descent (CCD) IK



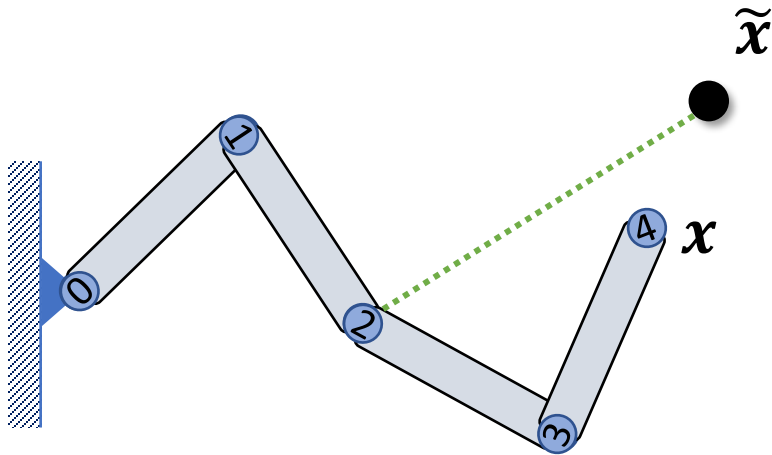
Rotate joint 3 such that

Cyclic Coordinate Descent (CCD) IK



Rotate joint 3 such that l_{34} points towards \tilde{x}

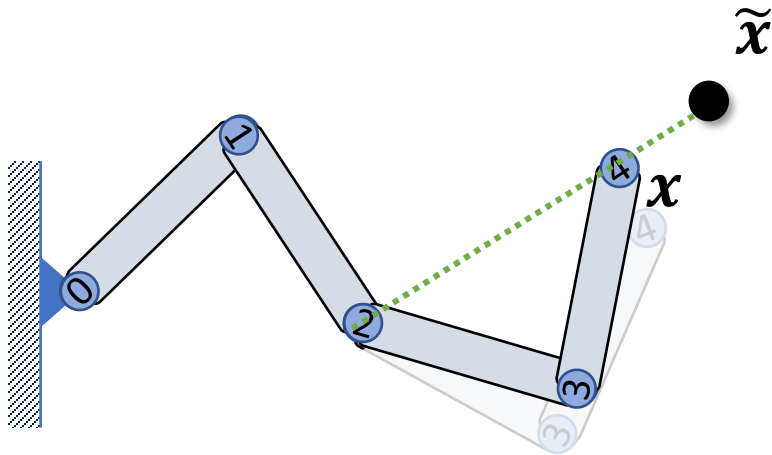
Cyclic Coordinate Descent (CCD) IK



Rotate joint 3 such that l_{34} points towards \tilde{x}

Rotate joint 2 such that l_{24} points towards \tilde{x}

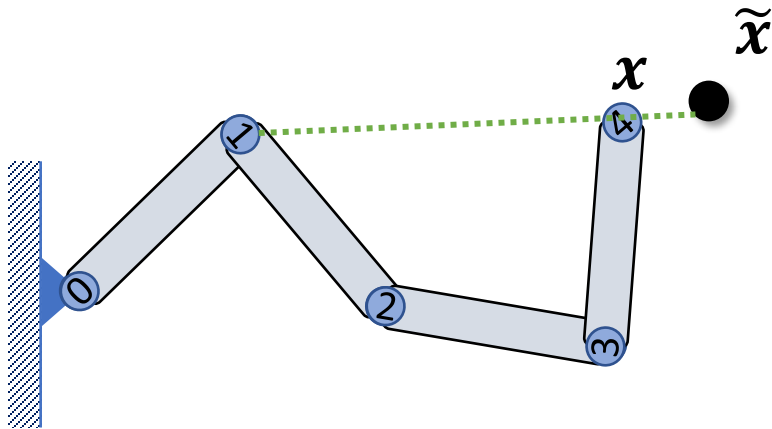
Cyclic Coordinate Descent (CCD) IK



Rotate joint 3 such that l_{34} points towards \tilde{x}

Rotate joint 2 such that l_{24} points towards \tilde{x}

Cyclic Coordinate Descent (CCD) IK

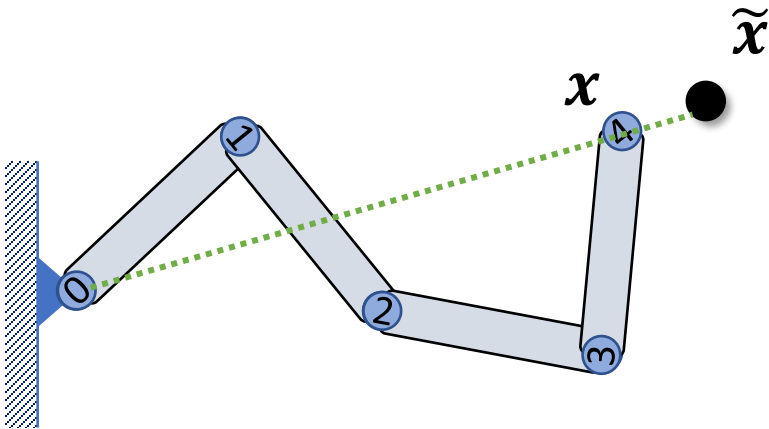


Rotate joint 3 such that l_{34} points towards \tilde{x}

Rotate joint 2 such that l_{24} points towards \tilde{x}

Rotate joint 1 such that l_{14} points towards \tilde{x}

Cyclic Coordinate Descent (CCD) IK



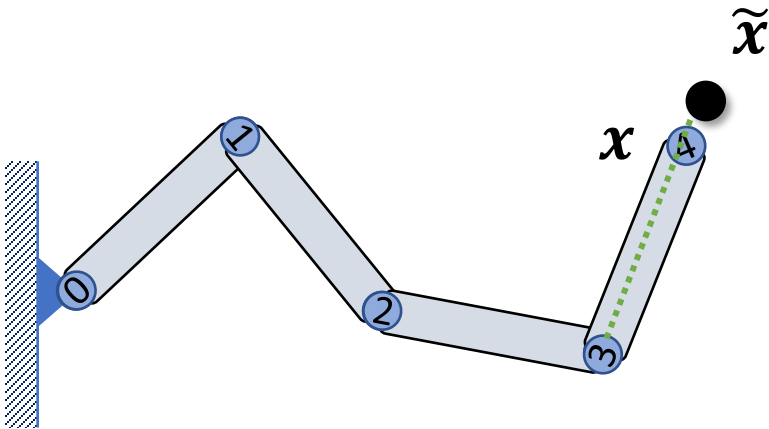
Rotate joint 3 such that l_{34} points towards \tilde{x}

Rotate joint 2 such that l_{24} points towards \tilde{x}

Rotate joint 1 such that l_{14} points towards \tilde{x}

Rotate joint 0 such that l_{14} points towards \tilde{x}

Cyclic Coordinate Descent (CCD) IK



Rotate joint 3 such that l_{34} points towards \tilde{x}

Rotate joint 2 such that l_{24} points towards \tilde{x}

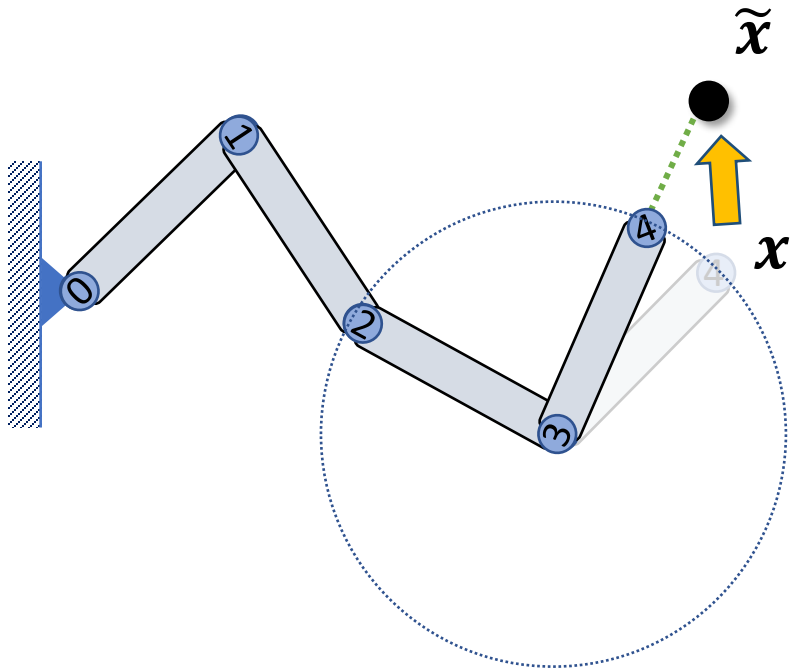
Rotate joint 1 such that l_{14} points towards \tilde{x}

Rotate joint 0 such that l_{14} points towards \tilde{x}

Rotate joint 3 such that l'_{34} points towards \tilde{x}

.....

Cyclic Coordinate Descent (CCD) IK



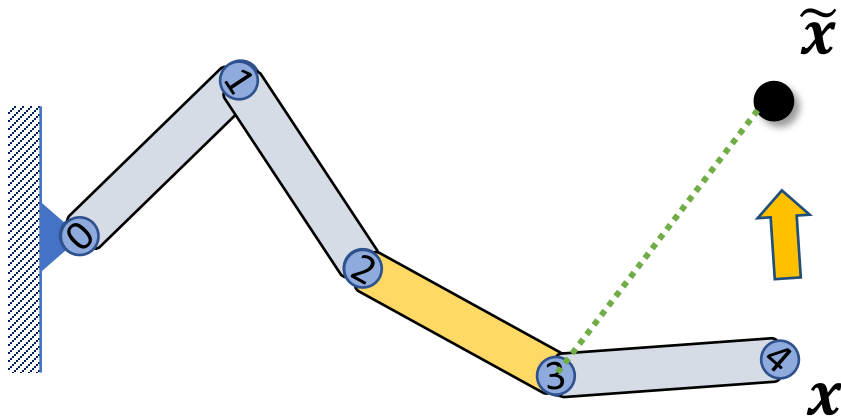
Rotate joint 3 such that l_{34} points towards \tilde{x}

$$\min_{\theta_3} F(\boldsymbol{\theta})$$

$$= \min_{\theta_3} \frac{1}{2} \|f(\theta_0, \theta_1, \theta_2, \theta_3) - \tilde{x}\|_2^2$$

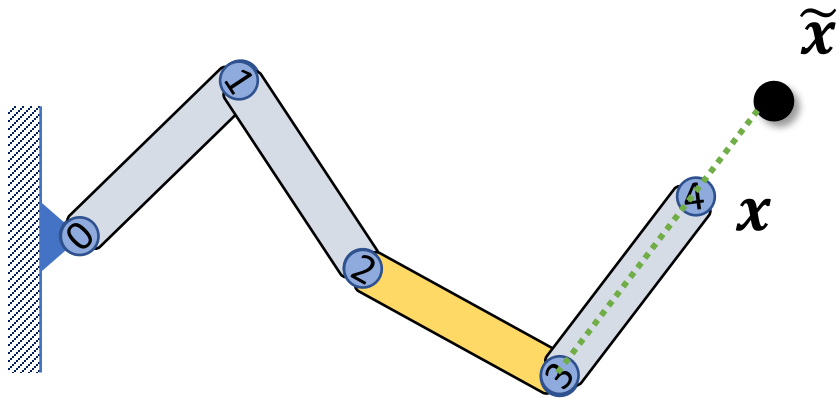
Cyclic Coordinate Descent (CCD) IK

Rotate joint 3 such that l_{34} points towards \tilde{x}



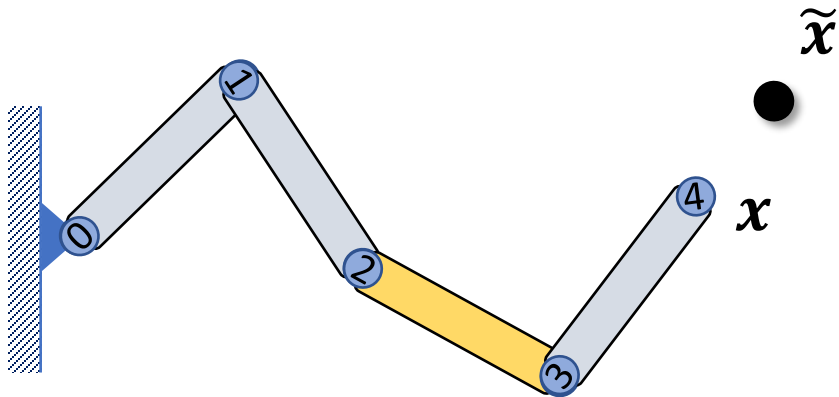
What if link 2 cannot rotate
but can stretch?

Cyclic Coordinate Descent (CCD) IK



Rotate joint 3 such that l_{34} points towards \tilde{x}

Cyclic Coordinate Descent (CCD) IK

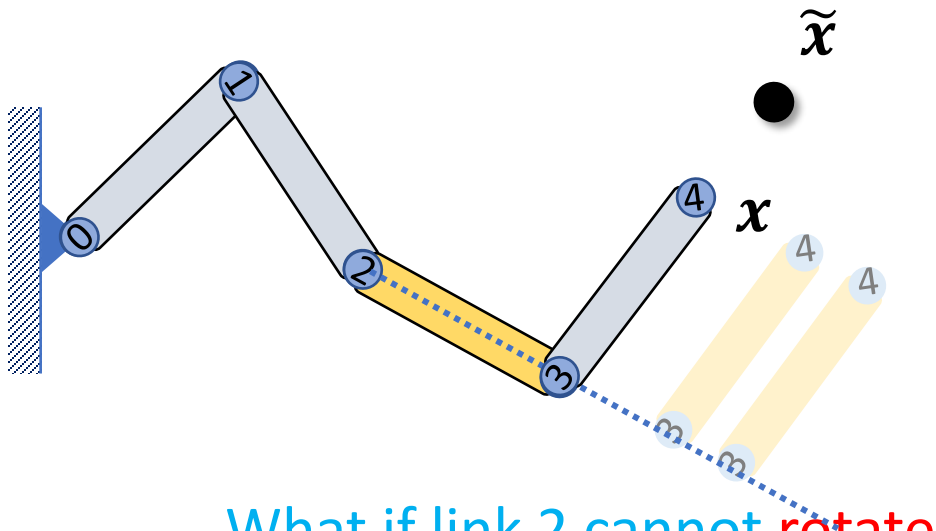


Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that ...?

What if link 2 cannot rotate
but can stretch?

Cyclic Coordinate Descent (CCD) IK

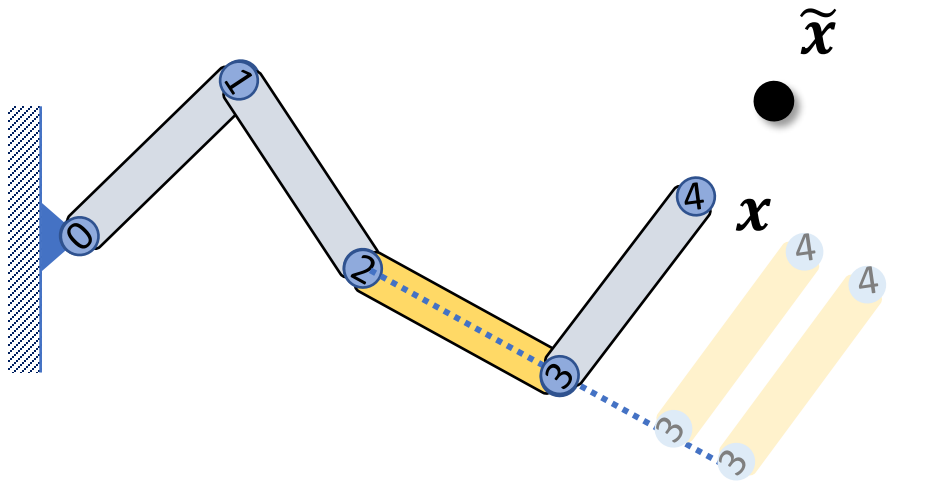


What if link 2 cannot rotate but can stretch?

Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that ...?

Cyclic Coordinate Descent (CCD) IK



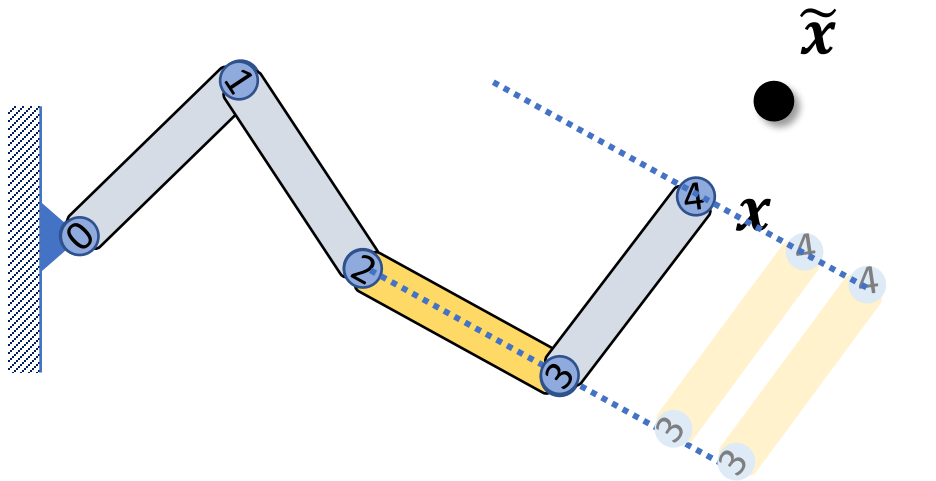
What if link 2 cannot rotate but can stretch?

Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that ...?

$$\begin{aligned} & \min_{\theta_2} F(\boldsymbol{\theta}) \\ & = \min_{\theta_2} \frac{1}{2} \|f(\theta_0, \theta_1, \theta_2, \theta_3) - \tilde{x}\|_2^2 \end{aligned}$$

Cyclic Coordinate Descent (CCD) IK



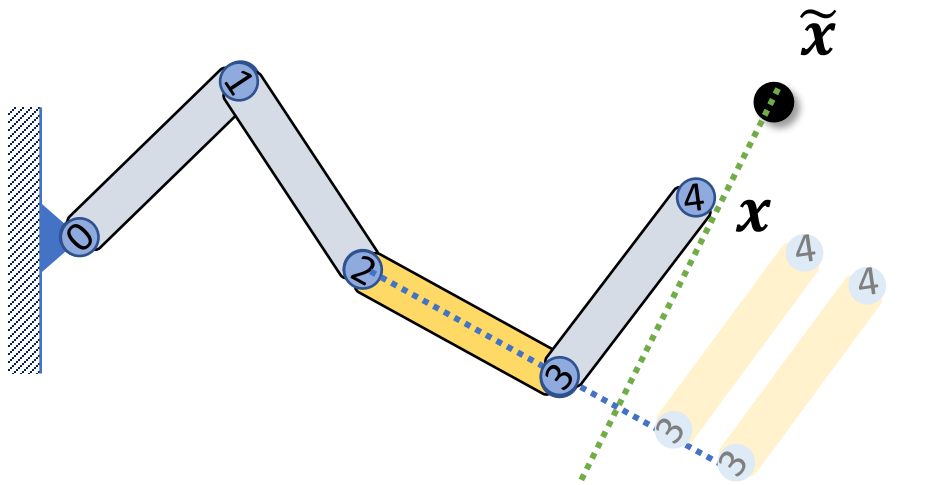
What if link 2 cannot rotate but can stretch?

Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that ...?

$$\begin{aligned} & \min_{\theta_2} F(\theta) \\ & = \min_{\theta_2} \frac{1}{2} \|f(\theta_0, \theta_1, \theta_2, \theta_3) - \tilde{x}\|_2^2 \end{aligned}$$

Cyclic Coordinate Descent (CCD) IK



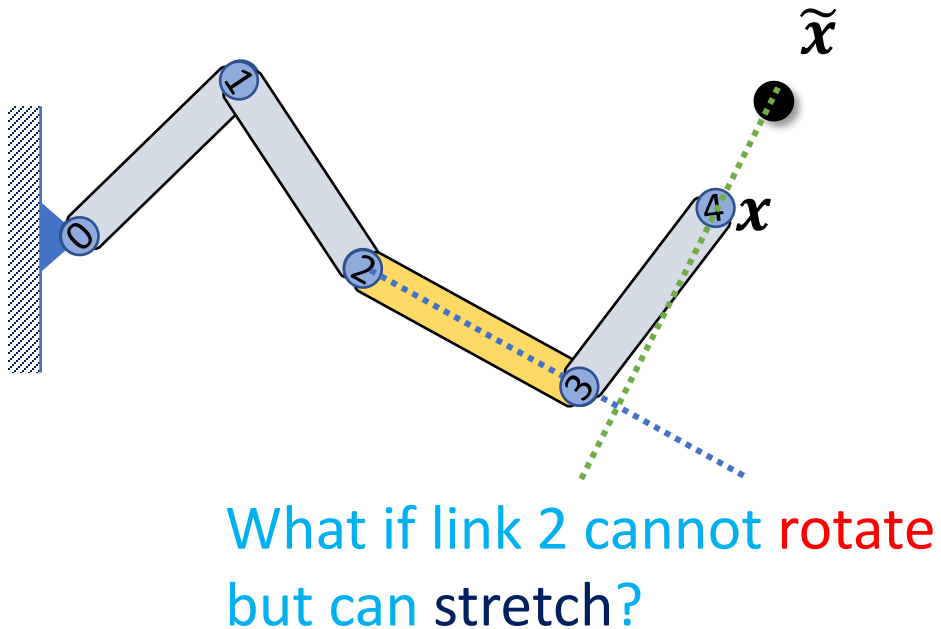
What if link 2 cannot rotate but can stretch?

Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that ...?

$$\begin{aligned} & \min_{\theta_2} F(\boldsymbol{\theta}) \\ & = \min_{\theta_2} \frac{1}{2} \|f(\theta_0, \theta_1, \theta_2, \theta_3) - \tilde{x}\|_2^2 \end{aligned}$$

Cyclic Coordinate Descent (CCD) IK

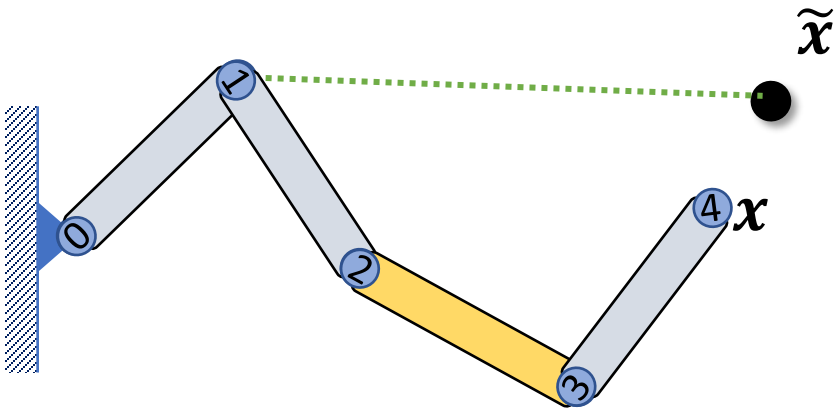


Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that $(x - \tilde{x}) \perp l_{23}$

$$\begin{aligned} & \min_{\theta_2} F(\theta) \\ & = \min_{\theta_2} \frac{1}{2} \|f(\theta_0, \theta_1, \theta_2, \theta_3) - \tilde{x}\|_2^2 \end{aligned}$$

Cyclic Coordinate Descent (CCD) IK

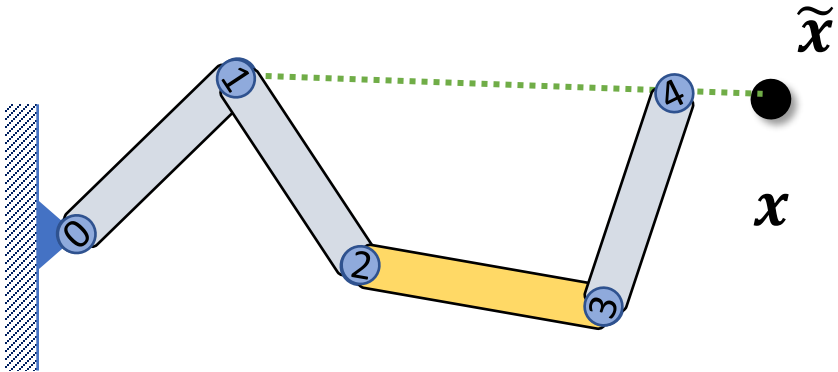


Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that $(x - \tilde{x}) \perp l_{23}$

Rotate joint 1 such that l_{14} points towards \tilde{x}

Cyclic Coordinate Descent (CCD) IK



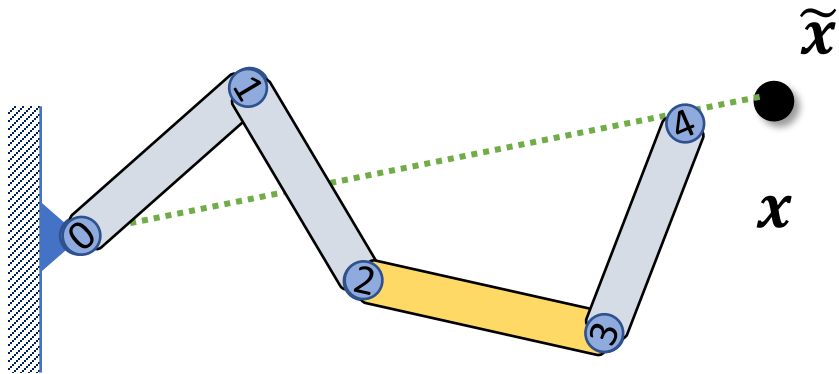
Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that $(x - \tilde{x}) \perp l_{23}$

Rotate joint 1 such that l_{14} points towards \tilde{x}

.....

Cyclic Coordinate Descent (CCD) IK



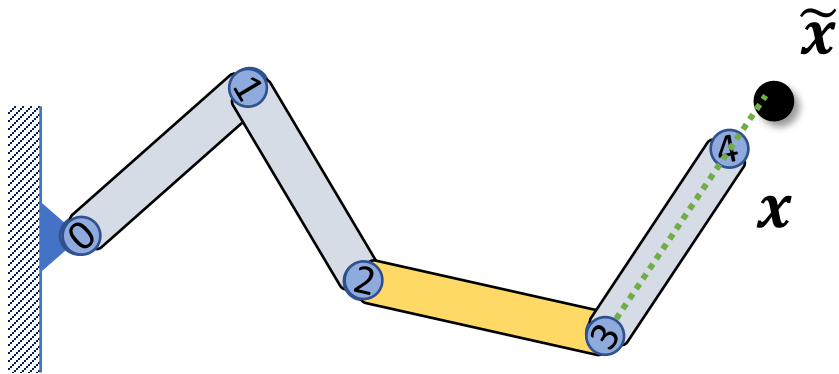
Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that $(x - \tilde{x}) \perp l_{23}$

Rotate joint 1 such that l_{14} points towards \tilde{x}

.....

Cyclic Coordinate Descent (CCD) IK



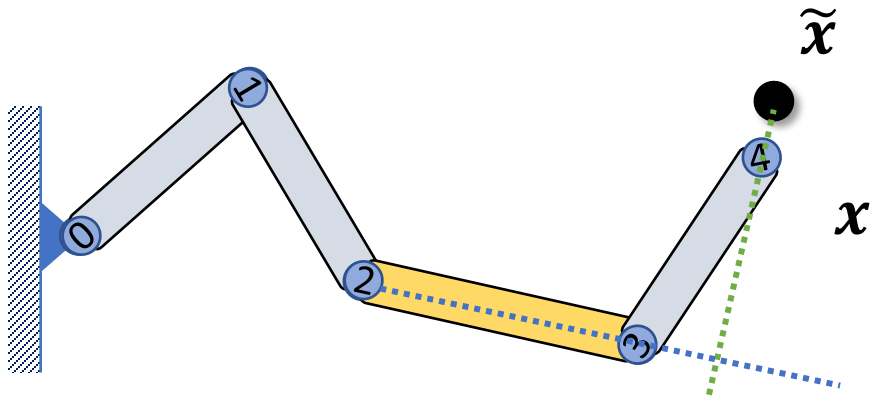
Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that $(x - \tilde{x}) \perp l_{23}$

Rotate joint 1 such that l_{14} points towards \tilde{x}

.....

Cyclic Coordinate Descent (CCD) IK



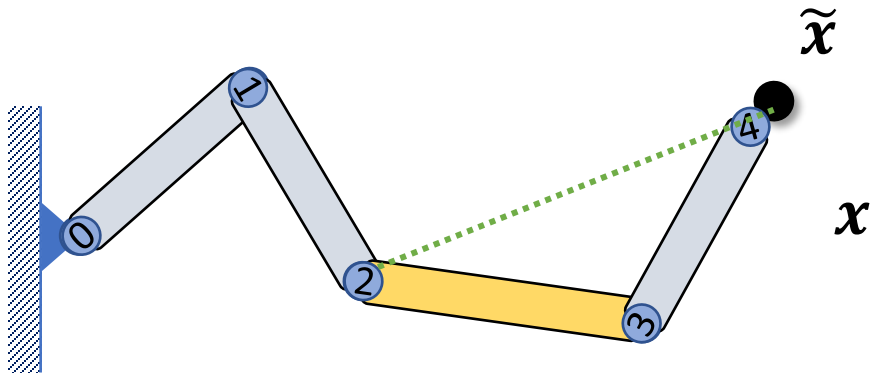
Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that $(x - \tilde{x}) \perp l_{23}$

Rotate joint 1 such that l_{14} points towards \tilde{x}

.....

Cyclic Coordinate Descent (CCD) IK



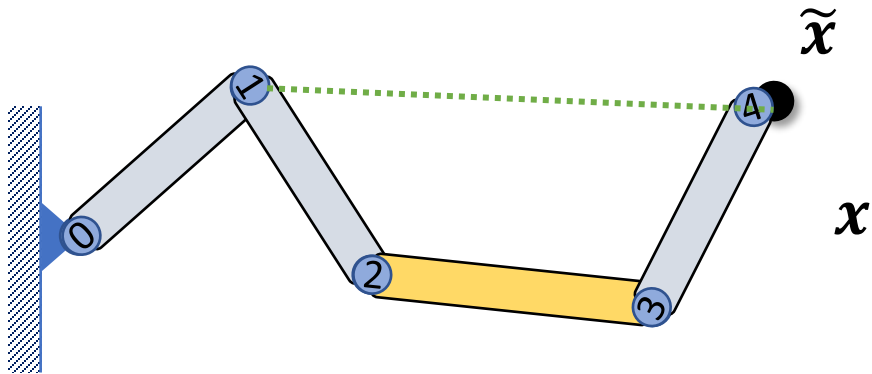
Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that $(x - \tilde{x}) \perp l_{23}$

Rotate joint 1 such that l_{14} points towards \tilde{x}

.....

Cyclic Coordinate Descent (CCD) IK



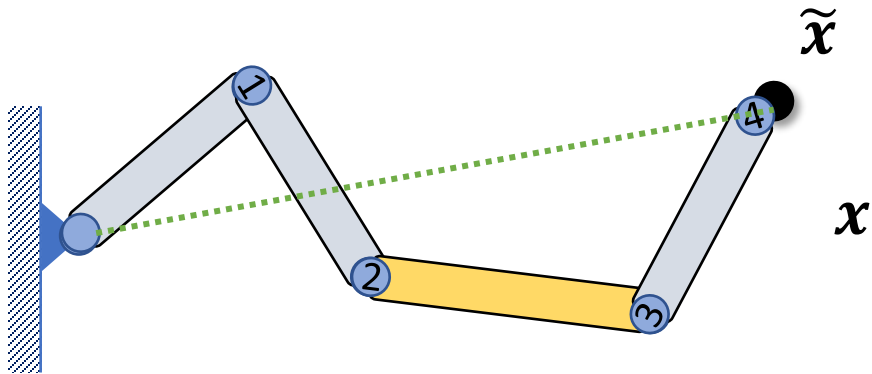
Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that $(x - \tilde{x}) \perp l_{23}$

Rotate joint 1 such that l_{14} points towards \tilde{x}

.....

Cyclic Coordinate Descent (CCD) IK



Rotate joint 3 such that l_{34} points towards \tilde{x}

Stretch link 2 such that $(x - \tilde{x}) \perp l_{23}$

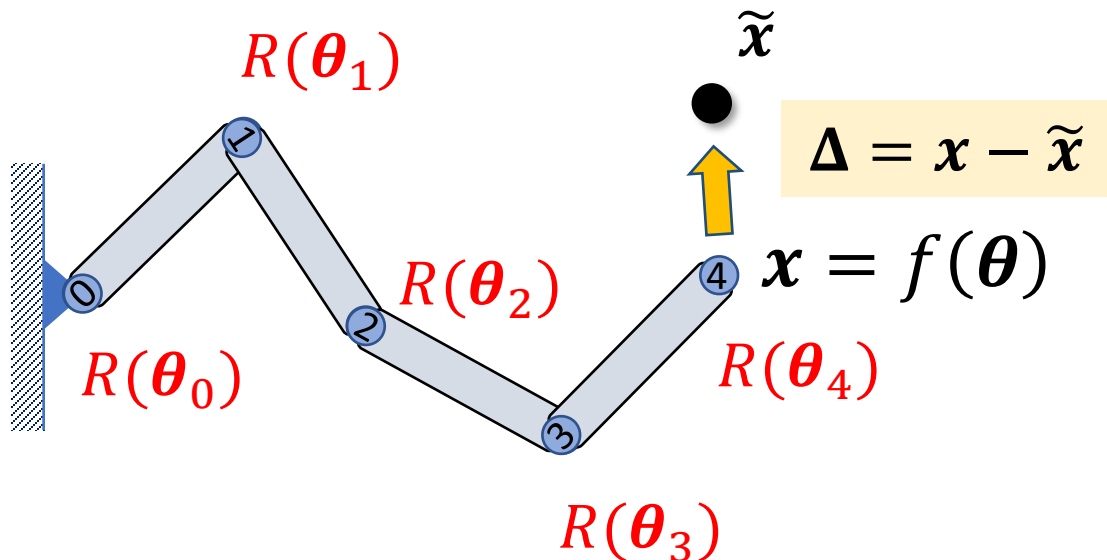
Rotate joint 1 such that l_{14} points towards \tilde{x}

.....

Recap: Jacobian Methods

Jacobian Matrix

$$J = \frac{\partial f}{\partial \theta} = \begin{pmatrix} \frac{\partial f}{\partial \theta_0} & \frac{\partial f}{\partial \theta_1} & \dots & \frac{\partial f}{\partial \theta_n} \end{pmatrix}$$



Jacobian Transpose Method

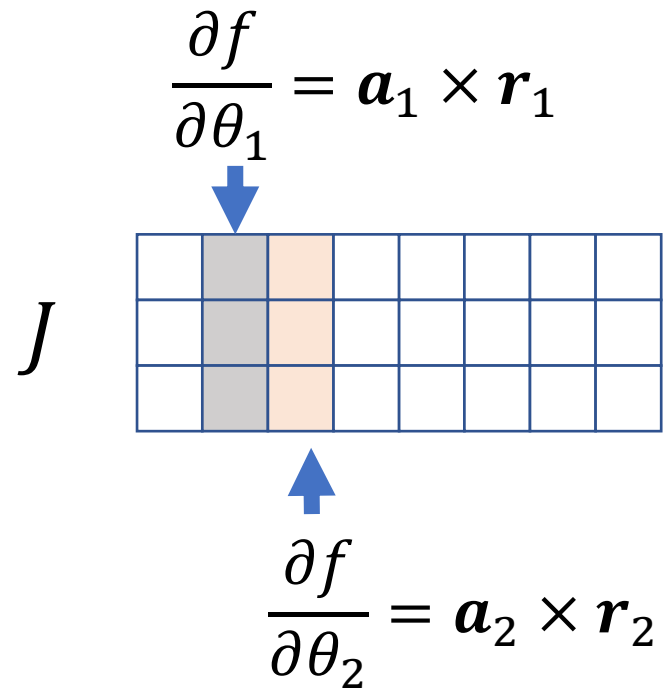
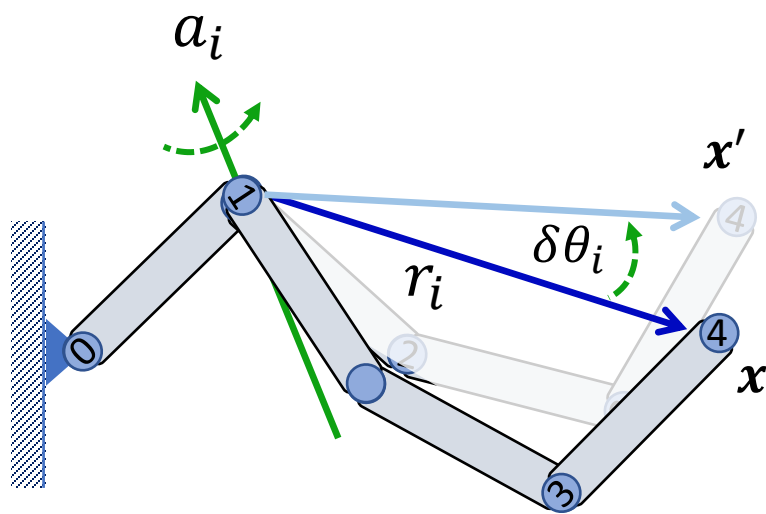
$$\theta^{i+1} = \theta^i - \alpha J^T \Delta$$

Jacobian Inverse Method

$$\theta^{i+1} = \theta^i - \alpha J^+ \Delta$$

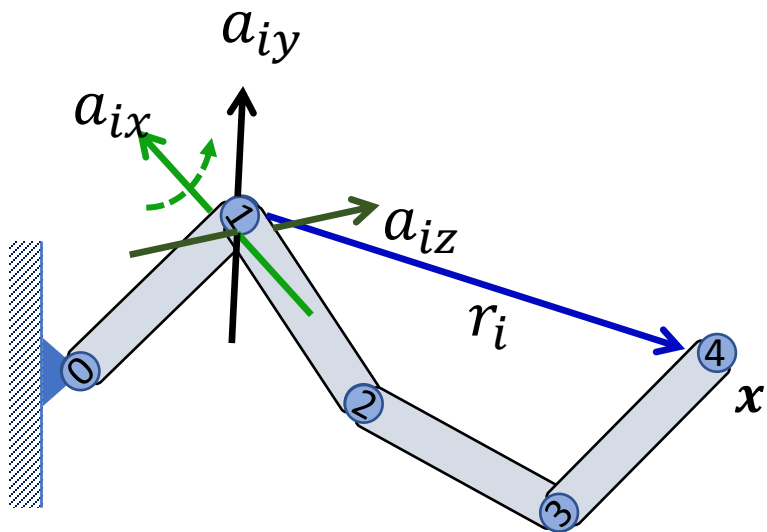
Geometric Method for Jacobian Matrix

Assuming all joints are hinge joint



Geometric Method for Jacobian Matrix

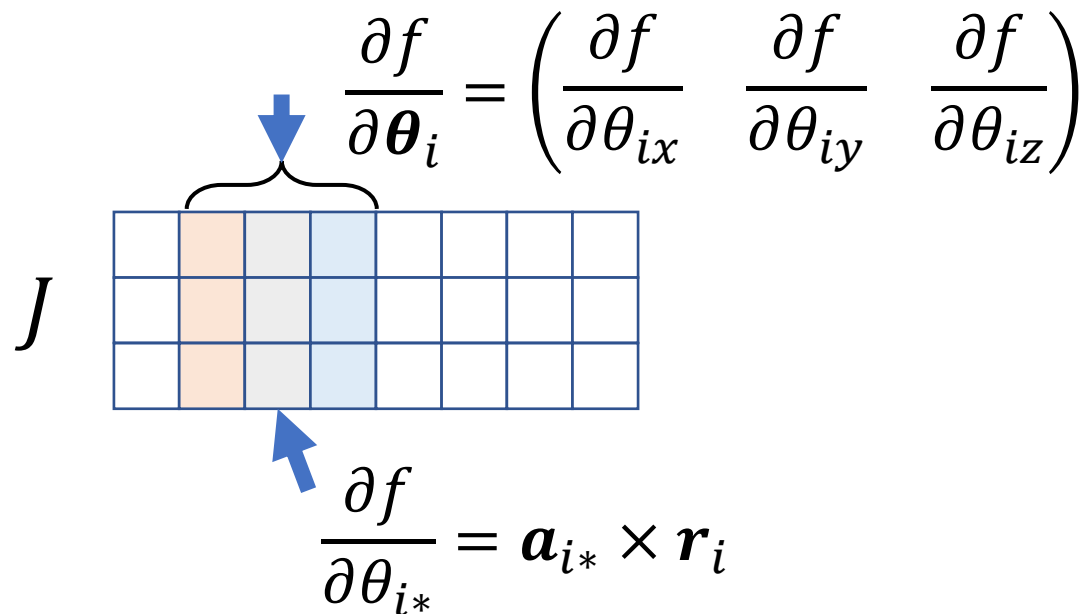
How to deal with ball joints?



If a ball joint is parameterized as Euler angles:

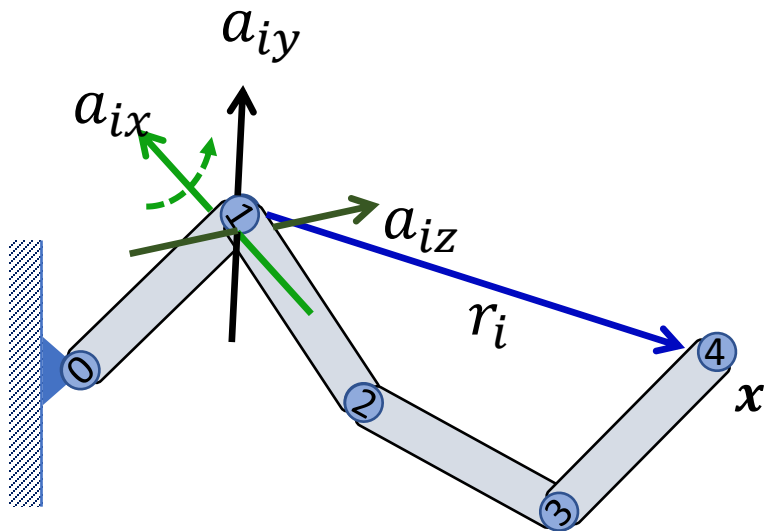
$$R_i = R_{ix}R_{iy}R_{iz}$$

Then it can be considered as a compound joint with three hinge joints



Geometric Method for Jacobian Matrix

How to deal with ball joints?



If a ball joint is parameterized as Euler angles:

$$R_i = R_{ix}R_{iy}R_{iz}$$

Then it can be considered as a compound joint with three hinge joints

Note: rotation axes are

$$\mathbf{a}_{ix} = Q_{i-1} \mathbf{e}_x$$

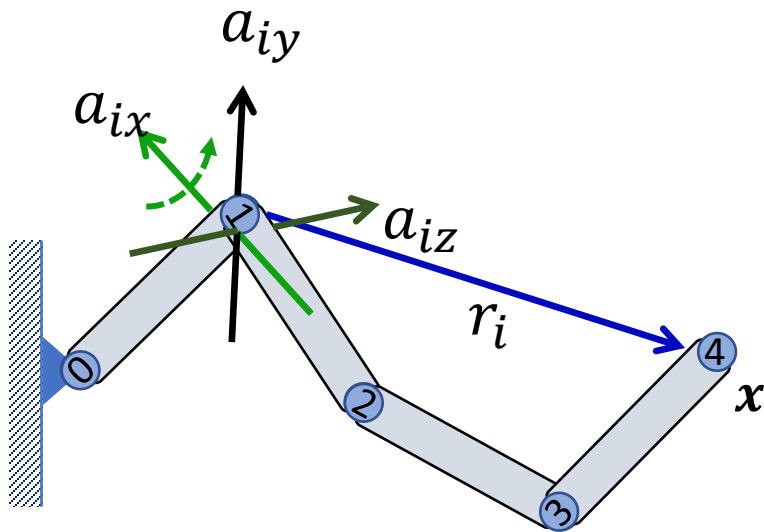
$$\mathbf{a}_{iy} = Q_{i-1} R_{ix} \mathbf{e}_y$$

$$\mathbf{a}_{iz} = Q_{i-1} R_{ix} R_{iy} \mathbf{e}_z$$

$$\frac{\partial f}{\partial \theta_{i*}} = \mathbf{a}_{i*} \times \mathbf{r}_i$$

Geometric Method for Jacobian Matrix

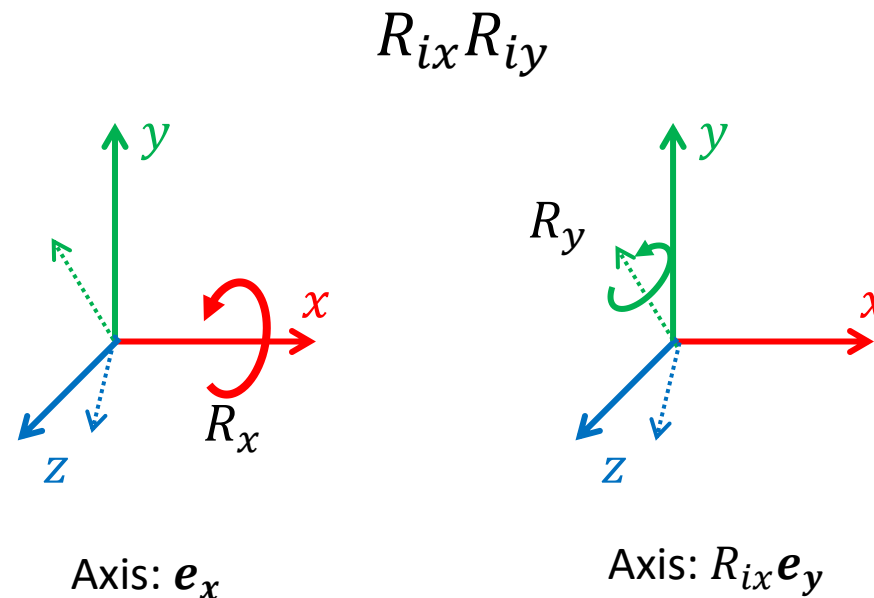
How to deal with ball joints?



If a ball joint is parameterized as Euler angles:

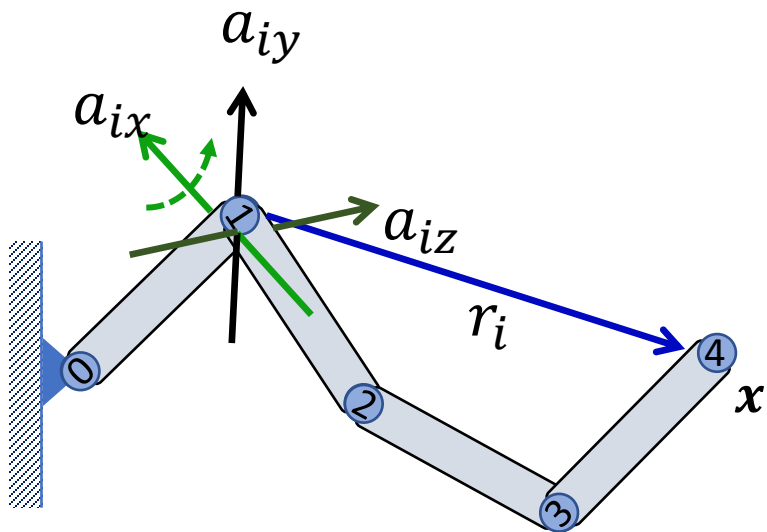
$$R_i = R_{ix}R_{iy}R_{iz}$$

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Geometric Method for Jacobian Matrix

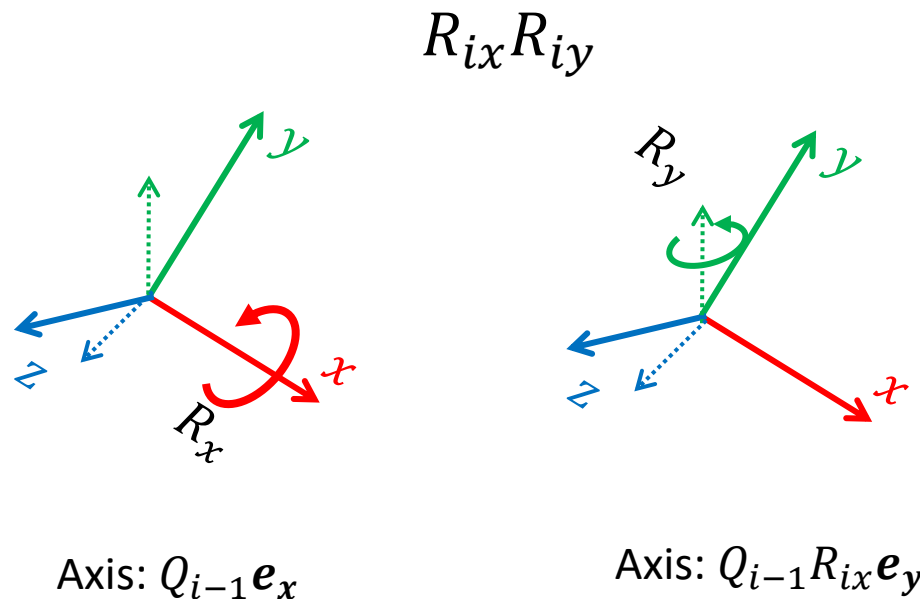
How to deal with ball joints?



If a ball joint is parameterized as Euler angles:

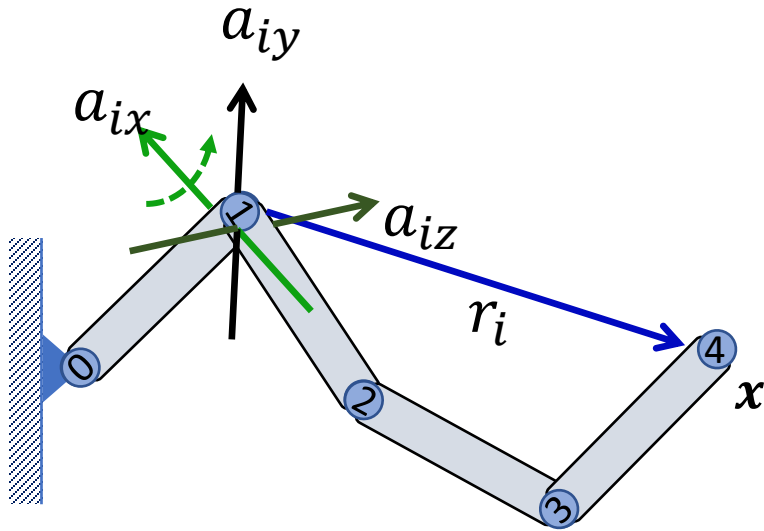
$$R_i = R_{ix}R_{iy}R_{iz}$$

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Geometric Method for Jacobian Matrix

How to deal with ball joints?



If a ball joint is parameterized as Euler angles:

$$R_i = R_{ix}R_{iy}R_{iz}$$

Then it can be considered as a compound joint with three hinge joints

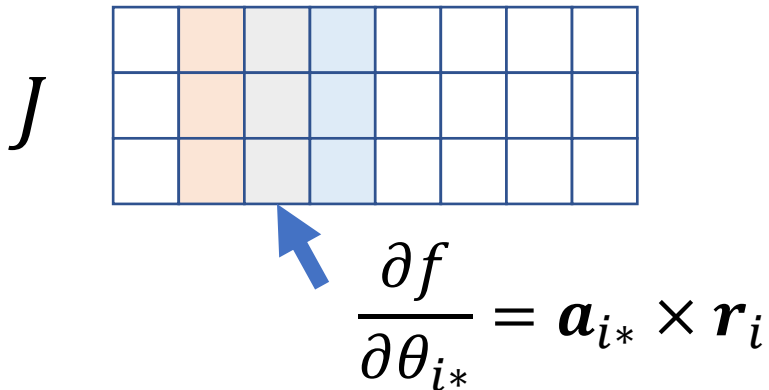
Note: rotation axes are

$$\mathbf{a}_{ix} = Q_{i-1} \mathbf{e}_x$$

$$\mathbf{a}_{iy} = Q_{i-1} R_{ix} \mathbf{e}_y$$

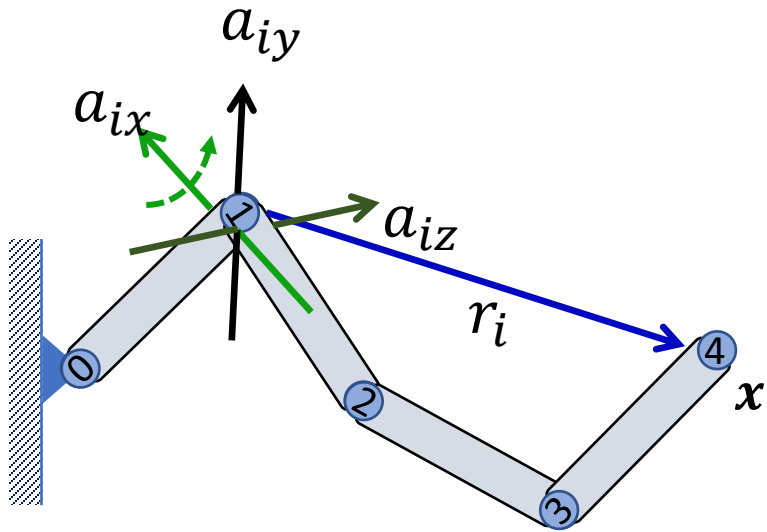
$$\mathbf{a}_{iz} = Q_{i-1} R_{ix} R_{iy} \mathbf{e}_z$$

$$\frac{\partial f}{\partial \theta_{i^*}} = \mathbf{a}_{i^*} \times \mathbf{r}_i$$



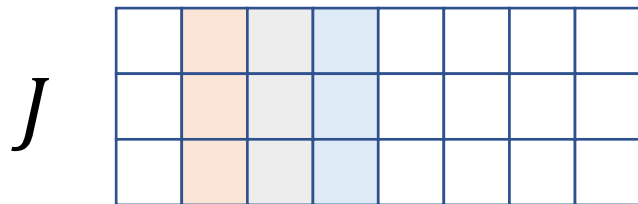
Geometric Method for Jacobian Matrix

How to deal with ball joints?



Can we parameterize a ball joint using axis-angle $\theta \mathbf{u}$ and compute Jacobian as

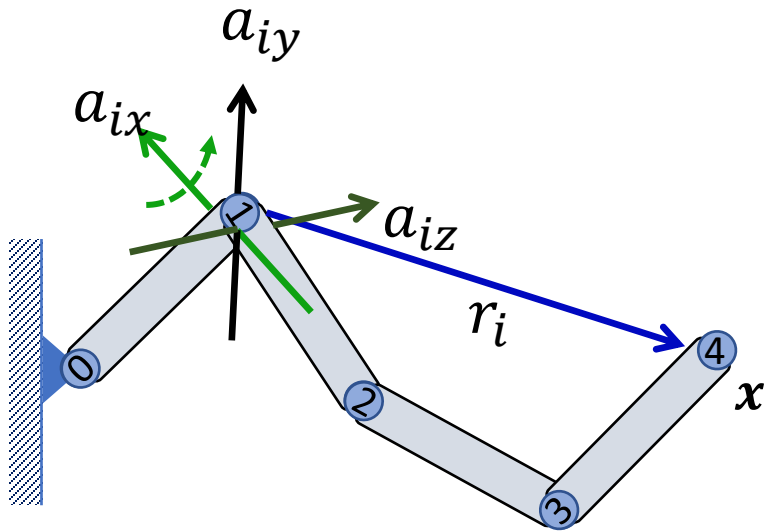
$$\frac{\partial f}{\partial \theta_i} = \theta \mathbf{u} \times \mathbf{r}_i \quad ???$$



$$\frac{\partial f}{\partial \theta_{i^*}} = \mathbf{a}_{i^*} \times \mathbf{r}_i$$

Geometric Method for Jacobian Matrix

How to deal with ball joints?

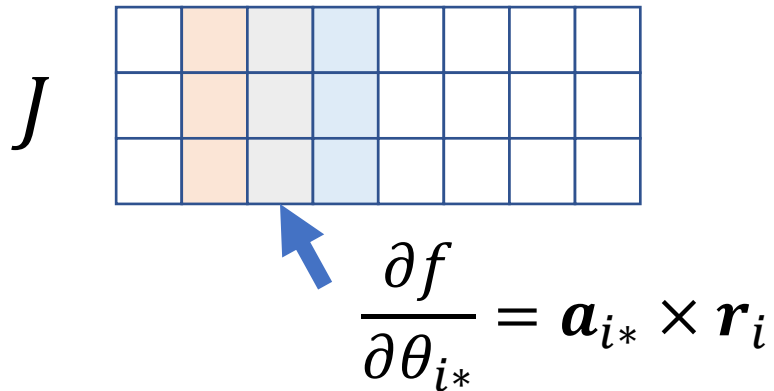


Can we parameterize a ball joint using axis-angle $\theta \mathbf{u}$ and compute Jacobian as

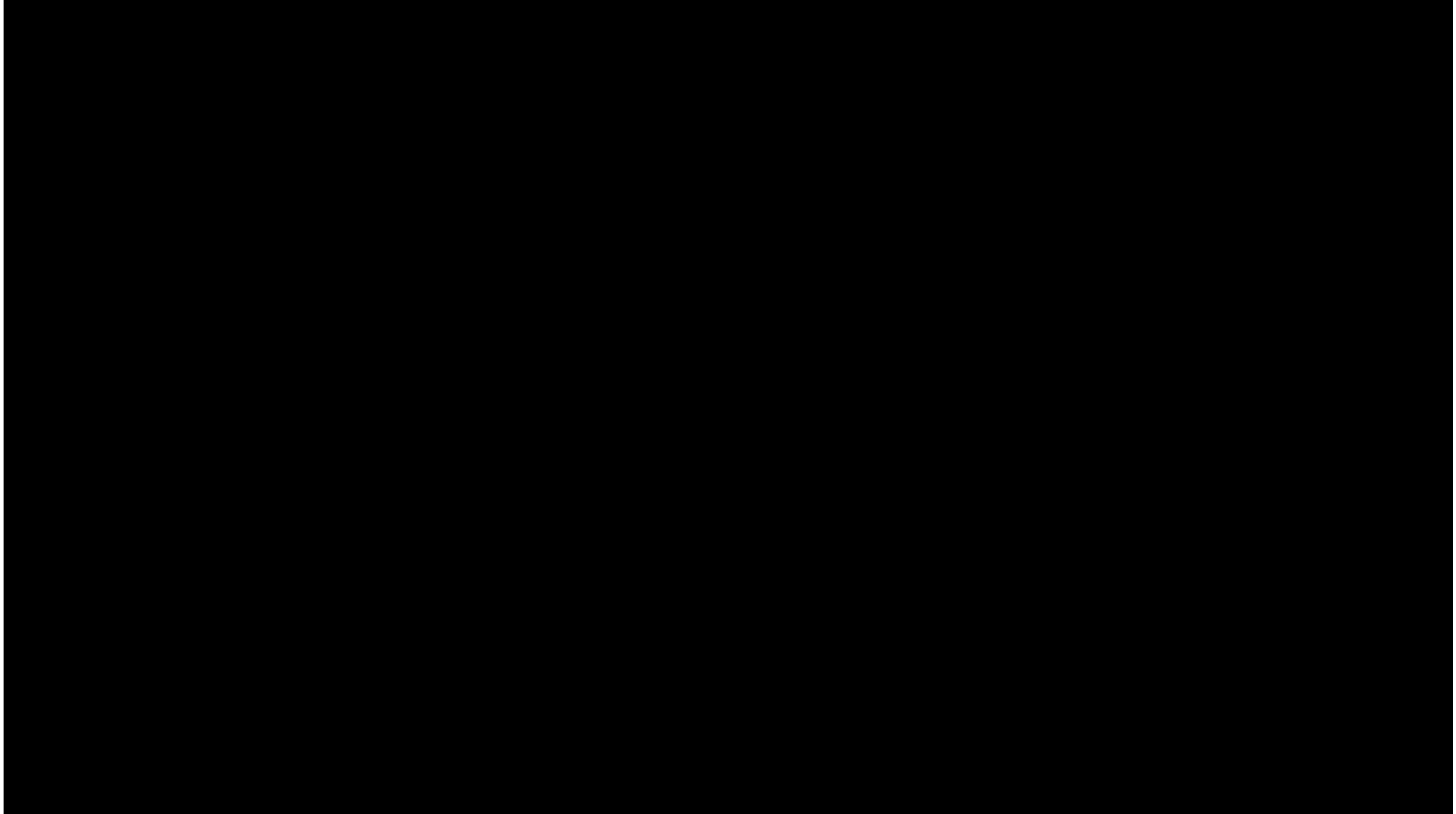
$$\frac{\partial f}{\partial \theta_i} = \theta \mathbf{u} \times \mathbf{r}_i \quad ???$$

NO!

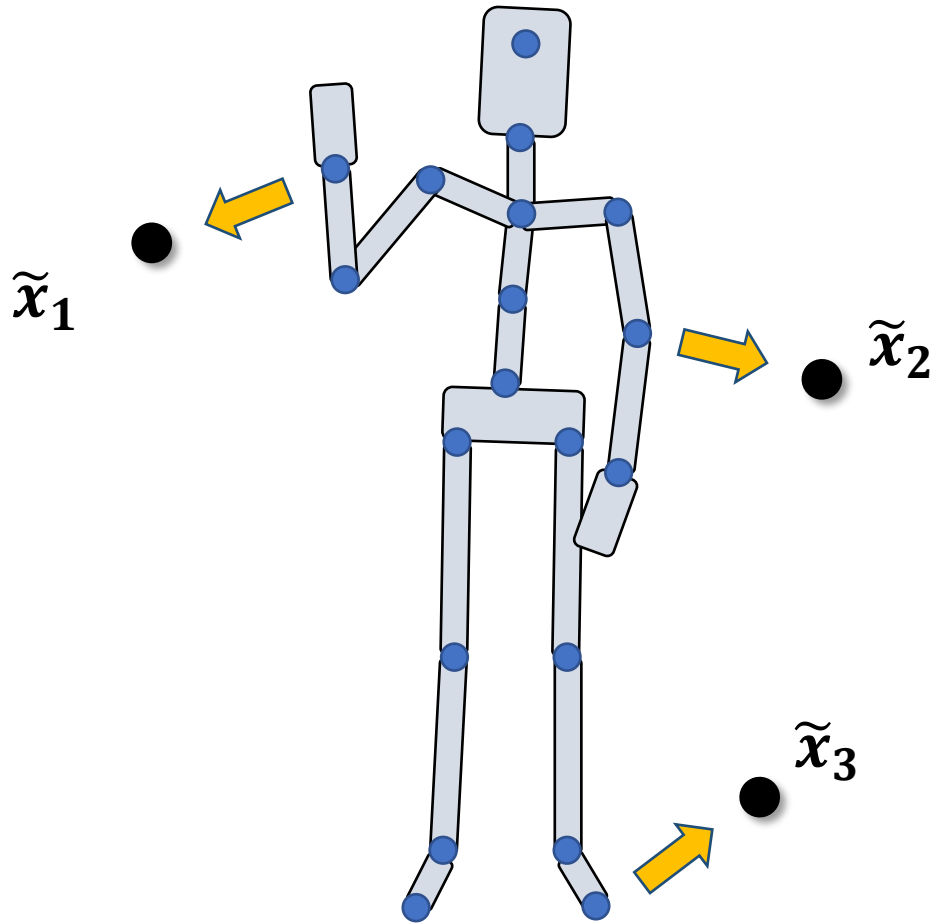
Jacobian for axis-angle representation has a rather complicated formulation...



Recap: Character IK



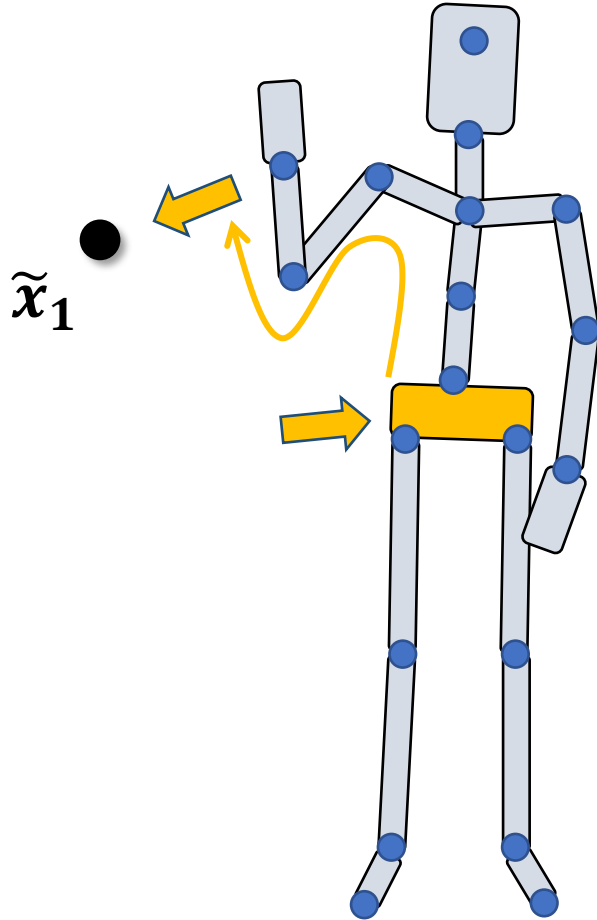
Character IK



$$F(\theta) = \frac{1}{2} \sum_i \|f_i(\theta) - \tilde{x}_i\|_2^2 + \frac{\lambda}{2} \|\theta\|_2^2$$

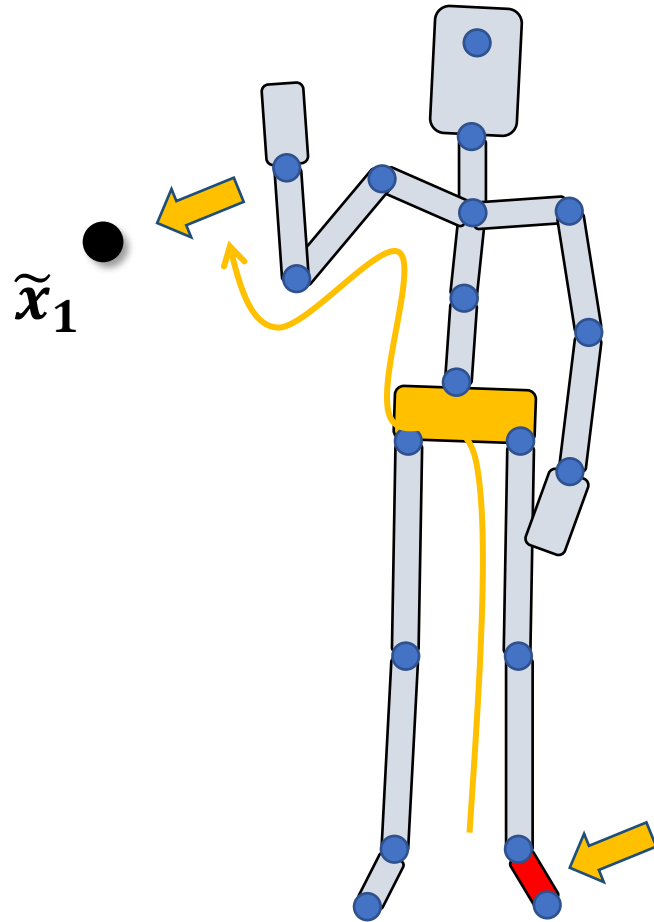
$$\theta = (t_0, R_0, R_1, R_2, \dots)$$

Full-body IK



A simple kinematic chain:
IK is directly applicable

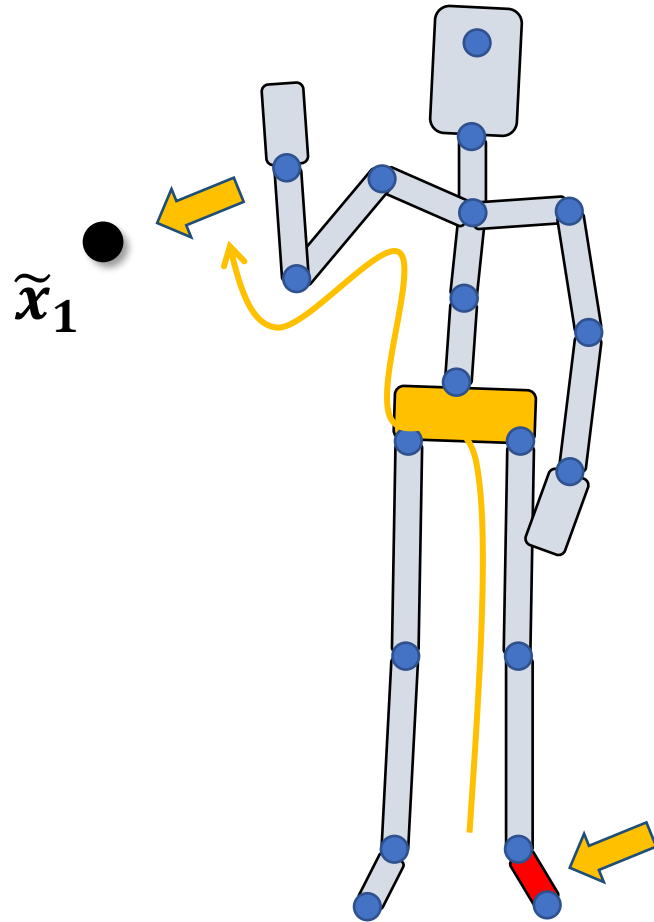
Full-body IK



$(t_0, R_0, R_1, R_2, \dots \dots)$
root | internal joints

The kinematic chain passes the root joint...

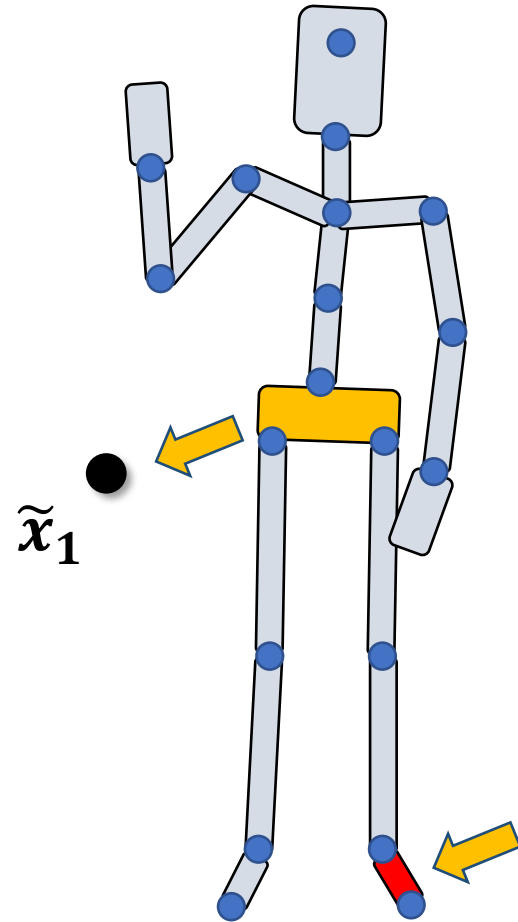
Full-body IK



The kinematic chain passes the root joint...

- Apply IK to the chain
- Set root transformation based on the FK along the chain
- Revert joint rotations between the foot and the root

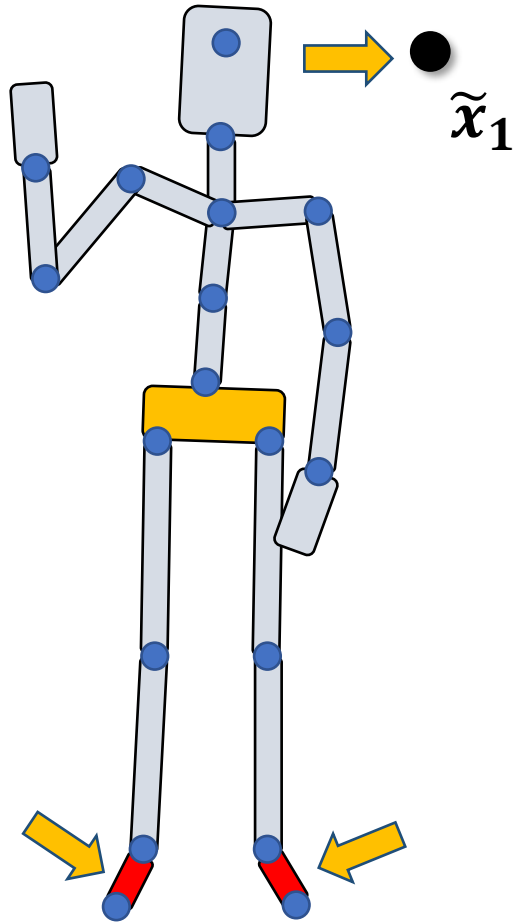
Full-body IK



The kinematic chain passes the root joint...

- Apply IK to the chain
- Set root transformation based on the FK along the chain
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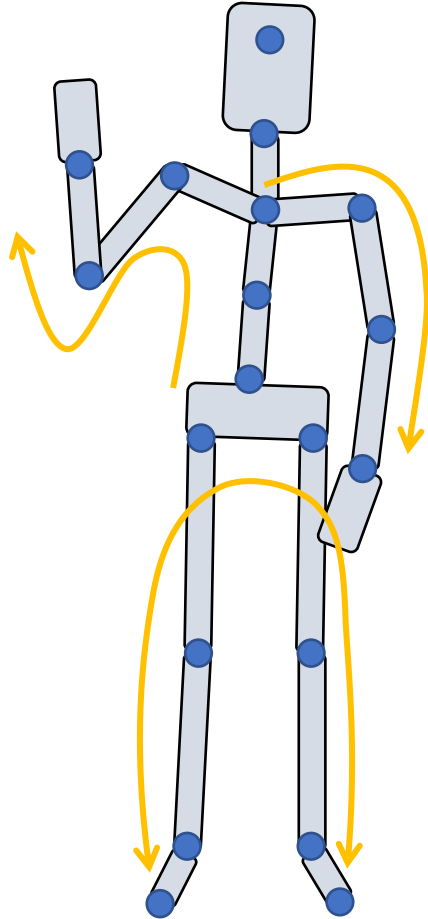
Full-body IK



Two constraints....

- Formulate optimization problems
- Consider one constraint each time, then fix the broken one

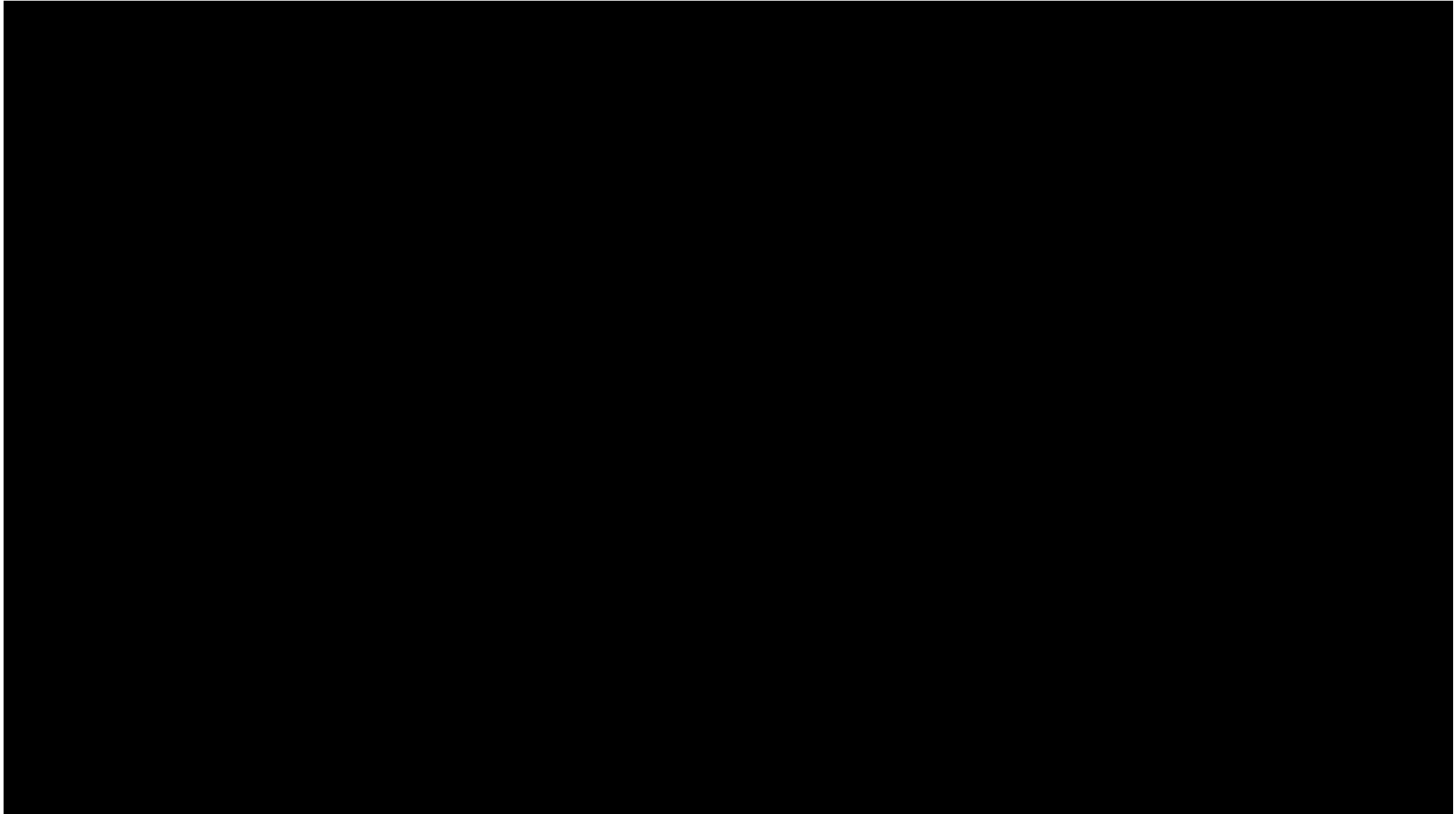
Character Rig



Created Multiple IK chains

User activates several IK chains each time, the joints controlled by the other IK chains can move freely

Recap: Character IK



Questions?



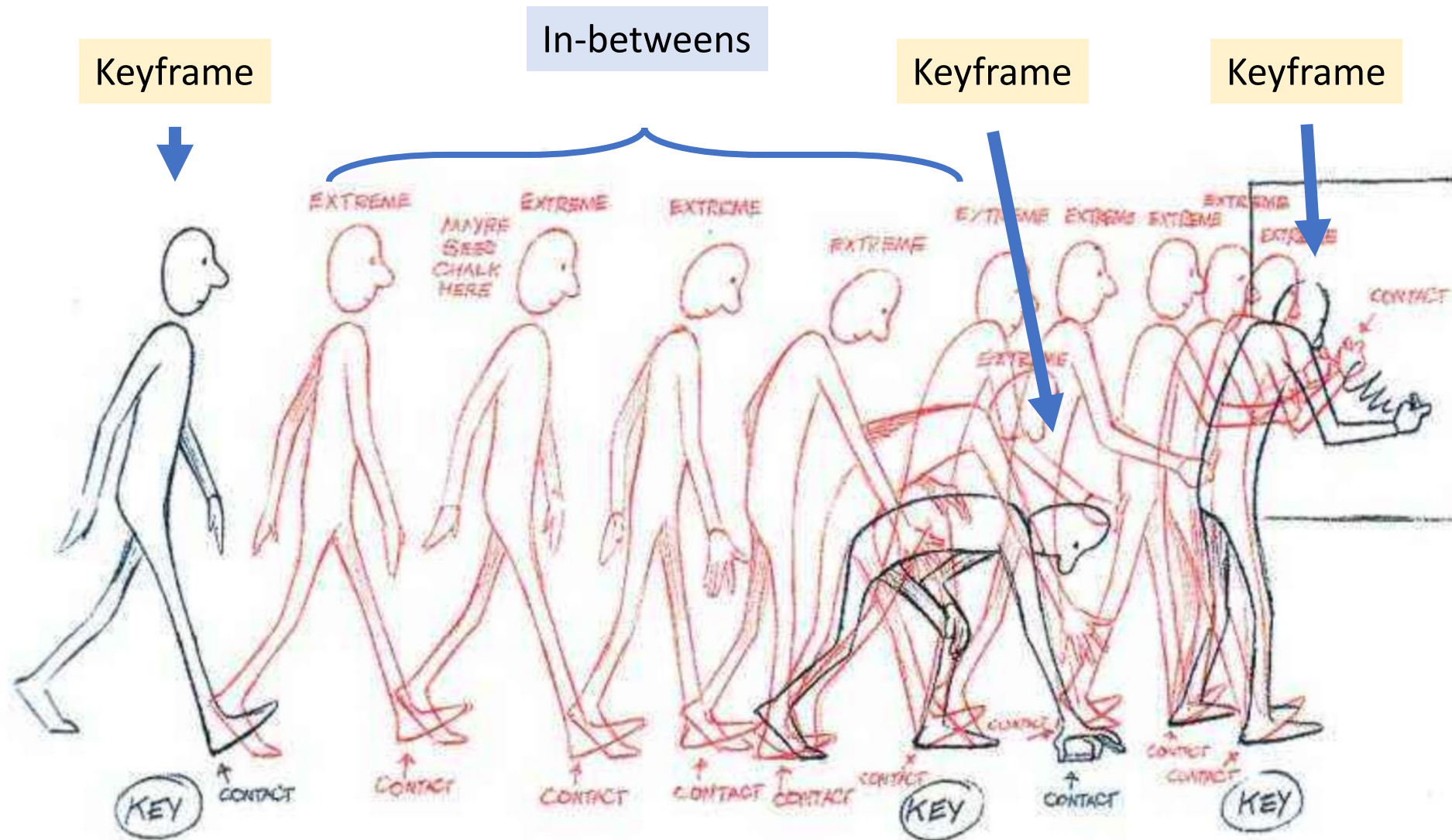


Keyframe Animation and Interpolation

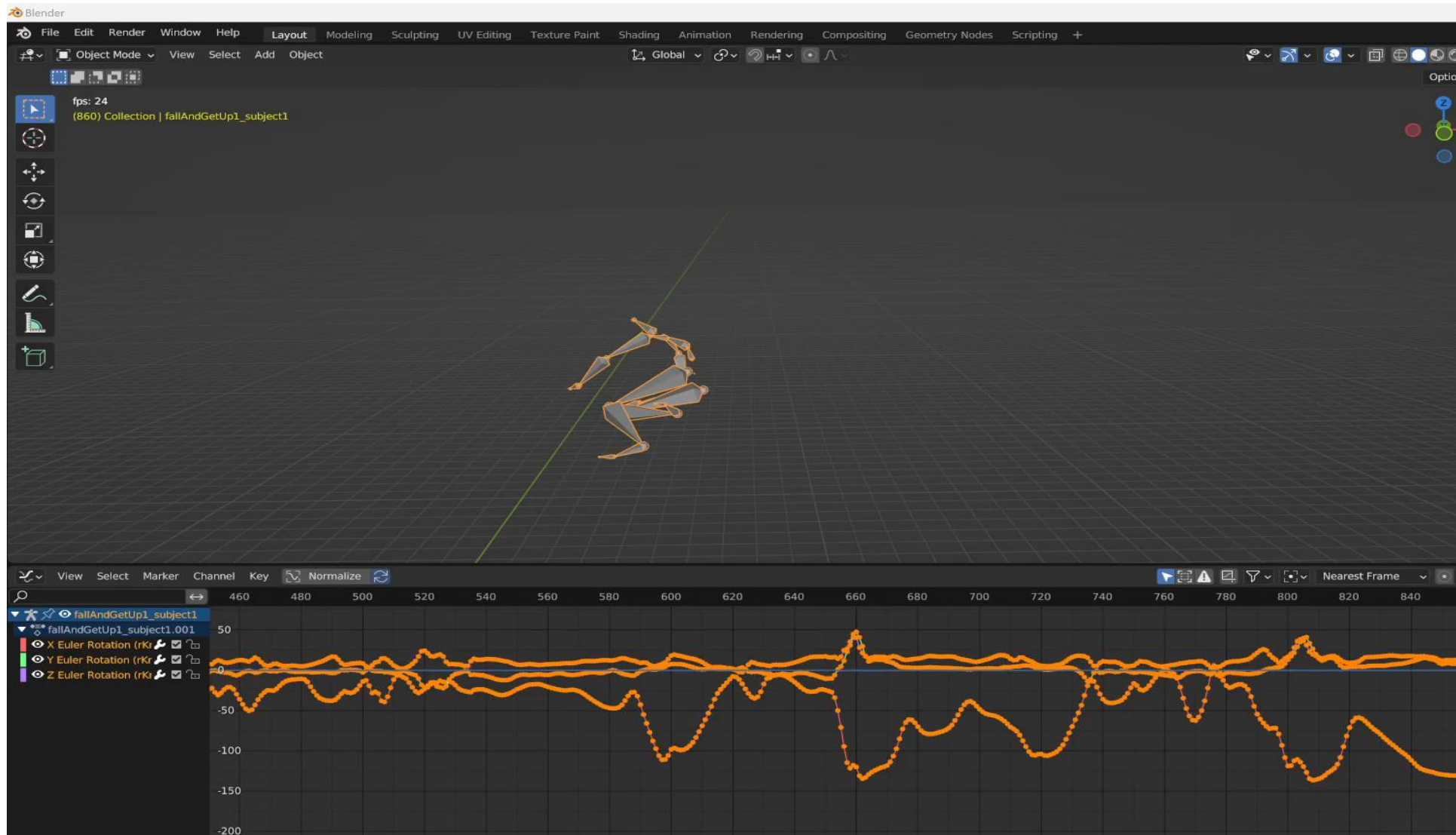
Origin of Animation: Zoetrope



Keyframe Animation



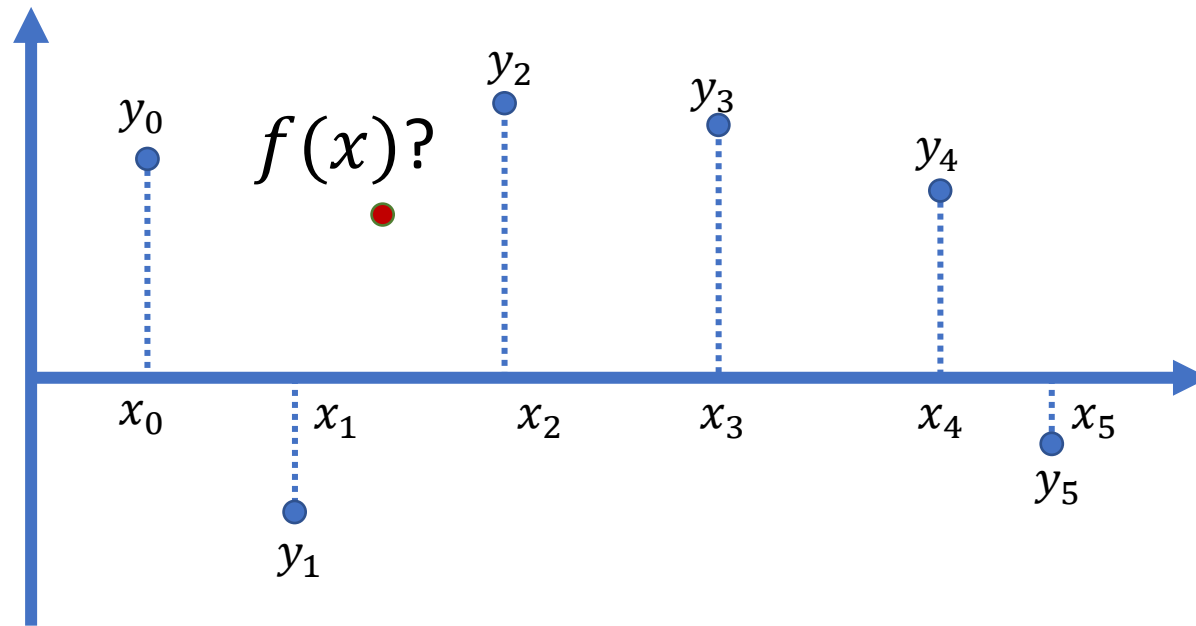
Interpolation Between Keyframes



Interpolation

- Given a set of data pairs $D = \{(x_i, y_i) | i = 0, \dots, N\}$, find a function $f(x)$ such that

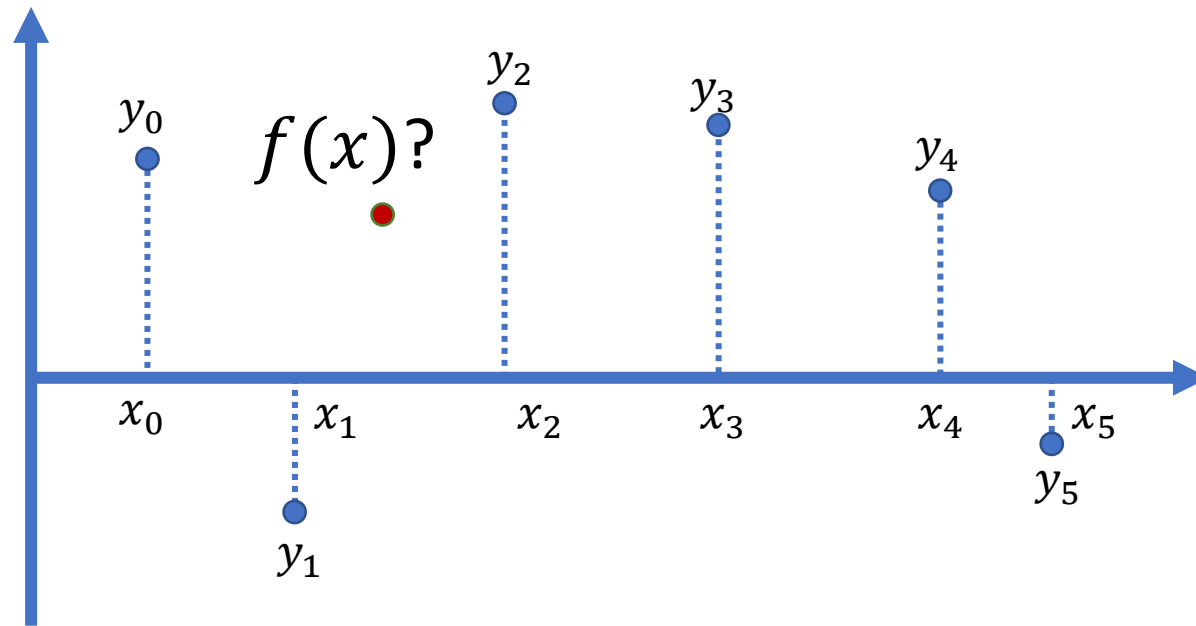
$$f(x_i) = y_i, \forall (x_i, y_i) \in D$$



Interpolation

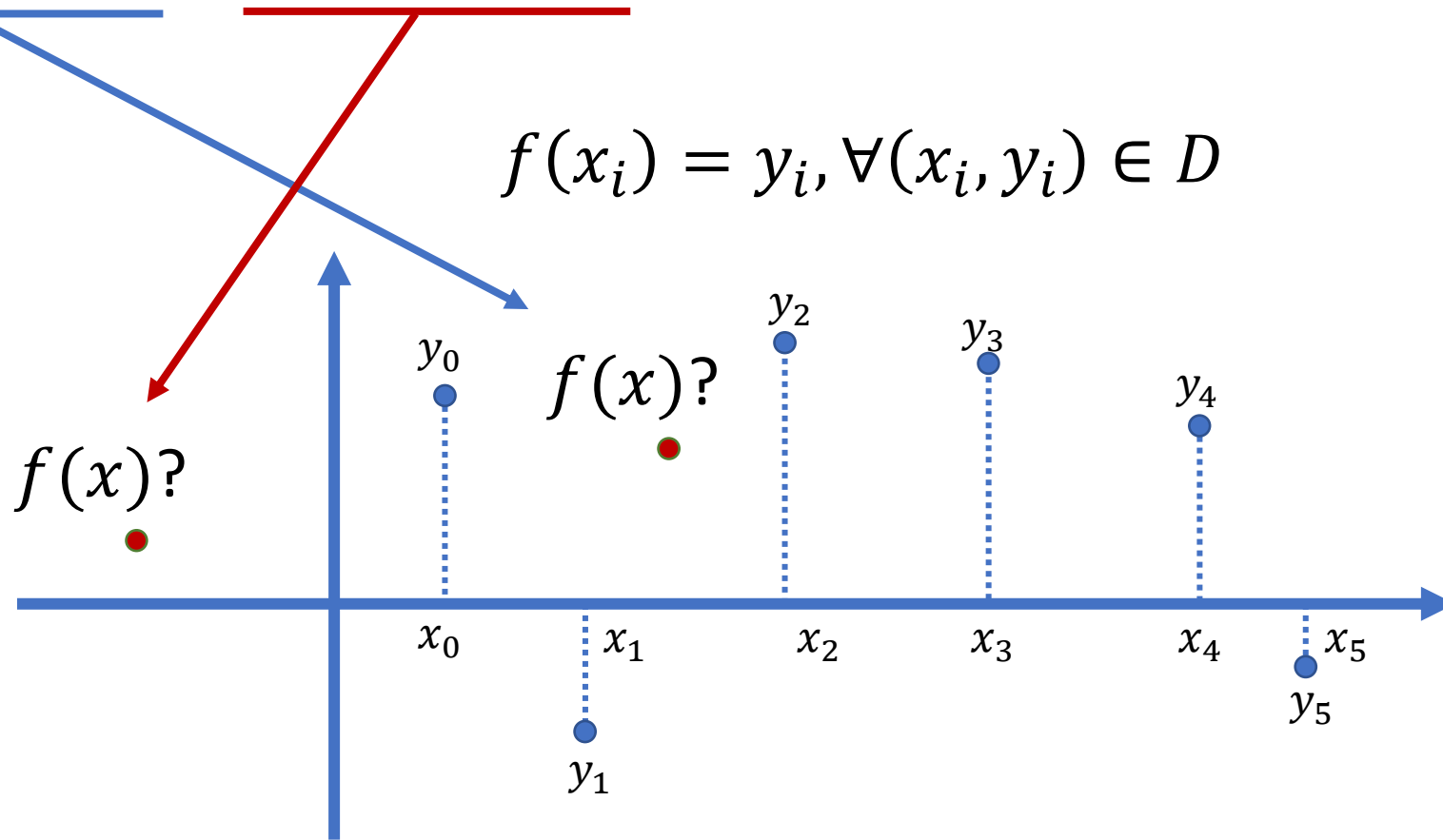
- Given a set of data pairs $D = \{(x_i, y_i) | i = 0, \dots, N\}$, find a function $f(x)$ such that

$$f(x_i) = y_i, \forall (x_i, y_i) \in D$$



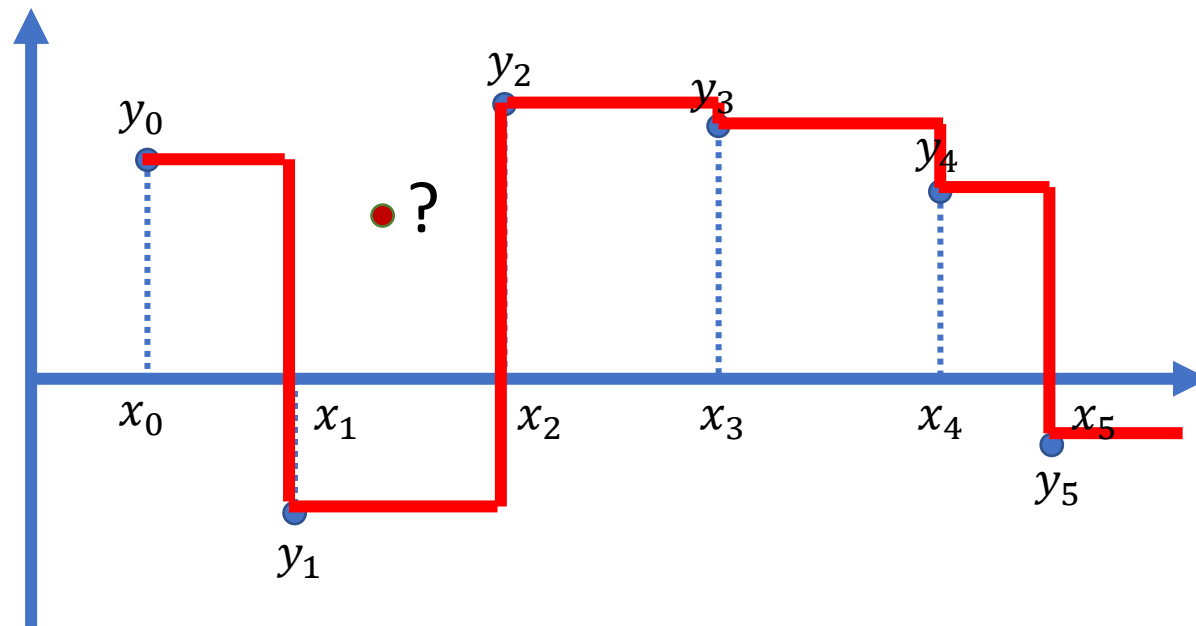
Interpolation

- Interpolation / Extrapolation



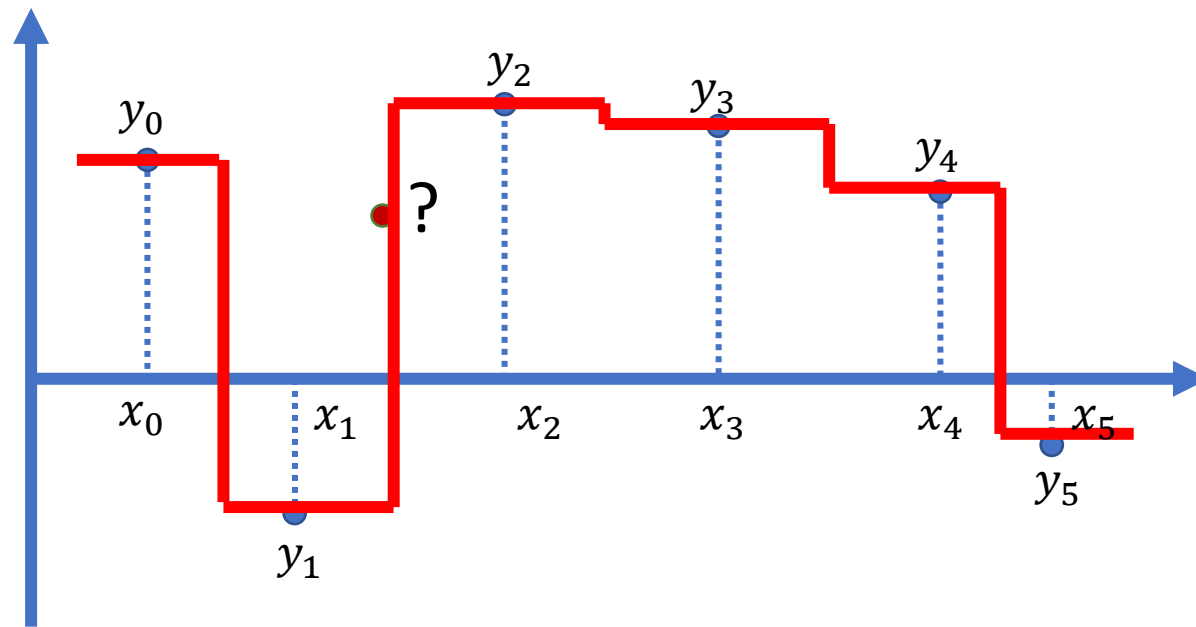
Stepped Interpolation

$$f(x) = y_1$$



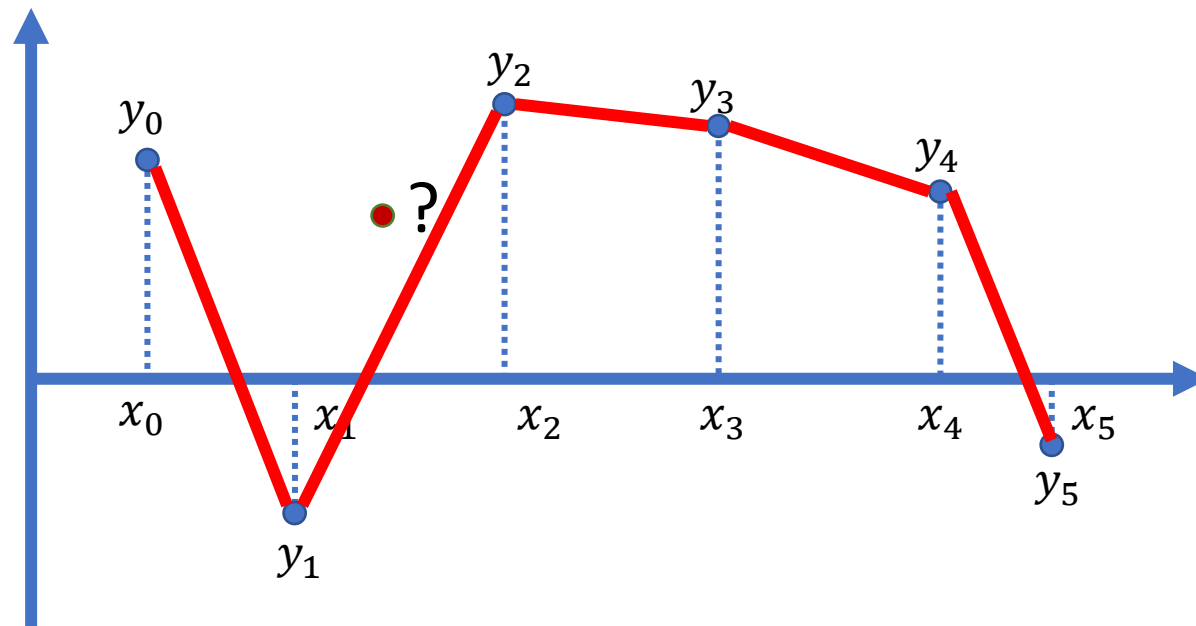
Stepped Interpolation

$$f(x) = y_1$$



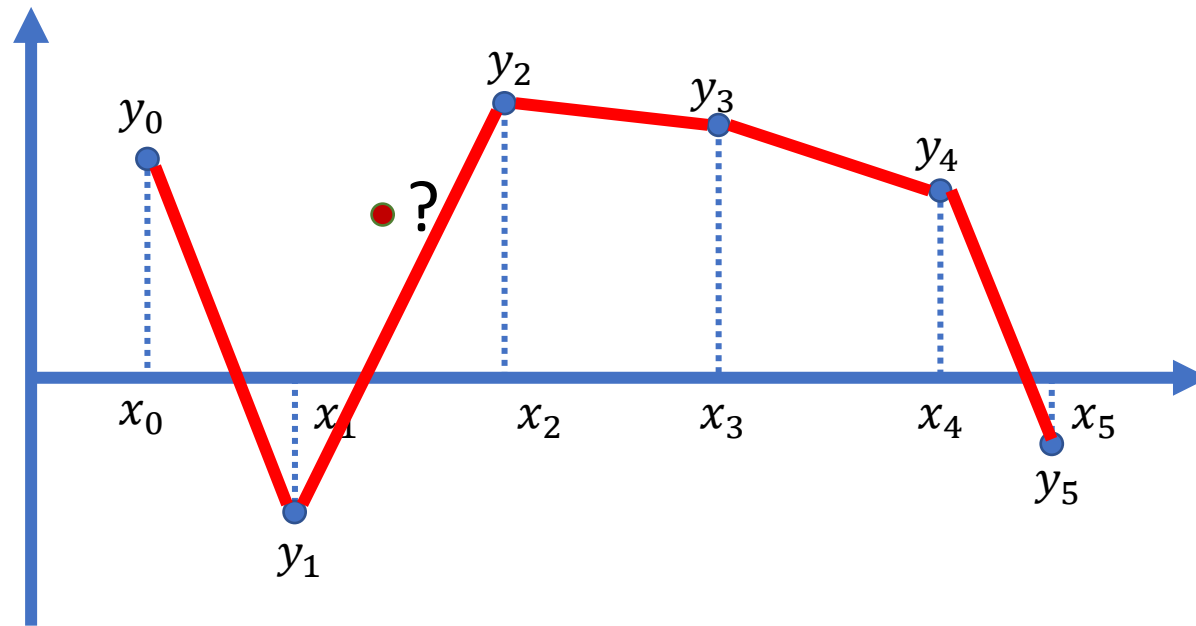
Linear Interpolation

$$f(x) = y_1 + \frac{y_2 - y_1}{x_2 - x_1} (x - x_1)$$



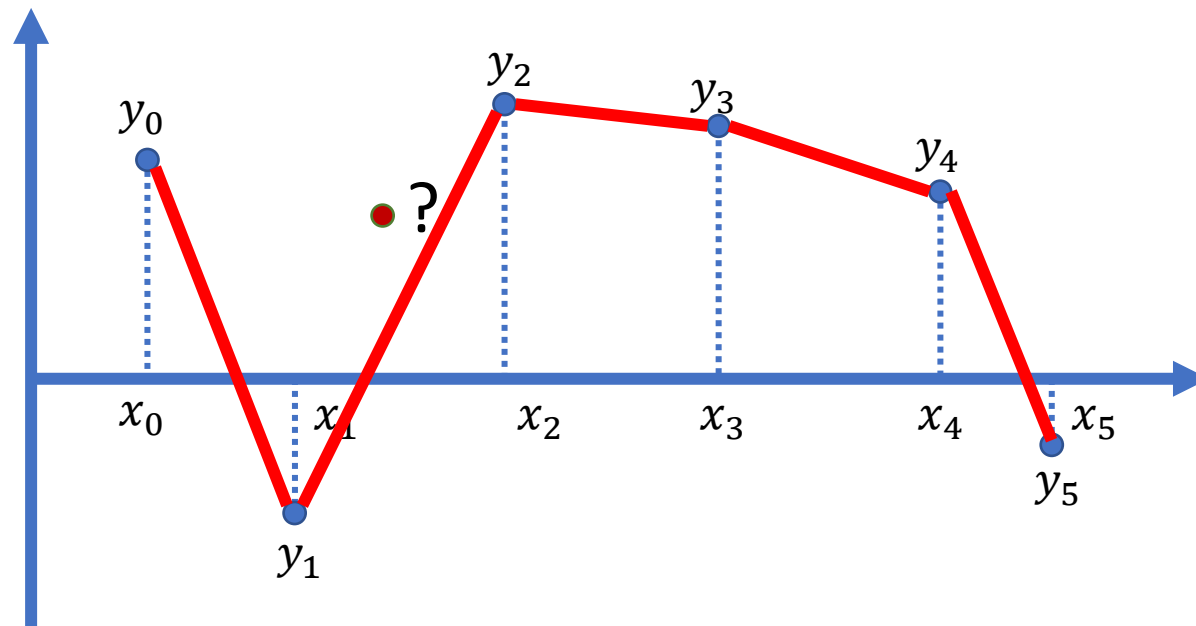
Linear Interpolation

$$f(x) = y_1 + \frac{x - x_1}{x_2 - x_1} (y_2 - y_1)$$



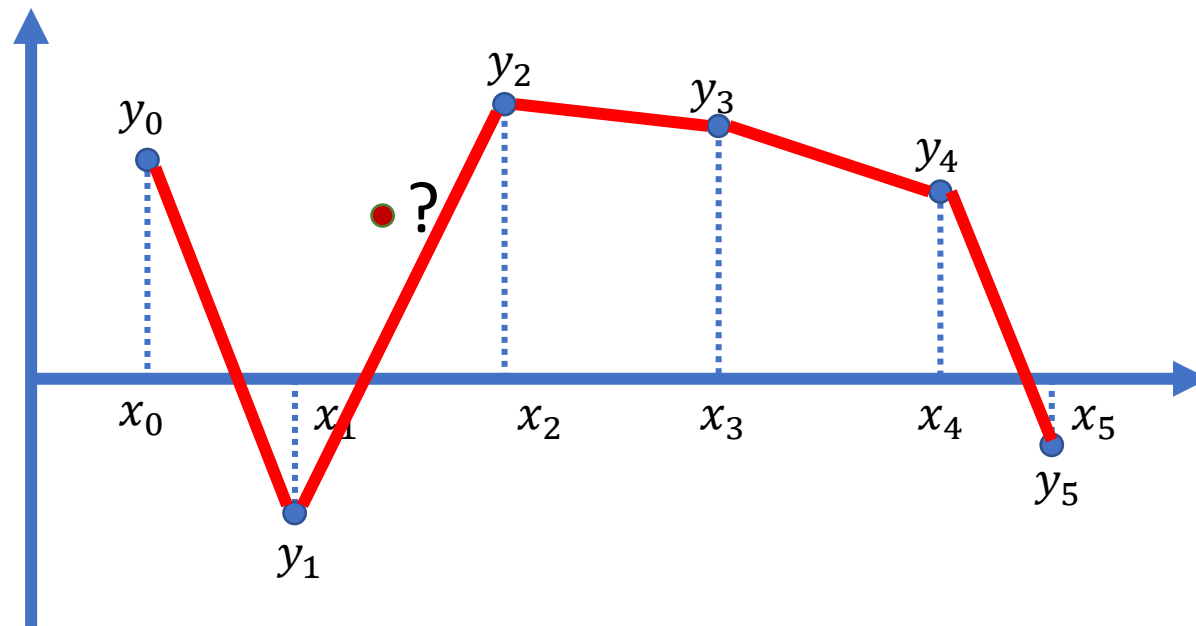
Linear Interpolation

$$f(x) = y_1 + t(y_2 - y_1)$$

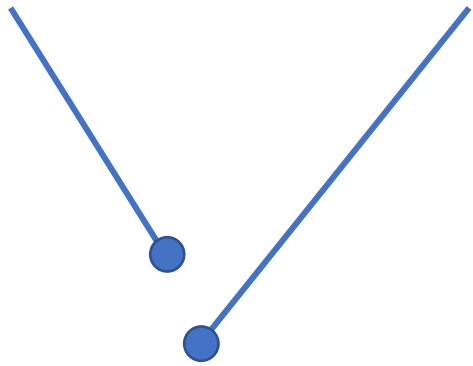


Linear Interpolation

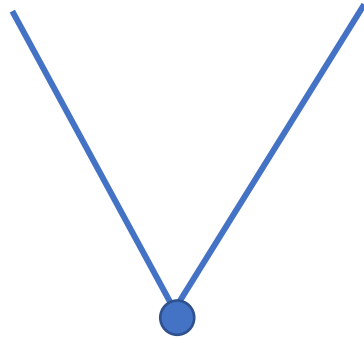
$$f(x) = (1 - t)y_1 + ty_2$$



Smoothness



Discontinuity



C^0 -continuity

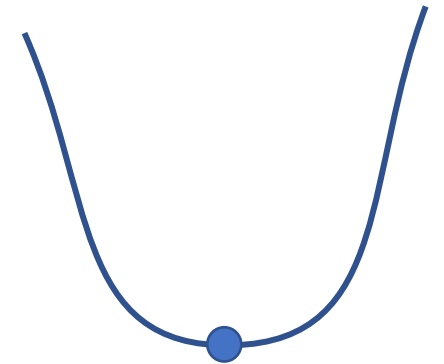
positions coincide



C^1 -continuity

positions coincide

velocity coincide



C^2 -continuity

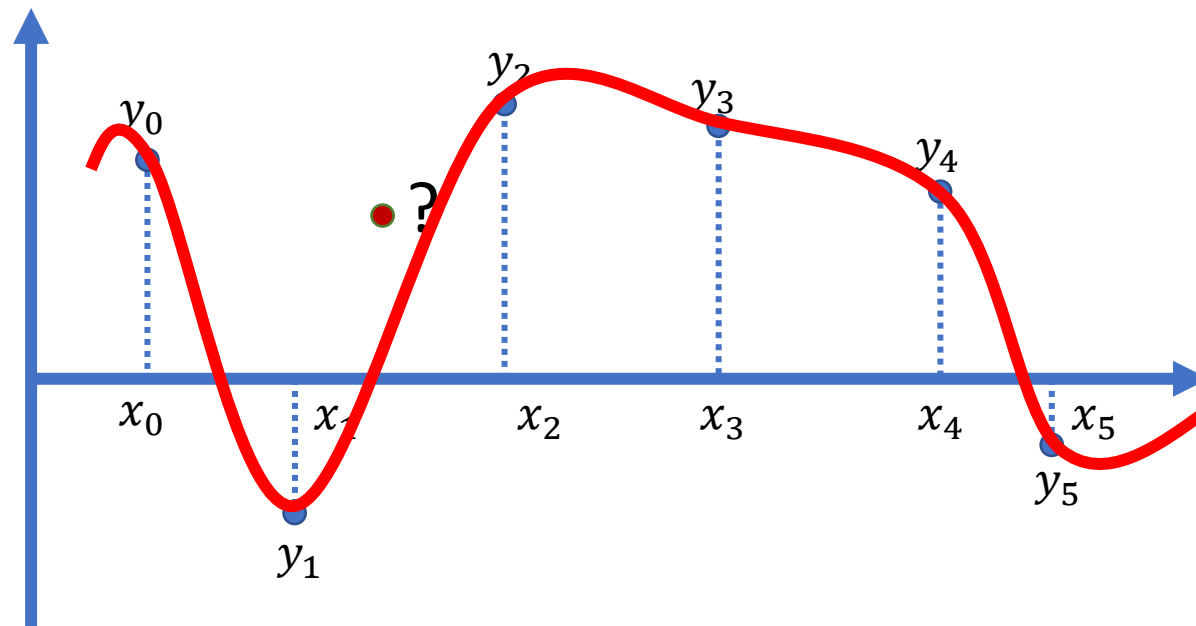
positions coincide

velocity coincide

acceleration coincide

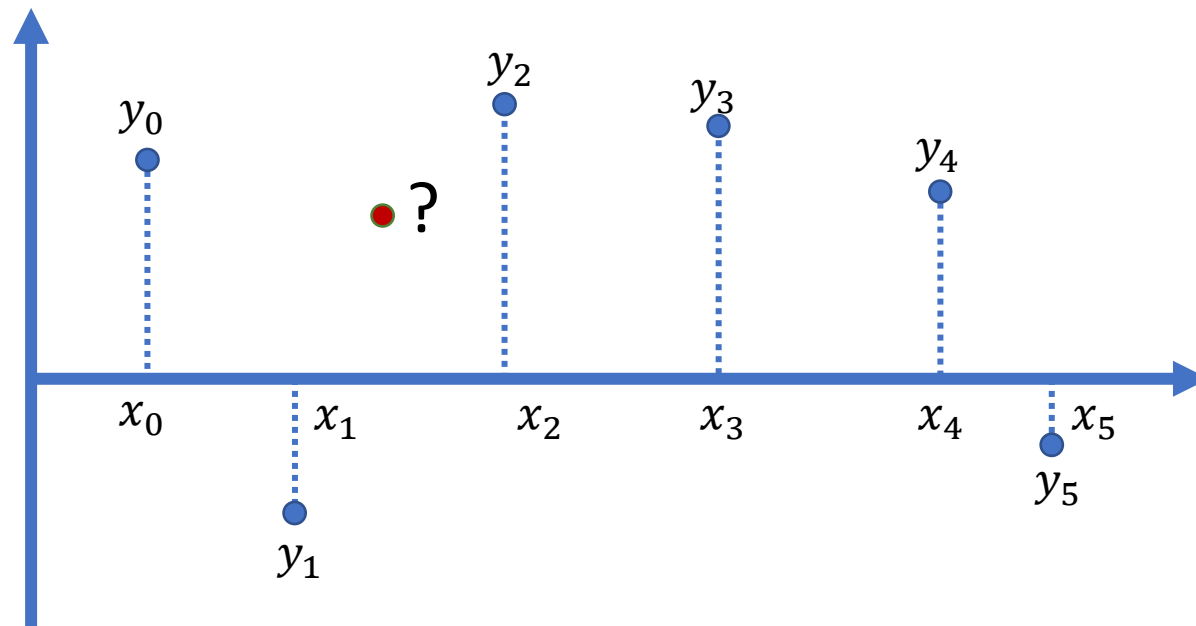
Nonlinear Interpolation?

$$f(x) = ?$$



Polynomial Interpolation

$$f(x) = a_0 + a_1x + a_2x^2 + \cdots + a_nx^n$$



Polynomial Interpolation

$$f(x) = a_0 + a_1x + a_2x^2 + \cdots + a_nx^n$$

For any data point in $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$f(x_0) = a_0 + a_1x_0 + a_2x_0^2 + \cdots + a_nx_0^n = y_0$$

Polynomial Interpolation

$$f(x) = a_0 + a_1x + a_2x^2 + \cdots + a_nx^n$$

For any data point in $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$f(x_0) = a_0 + a_1x_0 + a_2x_0^2 + \cdots + a_nx_0^n = y_0$$

$$f(x_1) = a_0 + a_1x_1 + a_2x_1^2 + \cdots + a_nx_1^n = y_1$$

$$f(x_2) = a_0 + a_1x_2 + a_2x_2^2 + \cdots + a_nx_2^n = y_2$$

... ..

$$f(x_N) = a_0 + a_1x_N + a_2x_N^2 + \cdots + a_nx_N^n = y_N$$

Polynomial Interpolation

$$f(x) = a_0 + a_1x + a_2x^2 + \cdots + a_nx^n$$

Data point set $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$\begin{bmatrix} 1 & x_0 & x_0^2 & \cdots & x_0^n \\ 1 & x_1 & x_1^2 & \cdots & x_1^n \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 1 & x_N & x_N^2 & \cdots & x_N^n \end{bmatrix} \begin{bmatrix} a_0 \\ a_1 \\ \vdots \\ a_n \end{bmatrix} = \begin{bmatrix} y_0 \\ y_1 \\ \vdots \\ y_N \end{bmatrix}$$

Polynomial Interpolation

$$f(x) = a_0 + a_1x + a_2x^2 + \cdots + a_nx^n$$

Data point set $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$\begin{bmatrix} a_0 \\ a_1 \\ \vdots \\ a_n \end{bmatrix} = \begin{bmatrix} 1 & x_0 & x_0^2 & \cdots & x_0^n \\ 1 & x_1 & x_1^2 & \cdots & x_1^n \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 1 & x_N & x_N^2 & \cdots & x_N^n \end{bmatrix}^{-1} \begin{bmatrix} y_0 \\ y_1 \\ \vdots \\ y_N \end{bmatrix}$$

Polynomial Interpolation

$$f(x) = a_0 + a_1x + a_2x^2 + \cdots + a_nx^n$$

Data point set $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$\begin{bmatrix} a_0 \\ a_1 \\ \vdots \\ a_n \end{bmatrix} = \begin{bmatrix} 1 & x_0 & x_0^2 & \cdots & x_0^n \\ 1 & x_1 & x_1^2 & \cdots & x_1^n \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ 1 & x_N & x_N^2 & \cdots & x_N^n \end{bmatrix}^{-1} \begin{bmatrix} y_0 \\ y_1 \\ \vdots \\ y_N \end{bmatrix}$$

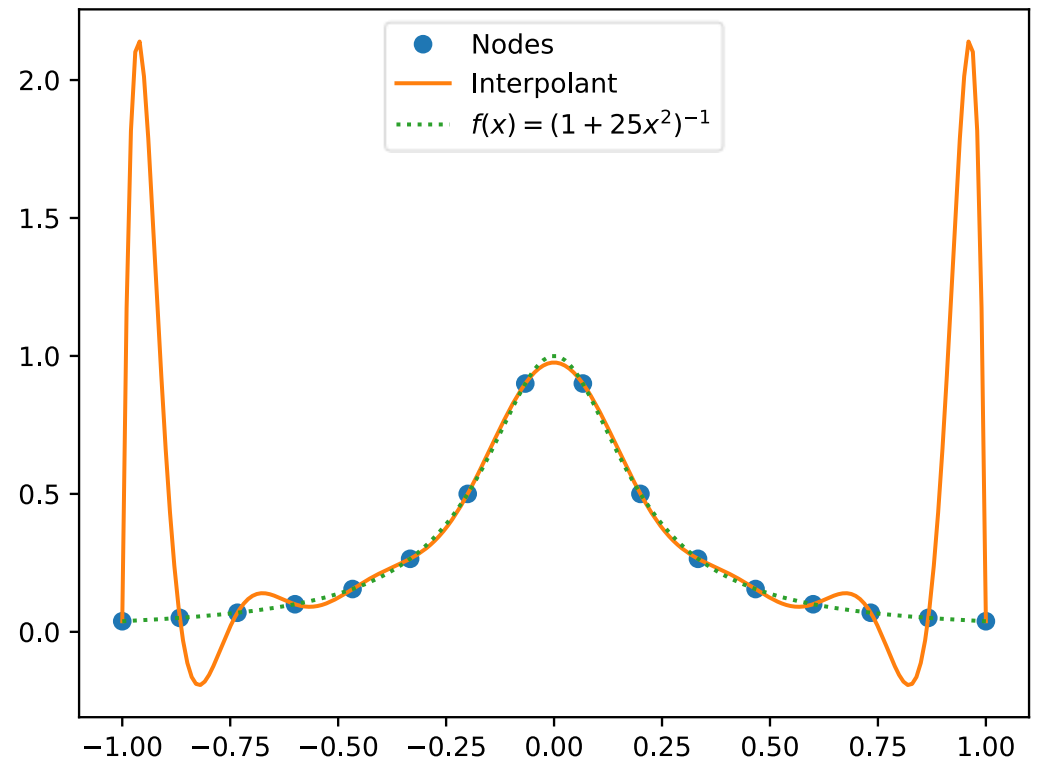
We need $n = (N - 1)$ -degree polynomial to fit N data points!

Polynomial Interpolation

- Runge's phenomenon
 - High-degree polynomial can oscillate at the edges of an interval
- So low-degree polynomials are preferred
 - But how?

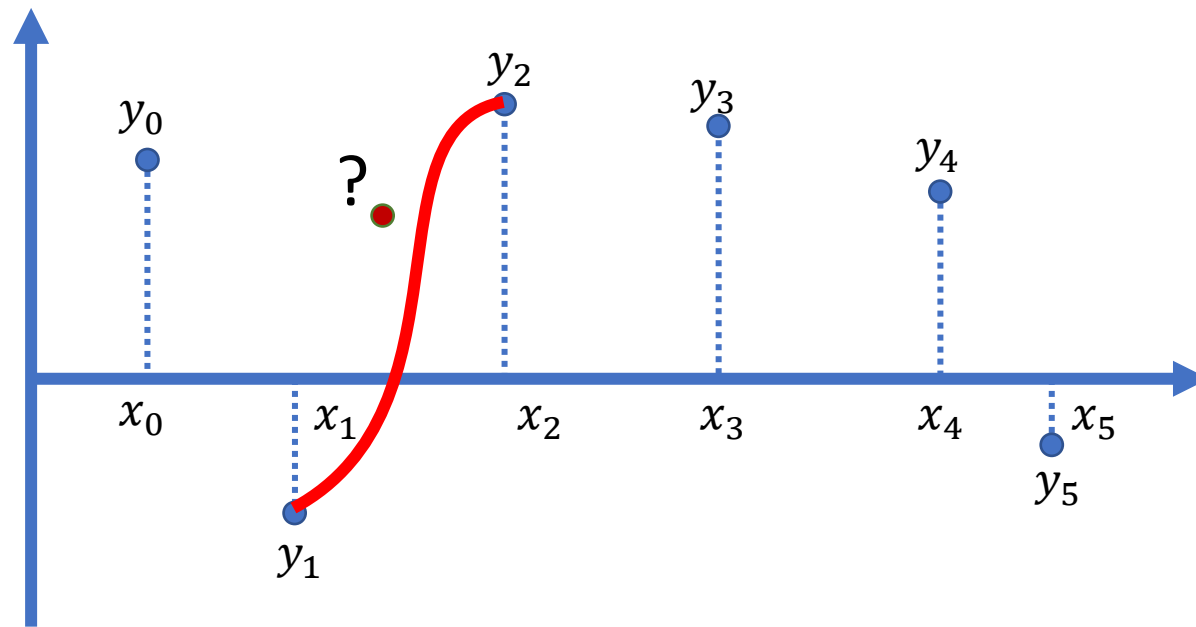
We need $n = (N - 1)$ -degree polynomial to fit N data points!

$$f(x) = a_0 + a_1x + a_2x^2 + \dots + a_{15}x^{15}$$



Spline Interpolation

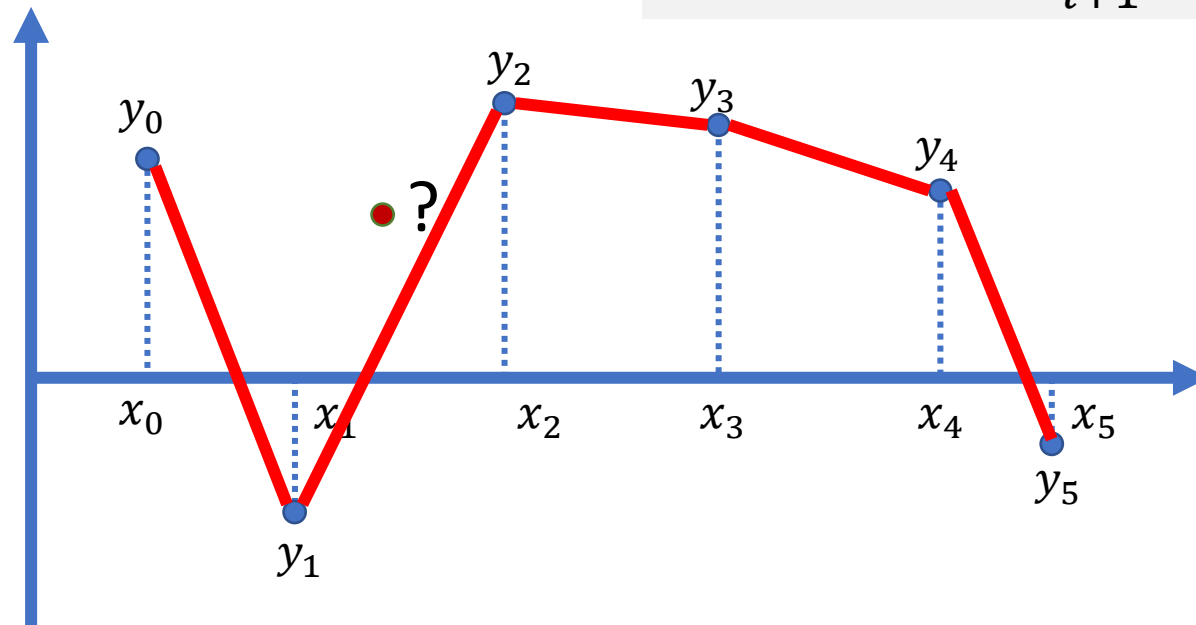
- Interpolation using low-degree piecewise polynomials
 - $f(x) = S_i(x)$, when $x \in [x_i, x_{i+1}]$



Spline Interpolation

- Interpolation using low-degree piecewise polynomials
 - Degree 1 → piecewise linear interpolation

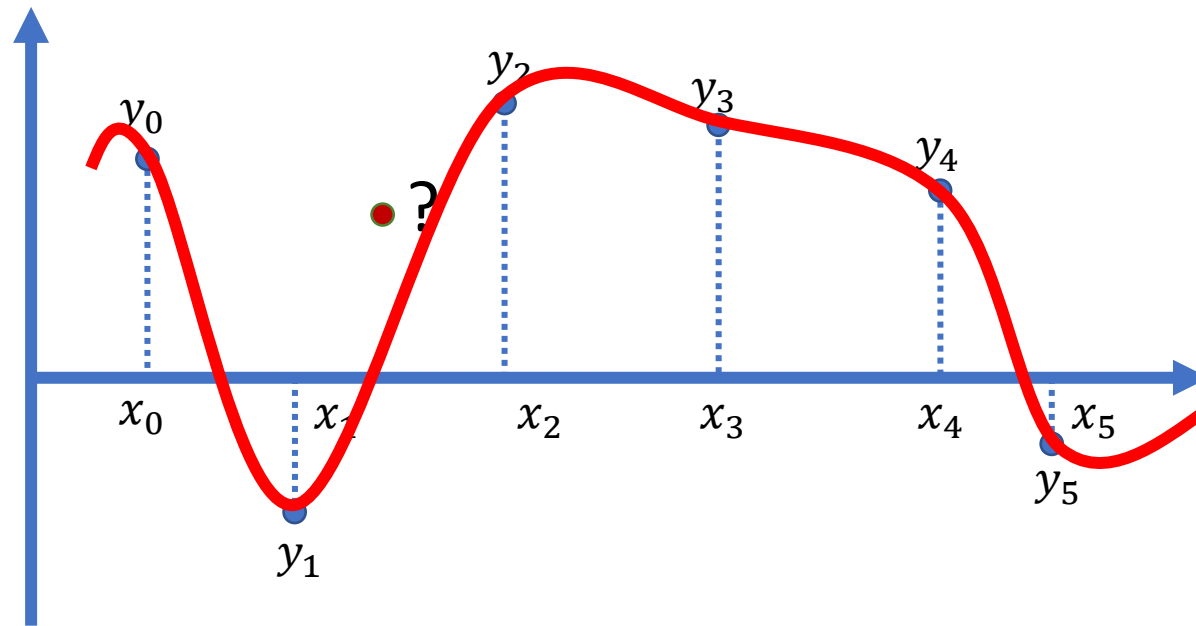
$$S_i(x) = y_i + \frac{y_{i+1} - y_i}{x_{i+1} - x_i} (x - x_i)$$



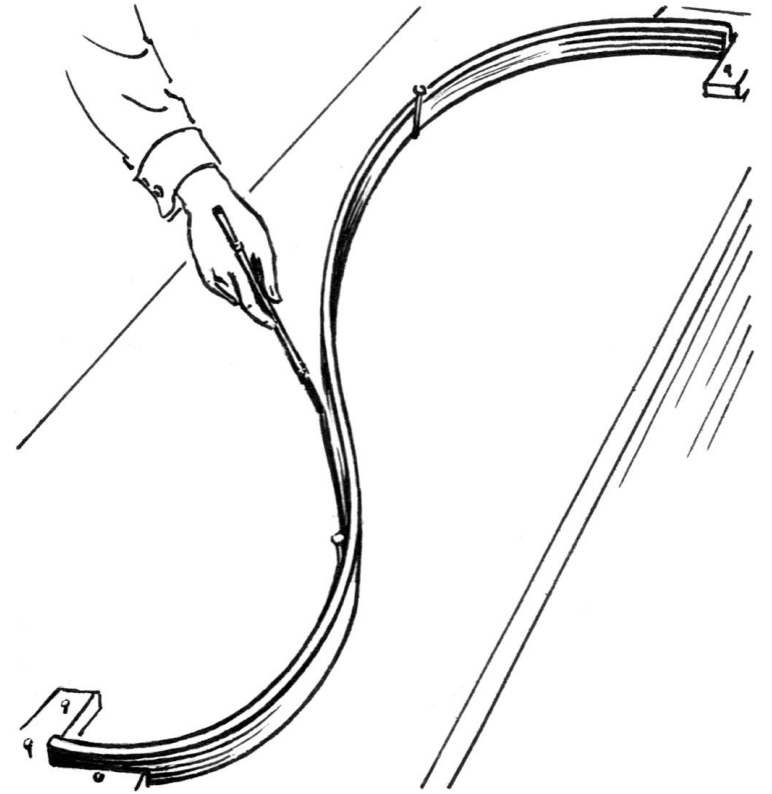
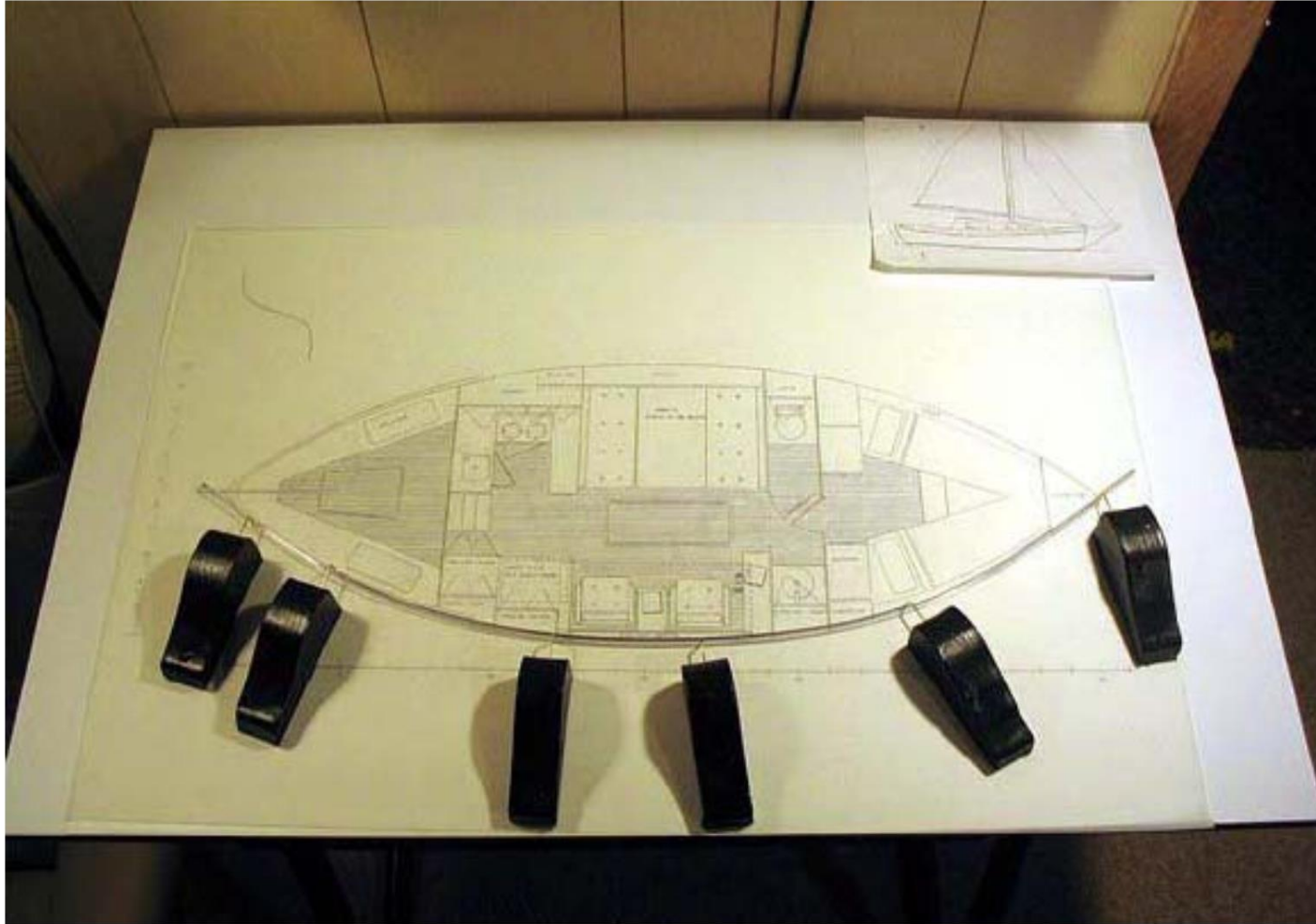
Spline Interpolation

- Interpolation using low-degree piecewise polynomials
 - Third-degree polynomials → **Cubic Splines**

$$S_i(x) = a_i x^3 + b_i x^2 + c_i x + d_i$$



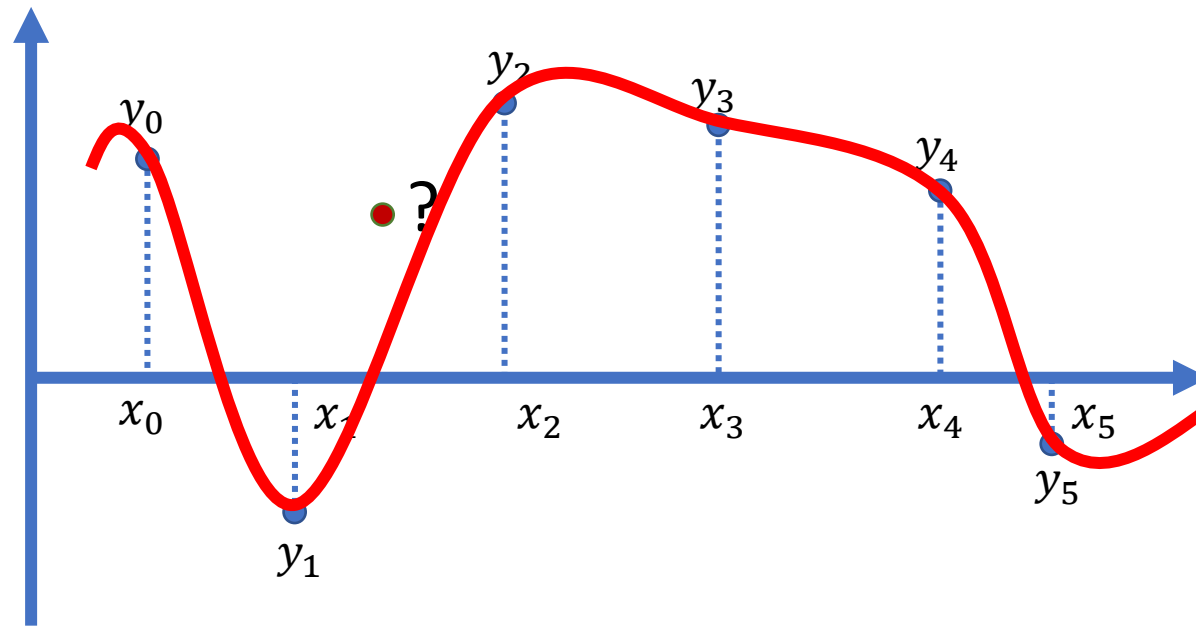
Spline



Cubic Splines

- For a set of data points $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$S_i(x) = a_i x^3 + b_i x^2 + c_i x + d_i$$

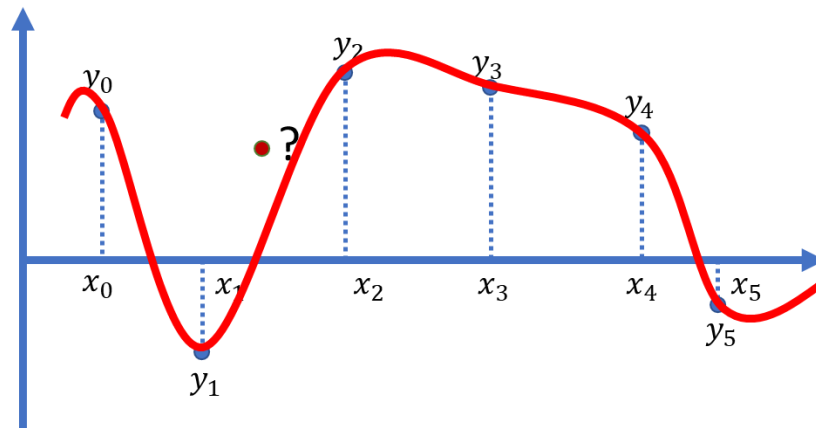


Cubic Splines

- For a set of data points $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$S_i(x) = a_i x^3 + b_i x^2 + c_i x + d_i$$

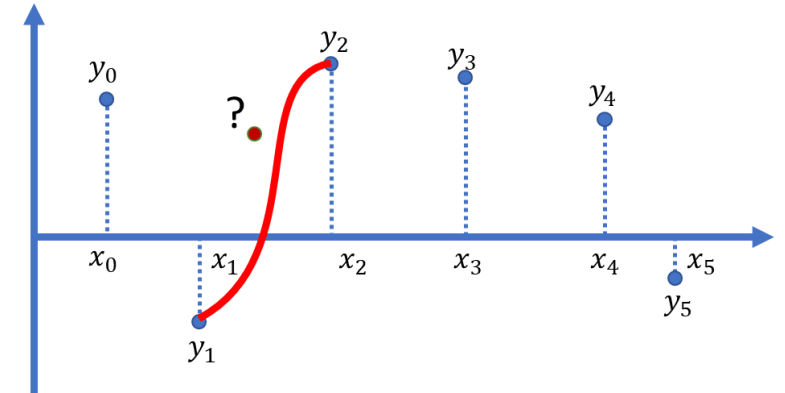
- There are N segments, $4N$ unknown parameters



Cubic Splines

- For a set of data points $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$S_i(x) = a_i x^3 + b_i x^2 + c_i x + d_i$$



- There are N segments, $4N$ unknown parameters

Interpolation condition: $S_i(x_i) = y_i, S_i(x_{i+1}) = y_{i+1}$

C^1 continuity: $S'_{i-1}(x_i) = S'_i(x_i)$

C^2 continuity: $S''_{i-1}(x_i) = S''_i(x_i)$

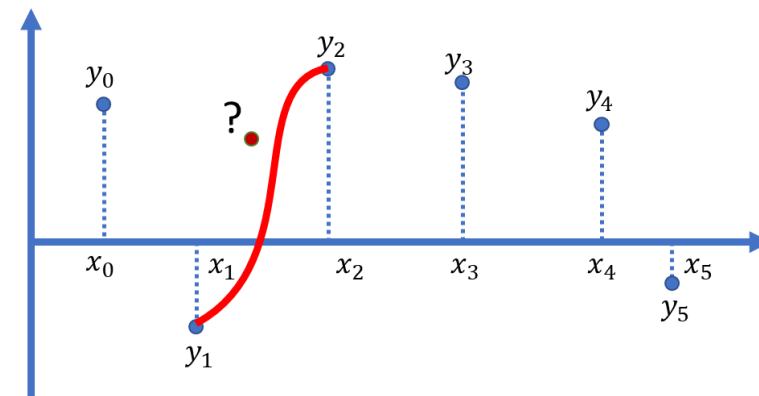
boundary condition: $S'_0(x_0), S'_{n-1}(x_n), S''_0(x_0), S''_{n-1}(x_n)$

Linear Equation

Cubic Splines

- For a set of data points $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$S_i(x) = a_i x^3 + b_i x^2 + c_i x + d_i$$



- There are N segments, $4N$ unknown parameters

Interpolation condition: $S_i(x_i) = y_i$, $S_i(x_{i+1}) = y_{i+1}$

No local control: Every data point affects the entire curve

Computationally expensive: Need to solve very large linear system when N is big

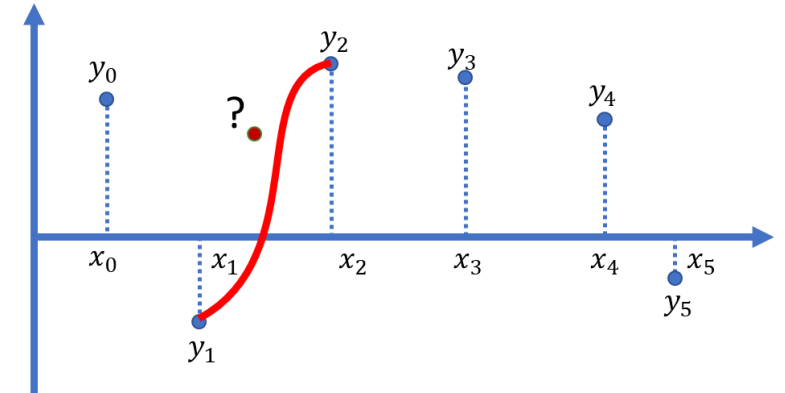
Boundary condition: $S_0'(x_0) = y_0'$, $S_{n-1}'(x_n) = y_{n-1}'$

Linear Equation

Cubic Hermite Splines

- For a set of data points $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$S_i(x) = a_i x^3 + b_i x^2 + c_i x + d_i$$



Interpolation condition: $S_i(x_i) = y_i, S_i(x_{i+1}) = y_{i+1}$

C^1 continuity: $S'_{i-1}(x_i) = S'_i(x_i)$

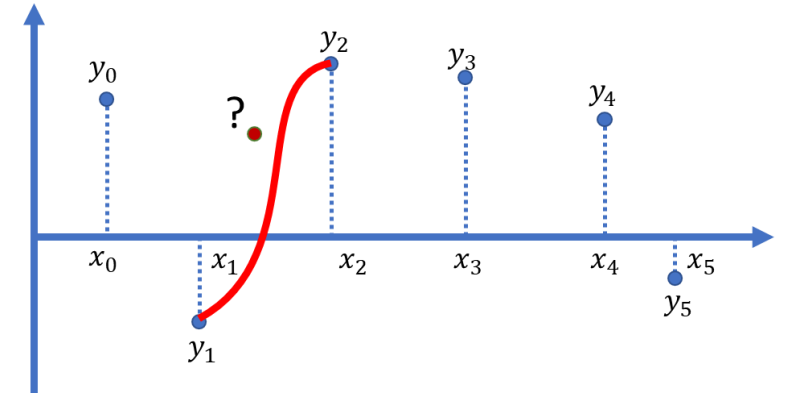
C^2 continuity: $S''_{i-1}(x_i) = S''_i(x_i)$

boundary condition: $S'_0(x_0), S'_{n-1}(x_n), S''_0(x_0), S''_{n-1}(x_n)$

Cubic Hermite Splines

- For a set of data points $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$S_i(x) = a_i x^3 + b_i x^2 + c_i x + d_i$$



Interpolation condition: $S_i(x_i) = y_i, S_i(x_{i+1}) = y_{i+1}$

~~C^1 continuity: $S'_{i-1}(x_i) = S'_i(x_i)$~~

~~C^2 continuity: $S''_{i-1}(x_i) = S''_i(x_i)$~~

~~boundary condition: $S'_0(x_0), S'_{n-1}(x_n), S''_0(x_0), S''_{n-1}(x_n)$~~

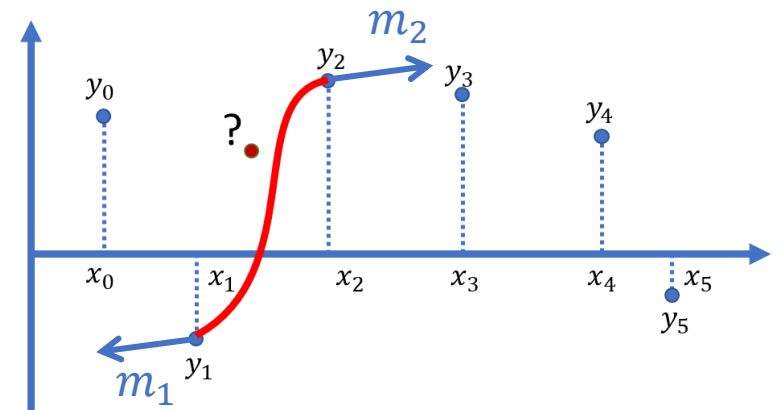
Cubic Hermite Splines

- For a set of data points $D = \{(x_i, y_i) | i = 0, \dots, N\}$

$$S_i(x) = a_i x^3 + b_i x^2 + c_i x + d_i$$

- also we know the first derivatives

$$D' = \{(x_i, m_i) | i = 0, \dots, N\}, S'_i = m_i$$



For each segment i ,

$$S_i(x_i) = y_i, \quad S_i(x_{i+1}) = y_{i+1}$$

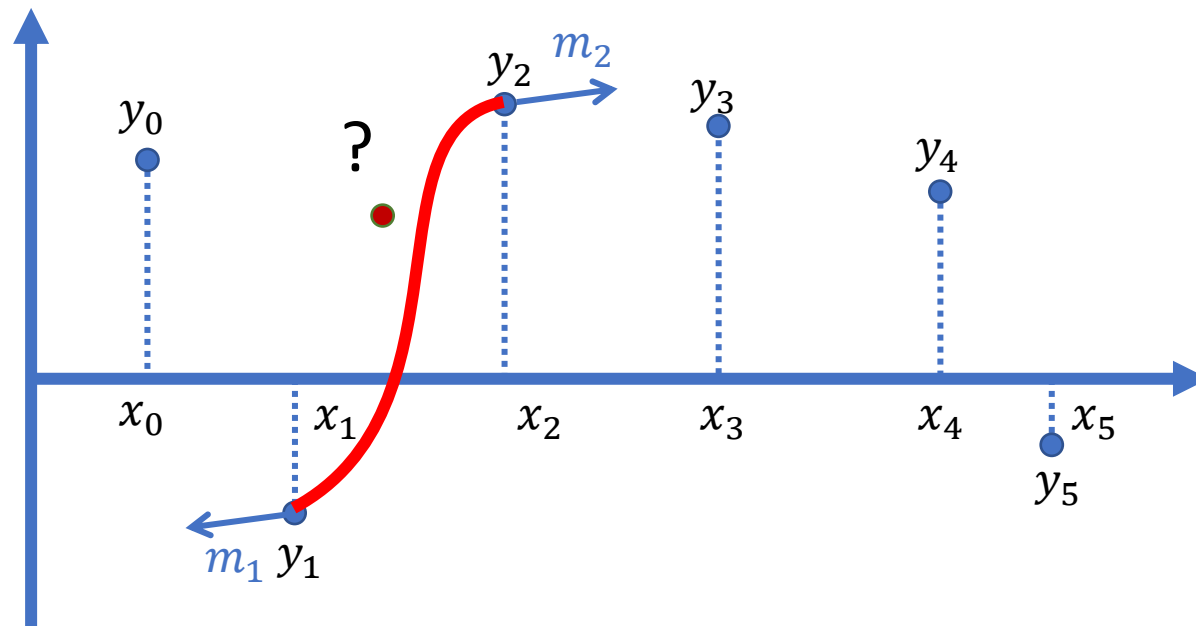
Interpolation condition:

$$S'_i(x_i) = m_i, \quad S'_i(x_{i+1}) = m_{i+1}$$

Cubic Hermite Interpolation

Given $x_1, y_1, m_1, x_2, y_2, m_2$, we need to compute a cubic curve

$$S(x) = ax^3 + bx^2 + cx + d$$



Cubic Hermite Interpolation

Given $x_1, y_1, m_1, x_2, y_2, m_2$, we need to compute a cubic curve

$$S(x) = ax^3 + bx^2 + cx + d$$

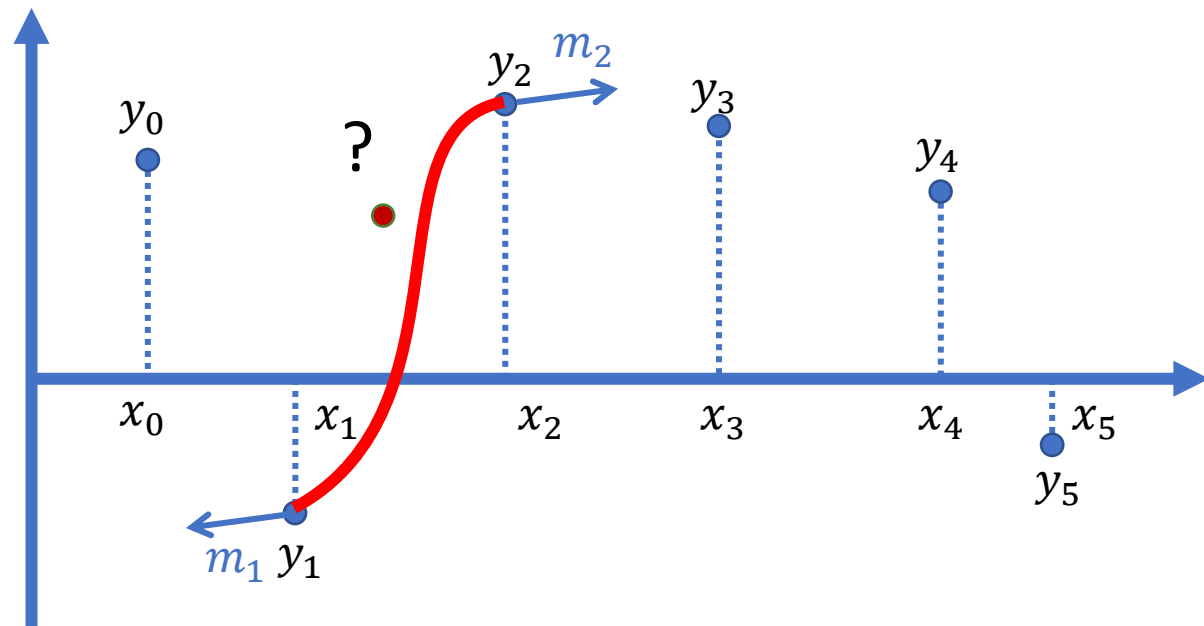
such that

$$S(x_1) = y_1$$

$$S(x_2) = y_2$$

$$S'(x_1) = m_1$$

$$S'(x_2) = m_2$$



Cubic Hermite Interpolation

Given $x_1, y_1, m_1, x_2, y_2, m_2$, we need to compute a cubic curve

$$S(t) = at^3 + bt^2 + ct + d \quad t = \frac{x - x_1}{x_2 - x_1}$$

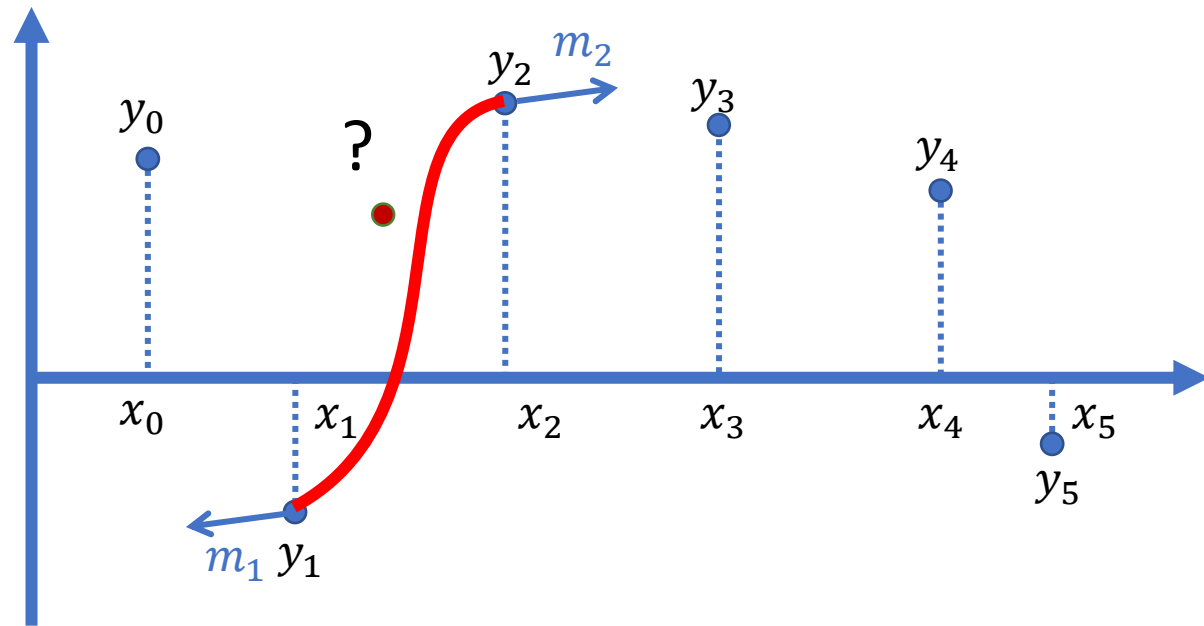
such that

$$S(0) = y_1$$

$$S(1) = y_2$$

$$S'(0) = m_1$$

$$S'(1) = m_2$$



Cubic Hermite Interpolation

Given $x_1, y_1, m_1, x_2, y_2, m_2$, we need to compute a cubic curve

$$S(t) = at^3 + bt^2 + ct + d \quad t = \frac{x - x_1}{x_2 - x_1}$$

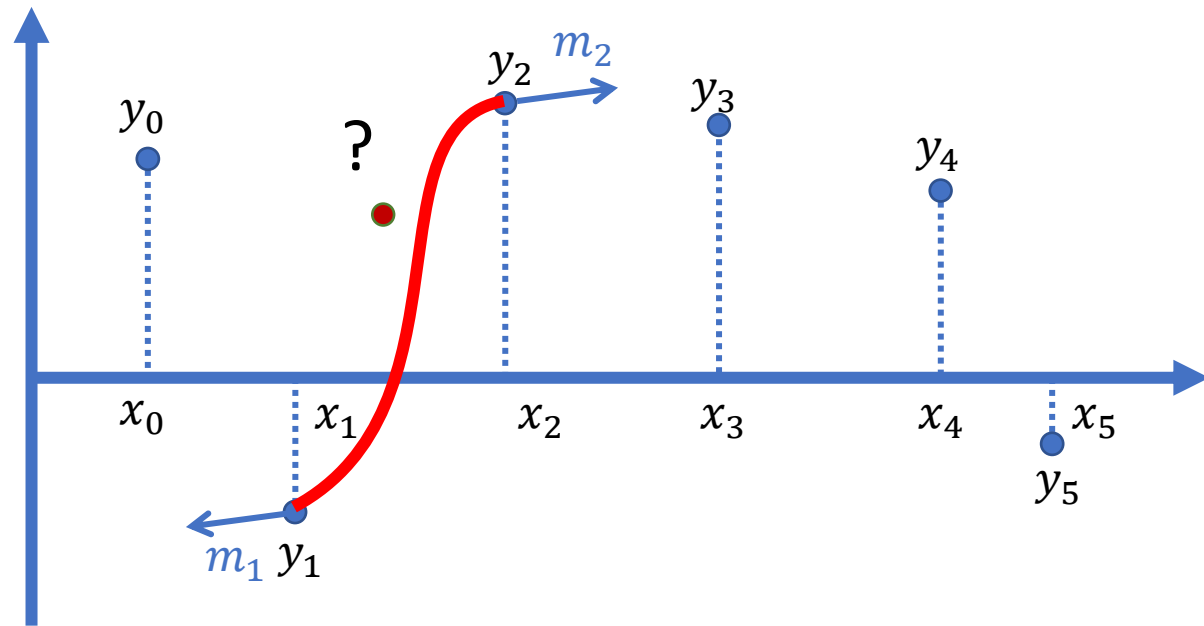
such that

$$S(0) = y_1$$

$$S(1) = y_2$$

$$S'(0) = m_1$$

$$S'(1) = m_2$$



Cubic Hermite Interpolation

Given $x_1, y_1, m_1, x_2, y_2, m_2$, we need to compute a cubic curve

$$S(t) = at^3 + bt^2 + ct + d \quad t = \frac{x - x_1}{x_2 - x_1}$$

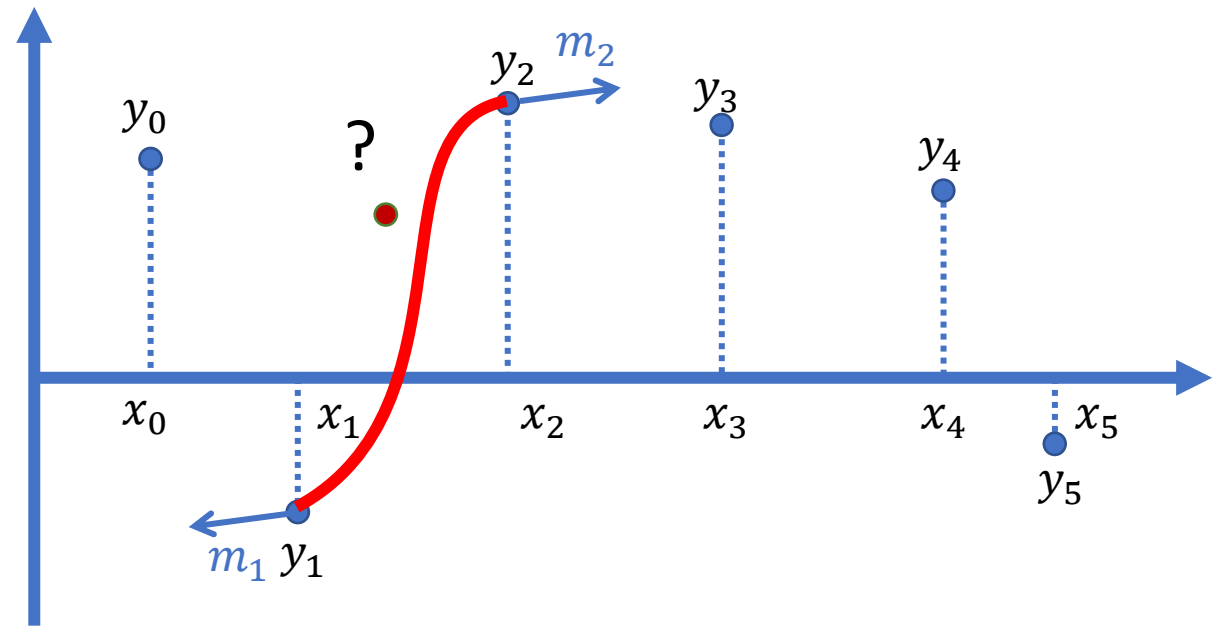
such that

$$S(0) = y_1 = d$$

$$S(1) = y_2 = a + b + c + d$$

$$S'(0) = m_1 = c$$

$$S'(1) = m_2 = 3a + 2b + c$$



Cubic Hermite Interpolation

Given $x_1, y_1, m_1, x_2, y_2, m_2$, we need to compute a cubic curve

$$S(t) = at^3 + bt^2 + ct + d \quad t = \frac{x - x_1}{x_2 - x_1}$$

such that

$$S(0) = y_1 = d$$

$$S(1) = y_2 = a + b + c + d$$

$$S'(0) = m_1 = c$$

$$S'(1) = m_2 = 3a + 2b + c$$



$$\begin{bmatrix} 0 & 0 & 0 & 1 \\ 1 & 1 & 1 & 1 \\ 0 & 0 & 1 & 0 \\ 3 & 2 & 1 & 0 \end{bmatrix} \begin{bmatrix} a \\ b \\ c \\ d \end{bmatrix} = \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

Cubic Hermite Interpolation

Given $x_1, y_1, m_1, x_2, y_2, m_2$, we need to compute a cubic curve

$$S(t) = at^3 + bt^2 + ct + d \quad t = \frac{x - x_1}{x_2 - x_1}$$

such that

$$S(0) = y_1 = d$$

$$S(1) = y_2 = a + b + c + d$$

$$S'(0) = m_1 = c$$

$$S'(1) = m_2 = 3a + 2b + c$$



$$\begin{bmatrix} a \\ b \\ c \\ d \end{bmatrix} = \begin{bmatrix} 2 & -2 & 1 & 1 \\ -3 & 3 & -2 & -1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

Cubic Hermite Interpolation

Given $x_1, y_1, m_1, x_2, y_2, m_2$, we have a cubic curve

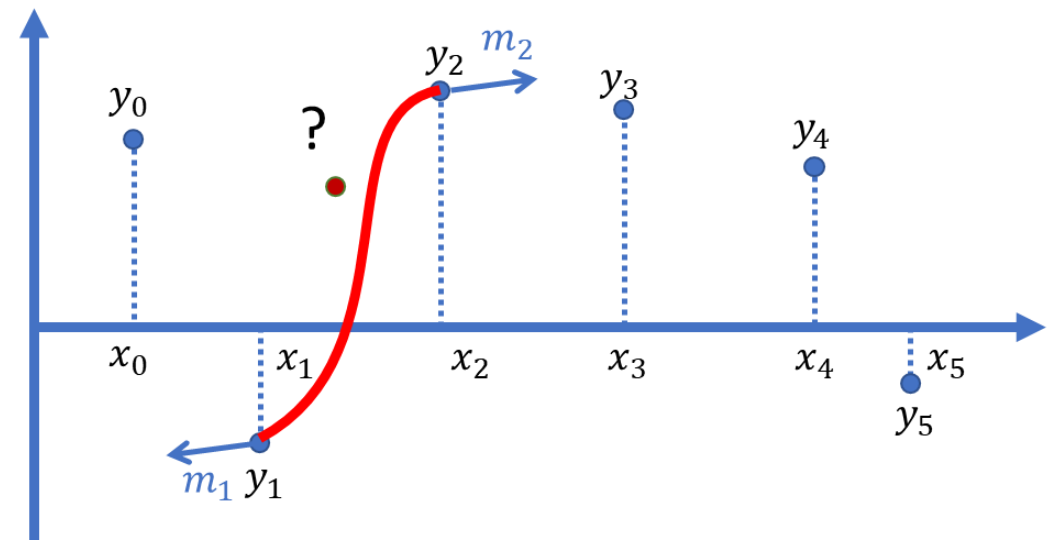
$$S(t) = at^3 + bt^2 + ct + d \quad t = \frac{x - x_1}{x_2 - x_1}$$

where

$$\begin{bmatrix} a \\ b \\ c \\ d \end{bmatrix} = \begin{bmatrix} 2 & -2 & 1 & 1 \\ -3 & 3 & -2 & -1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

and

$$\begin{aligned} S(0) &= y_i, & S(1) &= y_{i+1} \\ S'(0) &= m_i, & S'(1) &= m_{i+1} \end{aligned}$$



Cubic Hermite Interpolation

$$S(t) = at^3 + bt^2 + ct + d$$

$$= [t^3 \quad t^2 \quad t^1 \quad 1] \begin{bmatrix} a \\ b \\ c \\ d \end{bmatrix}$$

$$= [t^3 \quad t^2 \quad t^1 \quad 1] \begin{bmatrix} 2 & -2 & 1 & 1 \\ -3 & 3 & -2 & -1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

Cubic Hermite Interpolation

$$S(t) = at^3 + bt^2 + ct + d$$

$$= [t^3 \quad t^2 \quad t^1 \quad 1] \begin{bmatrix} a \\ b \\ c \\ d \end{bmatrix}$$

$$= [t^3 \quad t^2 \quad t^1 \quad 1] \begin{bmatrix} 2 & -2 & 1 & 1 \\ -3 & 3 & -2 & -1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

Cubic Hermite Interpolation

$$S(t) = at^3 + bt^2 + ct + d$$

$$= \begin{bmatrix} t^3 & t^2 & t^1 & 1 \end{bmatrix} \begin{bmatrix} 2 & -2 & 1 & 1 \\ -3 & 3 & -2 & -1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

$$= \begin{bmatrix} 2t^3 - 3t^2 + 1 \\ -2t^3 + 3t^2 \\ t^3 - 2t^2 + t \\ t^3 - t^2 \end{bmatrix}^T \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

Cubic Hermite Interpolation

$$S(t) = at^3 + bt^2 + ct + d$$

$$= \begin{bmatrix} t^3 & t^2 & t^1 & 1 \end{bmatrix} \begin{bmatrix} 2 & -2 & 1 & 1 \\ -3 & 3 & -2 & -1 \\ 0 & 0 & 1 & 0 \\ 1 & 0 & 0 & 0 \end{bmatrix} \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

$$= \begin{bmatrix} 2t^3 - 3t^2 + 1 \\ -2t^3 + 3t^2 \\ t^3 - 2t^2 + t \\ t^3 - t^2 \end{bmatrix}^T \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

Hermite Basis Functions

$$S(t) = at^3 + bt^2 + ct + d$$

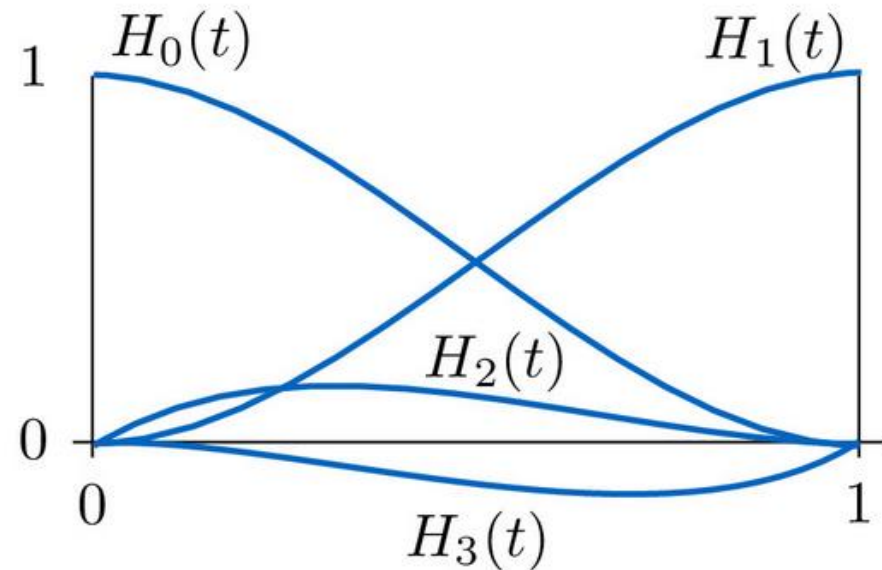
$$= [H_0(t) \quad H_1(t) \quad H_2(t) \quad H_3(t)] \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$

$$H_0(t) = 2t^3 - 3t^2 + 1$$

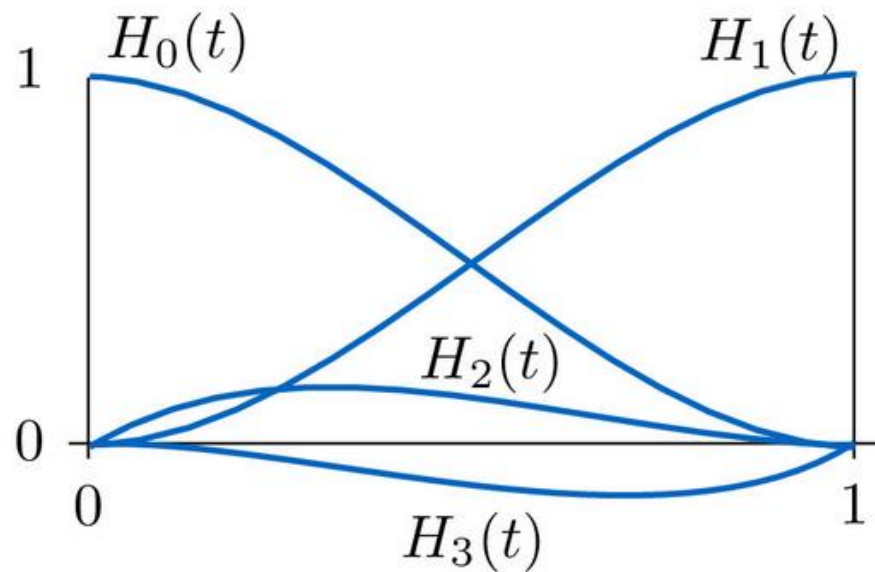
$$H_1(t) = -2t^3 + 3t^2$$

$$H_2(t) = t^3 - 2t^2 + t$$

$$H_3(t) = t^3 - t^2$$



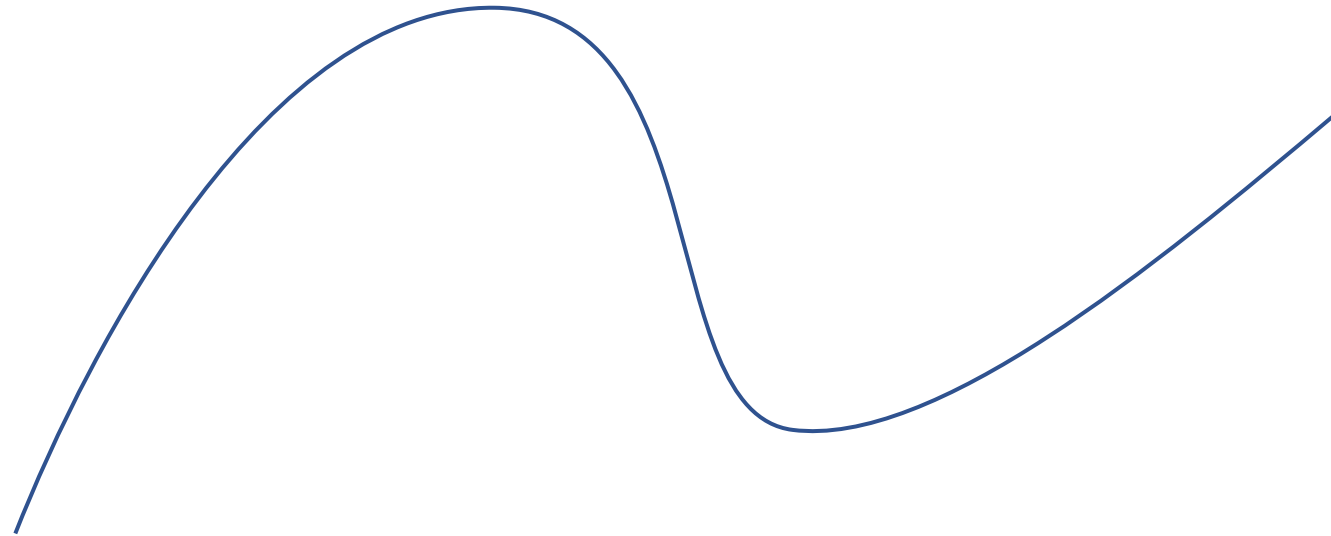
Generalization to Higher Dimensionality



$$\mathbf{S}(t) = \mathbf{a}t^3 + \mathbf{b}t^2 + \mathbf{c}t + \mathbf{d}$$

$$= \begin{bmatrix} \vdots & \vdots & \vdots & \vdots \\ \mathbf{y}_1 & \mathbf{y}_2 & \mathbf{m}_1 & \mathbf{m}_2 \\ \vdots & \vdots & \vdots & \vdots \end{bmatrix} \begin{bmatrix} H_0(t) \\ H_1(t) \\ H_2(t) \\ H_3(t) \end{bmatrix}$$

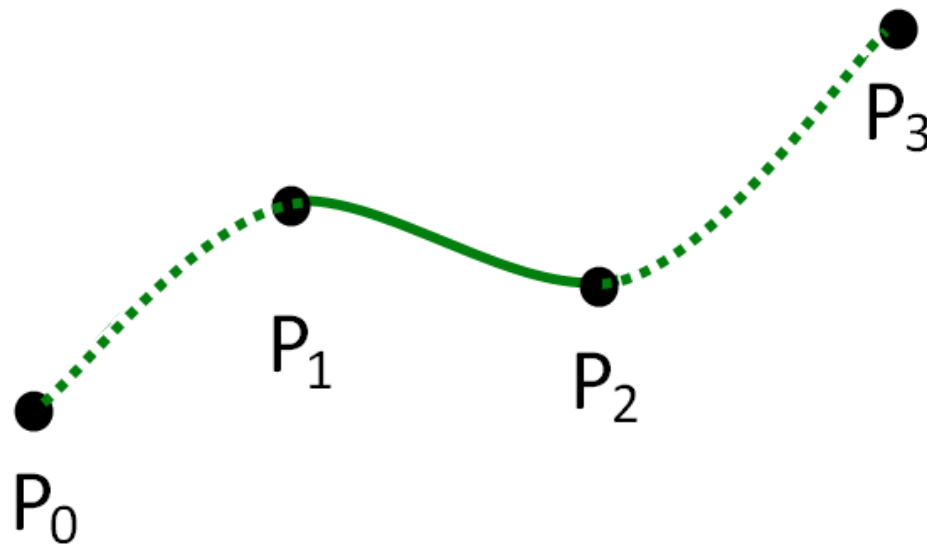
Example: Curve Tool of PowerPoint



Catmull-Rom Spline

$$S(t) = at^3 + bt^2 + ct + d$$

$$= \begin{bmatrix} 2t^3 - 3t^2 + 1 \\ -2t^3 + 3t^2 \\ t^3 - 2t^2 + t \\ t^3 - t^2 \end{bmatrix}^T \begin{bmatrix} y_1 \\ y_2 \\ m_1 \\ m_2 \end{bmatrix}$$



$$y_1 = p_1$$

$$y_2 = p_2$$

$$m_1 = \frac{1}{2} \frac{p_2 - p_0}{x_2 - x_0}$$

$$m_2 = \frac{1}{2} \frac{p_3 - p_1}{x_3 - x_1}$$

Catmull-Rom Spline

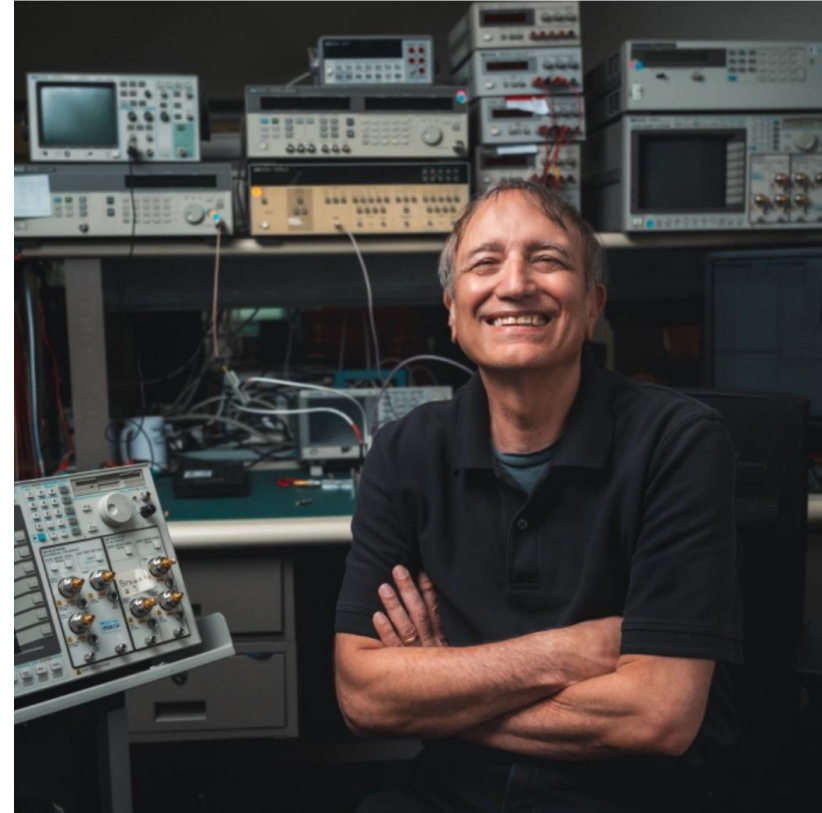


Edwin Catmull

2019 ACM Turing Award



Edwin Catmull



Pat Hanrahan

2019 ACM Turing Award

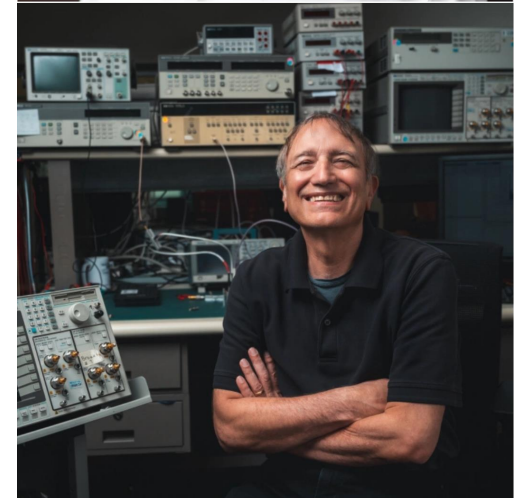
ACM named [Patrick M. \(Pat\) Hanrahan](#) and [Edwin E. \(Ed\) Catmull](#) recipients of the 2019 ACM A.M. Turing Award for fundamental contributions to 3-D computer graphics, and the revolutionary impact of these techniques on computer-generated imagery (CGI) in filmmaking and other applications. [Catmull](#) is a computer scientist and [former president of Pixar and Disney Animation Studios](#). [Hanrahan](#), a [founding employee at Pixar](#), is a professor in the Computer Graphics Laboratory at Stanford University.

<https://awards.acm.org/about/2019-turing>

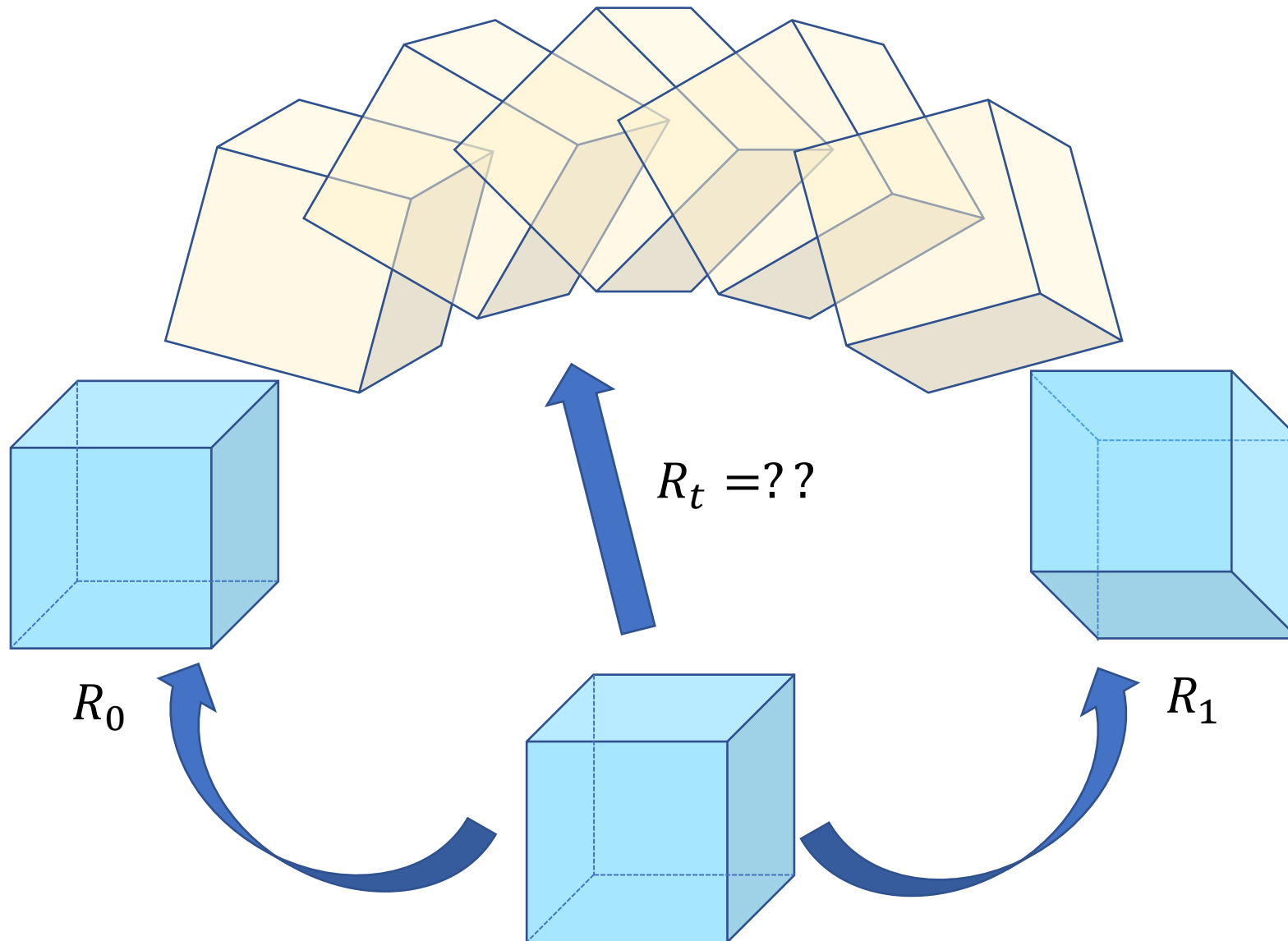
Edwin Catmull



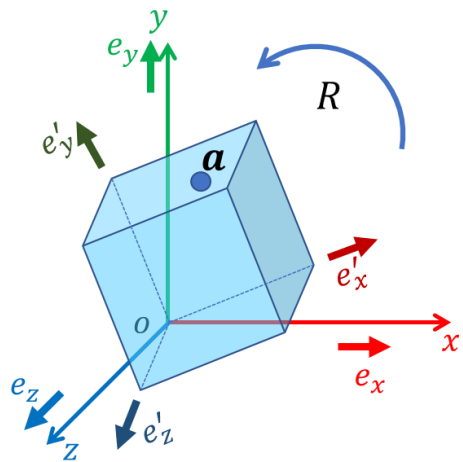
Pat Hanrahan



Interpolation of Rotations

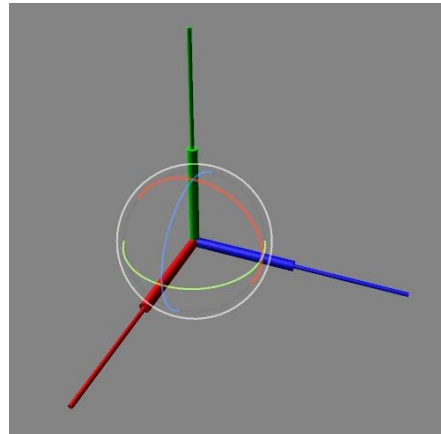


Rotation Representations



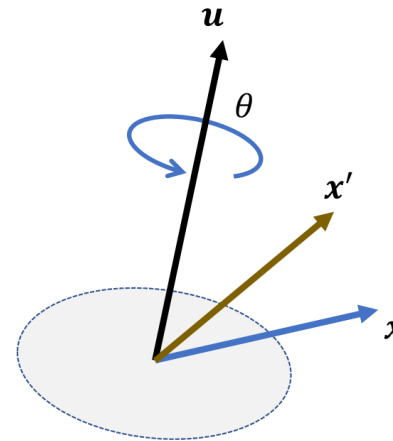
Rotation Matrix

$$R_x(\alpha)R_y(\beta)R_z(\gamma)$$



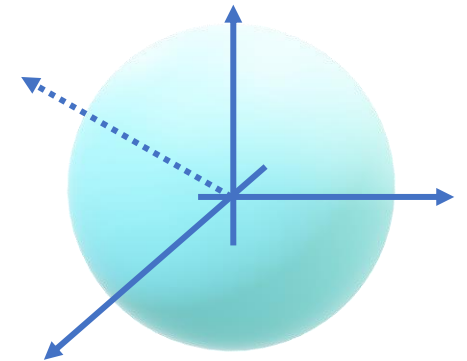
Euler Angles

$$(\mathbf{u}, \theta) \text{ or } \theta$$



Axis Angles

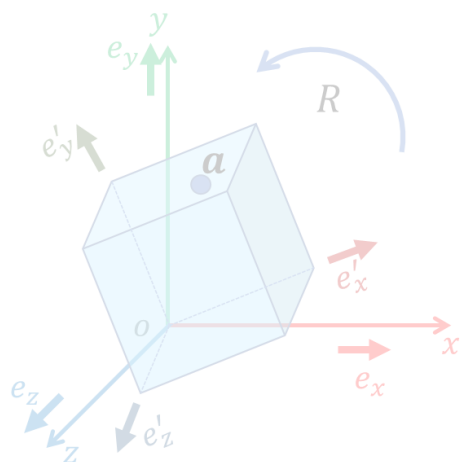
$$\mathbf{q} = \begin{bmatrix} w \\ \mathbf{v} \end{bmatrix}$$



Unit Quaternions

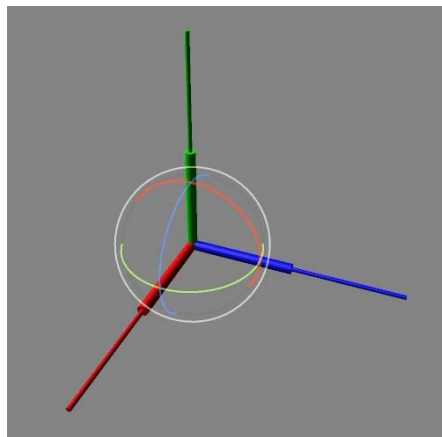
Interpolation of Rotations

Interpolate parameters using (linear/cubic) splines



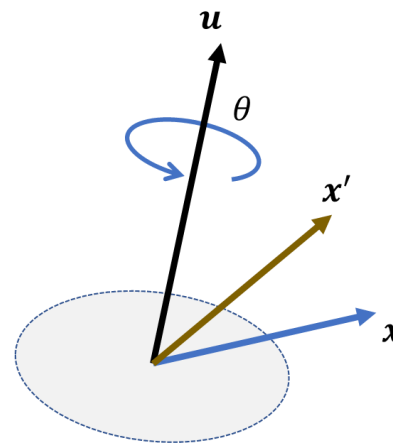
Rotation Matrix

$$R_x(\alpha)R_y(\beta)R_z(\gamma)$$



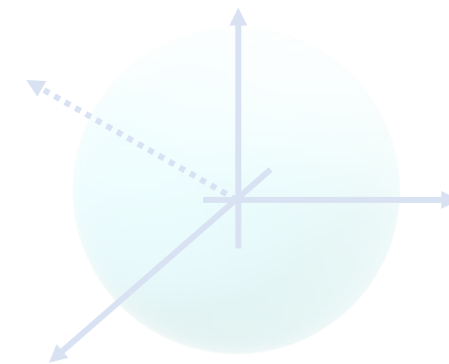
Euler Angles

$$(\mathbf{u}, \theta) \text{ or } \theta$$



Axis Angles

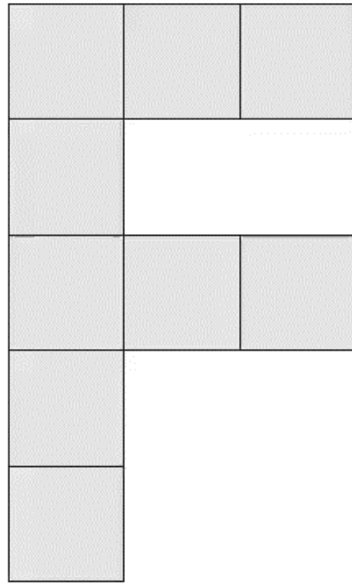
$$q = \begin{bmatrix} w \\ \mathbf{v} \end{bmatrix}$$



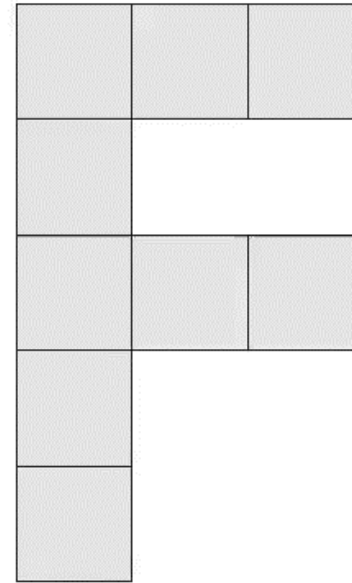
Unit Quaternions

Rotational speed is usually not constant

Interpolation of Rotations



catmull-rom euler

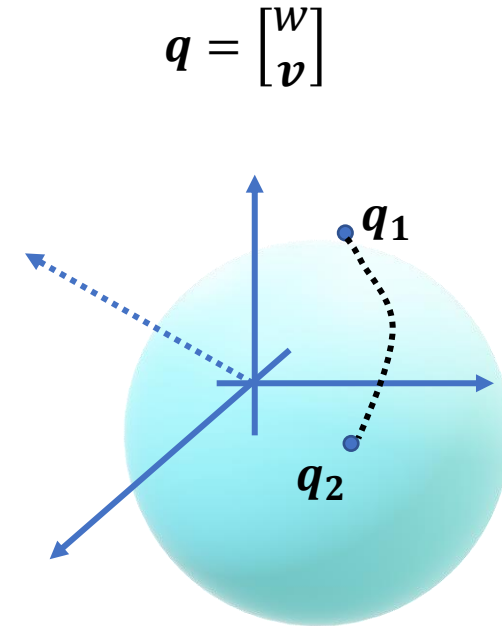


catmull-rom axis-angle

SLERP for Quaternions

$$\mathbf{q}_t = \frac{\sin[(1-t)\theta]}{\sin\theta} \mathbf{q}_0 + \frac{\sin t\theta}{\sin\theta} \mathbf{q}_1$$

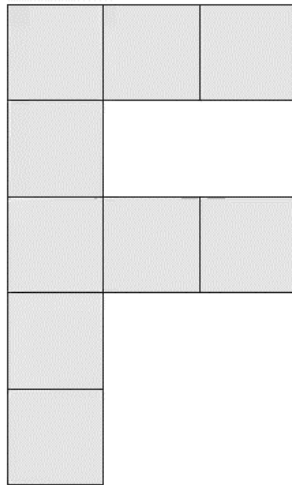
$$\cos\theta = \mathbf{q}_0 \cdot \mathbf{q}_1$$



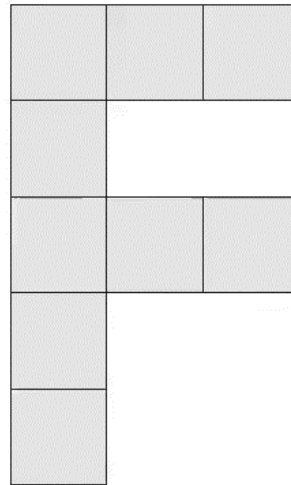
Unit Quaternions

Constant rotational speed, but only “linear” interpolation

Splines for Quaternions?



piecewise Slerp



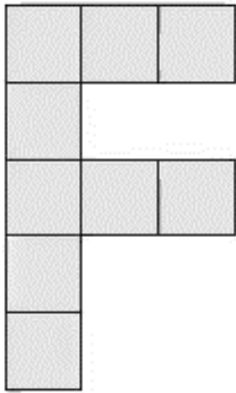
TCB interp



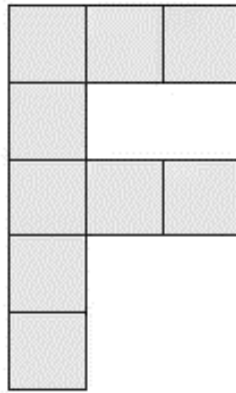
Ken Shoemake. 1985
Animating rotation with quaternion curves.
SIGGRAPH Computer Graphics,

<https://splines.readthedocs.io/en/latest/rotation/kochanek-bartels.html>

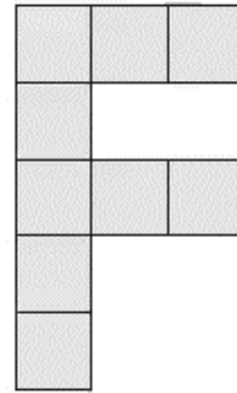
Splines for Quaternions?



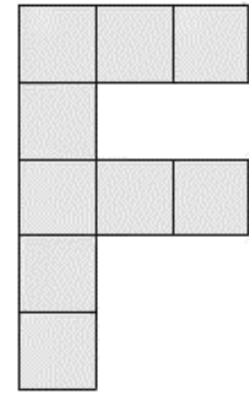
catmull-rom euler



catmull-rom axis-angle



piecewise Slerp



TCB interp

Outline

- Character Kinematics (cont.)
 - Motion Retargeting
 - Full-body IK
- Keyframe Animation
 - Interpolation and splines

Questions?

