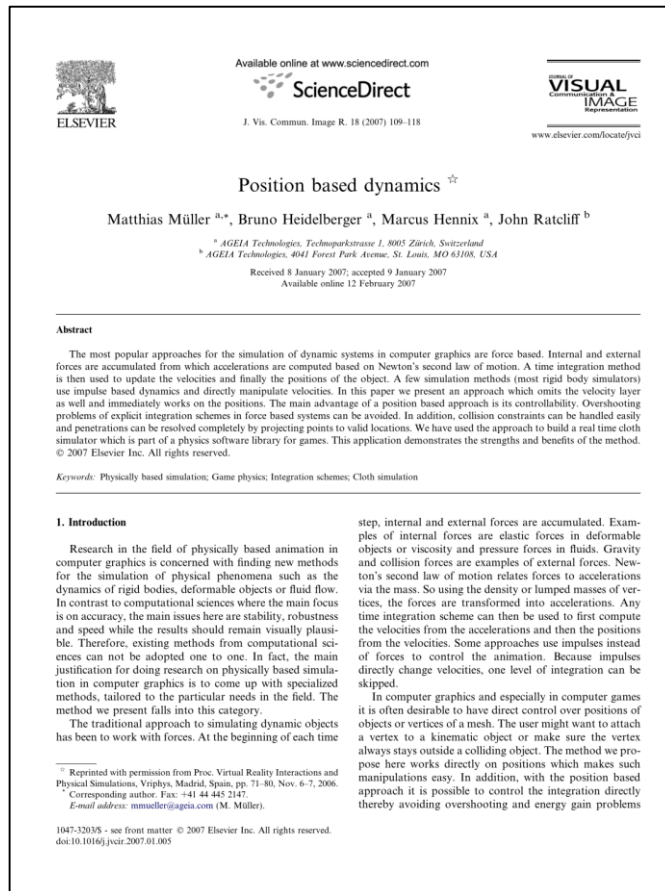


Position Based Dynamics

Paper Review: Summary with Visualization and Questions

*SNU ECE 23
Sanghwa Lee*

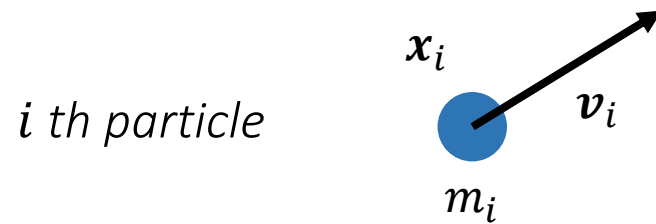
Paper review



Müller, Matthias, et al. "Position Based Dynamics."
Journal of Visual Communication and Image
Representation, vol. 18, no. 2, Apr. 2007, pp. 109–118.

Algorithm overview

N particles



M constraints

j th constraint

$$C_j(\mathbf{x}_{i_1}, \dots, \mathbf{x}_{i_j}) = 0$$

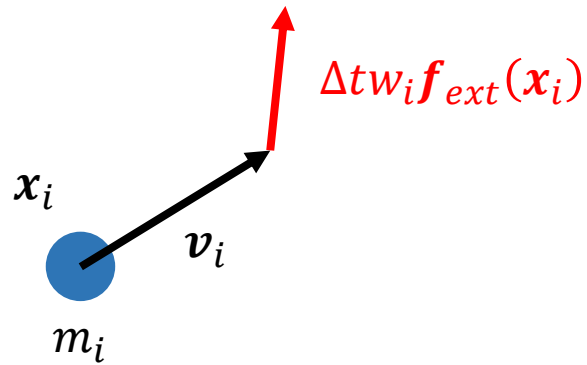
or

$$C_j(\mathbf{x}_{i_1}, \dots, \mathbf{x}_{i_j}) \leq 0$$

```
(1) forall vertices i
(2)   initialize  $\mathbf{x}_i = \mathbf{x}_i^0$ ,  $\mathbf{v}_i = \mathbf{v}_i^0$ ,  $w_i = 1/m_i$ 
(3) endfor
(4) loop
(5)   forall vertices i do  $\mathbf{v}_i \leftarrow \mathbf{v}_i + \Delta t w_i \mathbf{f}_{\text{ext}}(\mathbf{x}_i)$ 
(6)   dampVelocities( $\mathbf{v}_1, \dots, \mathbf{v}_N$ )
(7)   forall vertices i do  $\mathbf{p}_i \leftarrow \mathbf{x}_i + \Delta t \mathbf{v}_i$ 
(8)   forall vertices i do
       generateCollisionConstraints( $\mathbf{x}_i \rightarrow \mathbf{p}_i$ )
(9)   loop solverIterations times
(10)    projectConstraints( $C_1, \dots, C_{M+M_{\text{coll}}}, \mathbf{p}_1, \dots, \mathbf{p}_N$ )
(11)  endloop
(12)  forall vertices i
(13)     $\mathbf{v}_i \leftarrow (\mathbf{p}_i - \mathbf{x}_i) / \Delta t$ 
(14)     $\mathbf{x}_i \leftarrow \mathbf{p}_i$ 
(15)  endfor
(16)  velocityUpdate( $\mathbf{v}_1, \dots, \mathbf{v}_N$ )
(17) endloop
```

Algorithm overview

i th particle



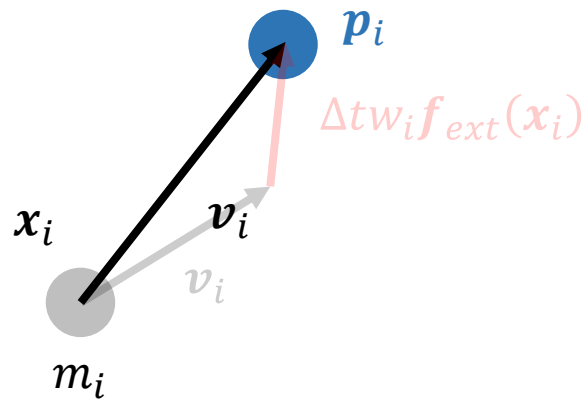
① Update the velocity

$$\mathbf{v}_i \leftarrow \mathbf{v}_i + \Delta t w_i \mathbf{f}_{ext}(\mathbf{x}_i)$$

*The affect of the external force
applied to the particle*

Algorithm overview

i th particle



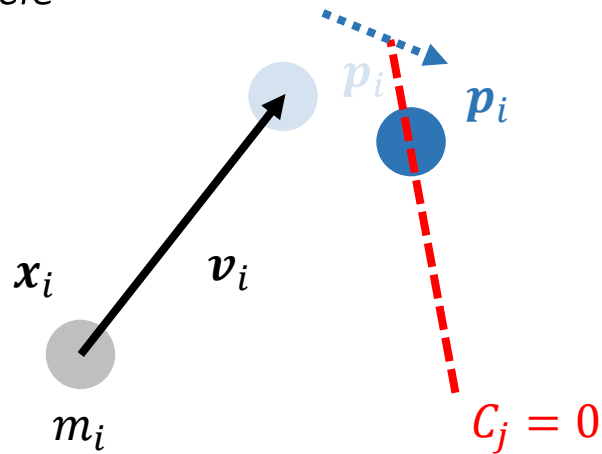
② Expect the position

$$p_i \leftarrow x_i + \Delta t v_i$$

*Pre-solve the expected position
with Euler step*

Algorithm overview

i th particle



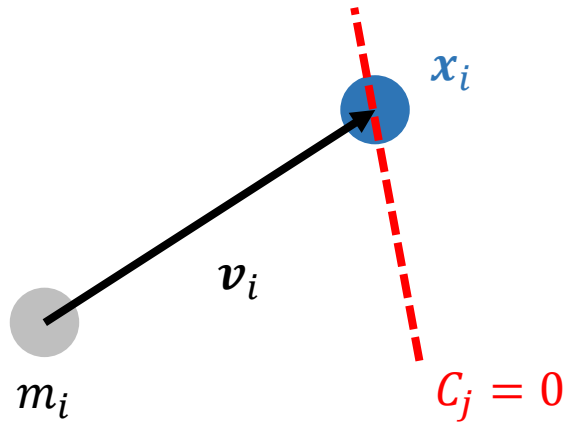
③ Consider the constraints

$projectConstraints(C_j, \dots, p_i, \dots)$

Constraints(initial length, bending, etc.) are considered to correct the expected position

Algorithm overview

i th particle



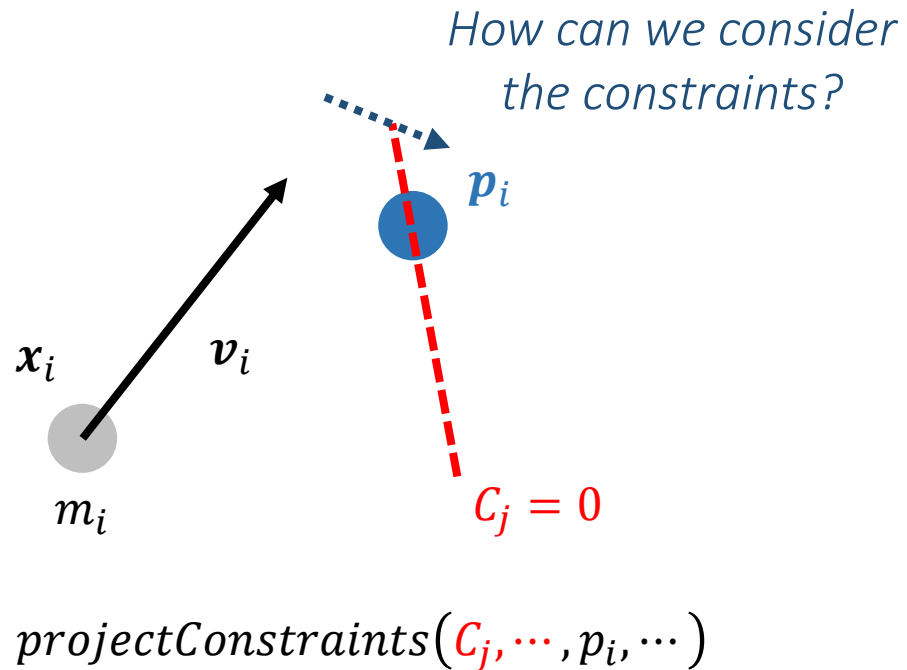
④ *Correct the velocity*

$$v_i \leftarrow (p_i - x_i) / \Delta t$$

$$x_i \leftarrow p_i$$

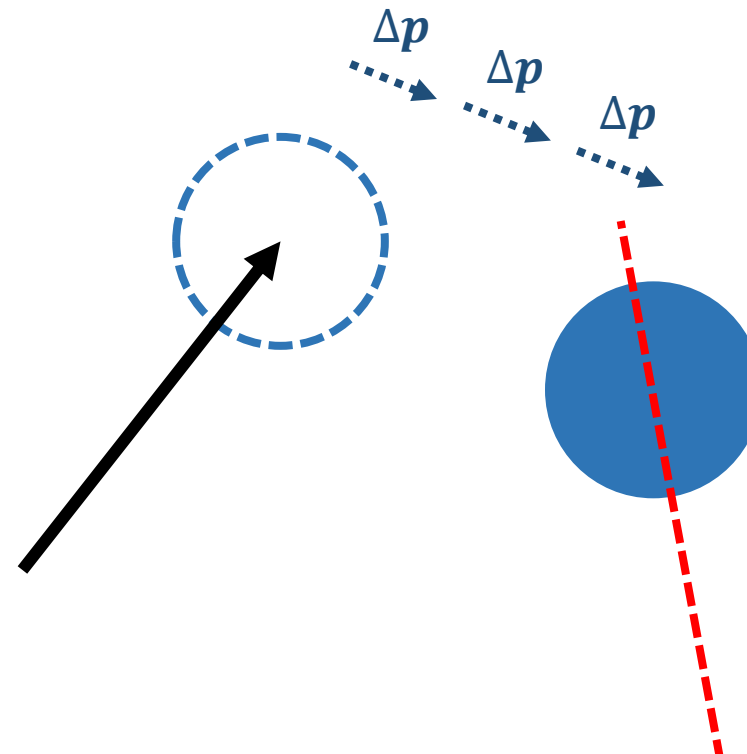
Correct the velocity so that the constraints are considered, and update the position

Projecting constraints



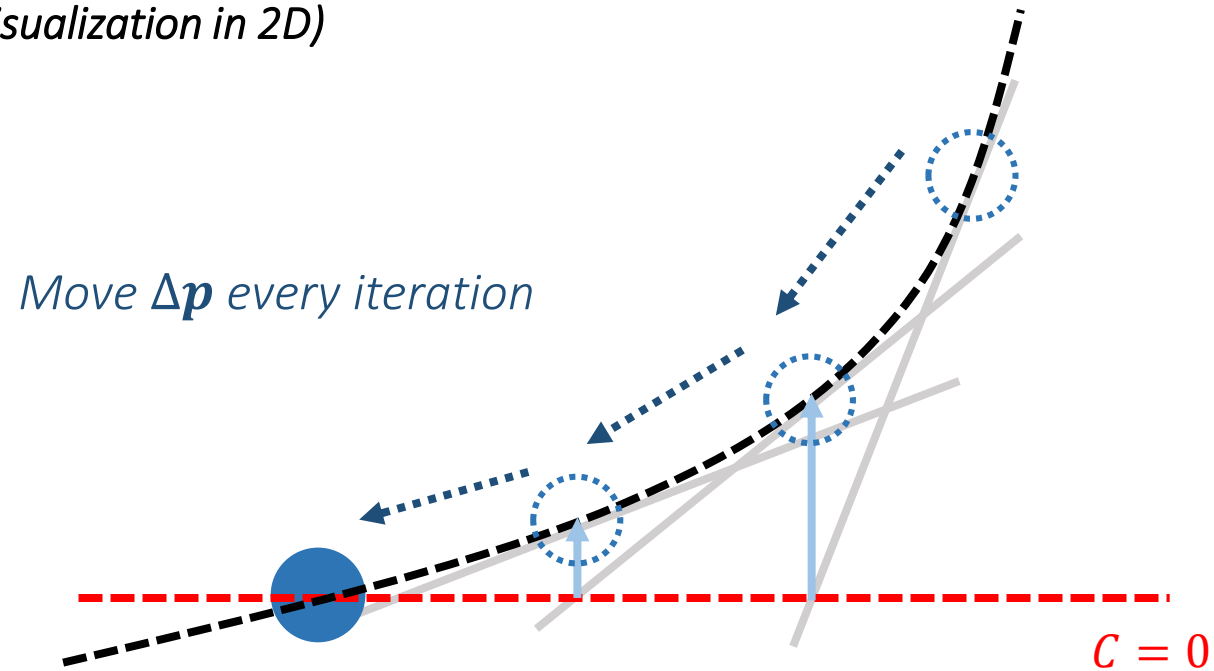
Gauss-Seidel-type iteration

Iteratively find by step Δp



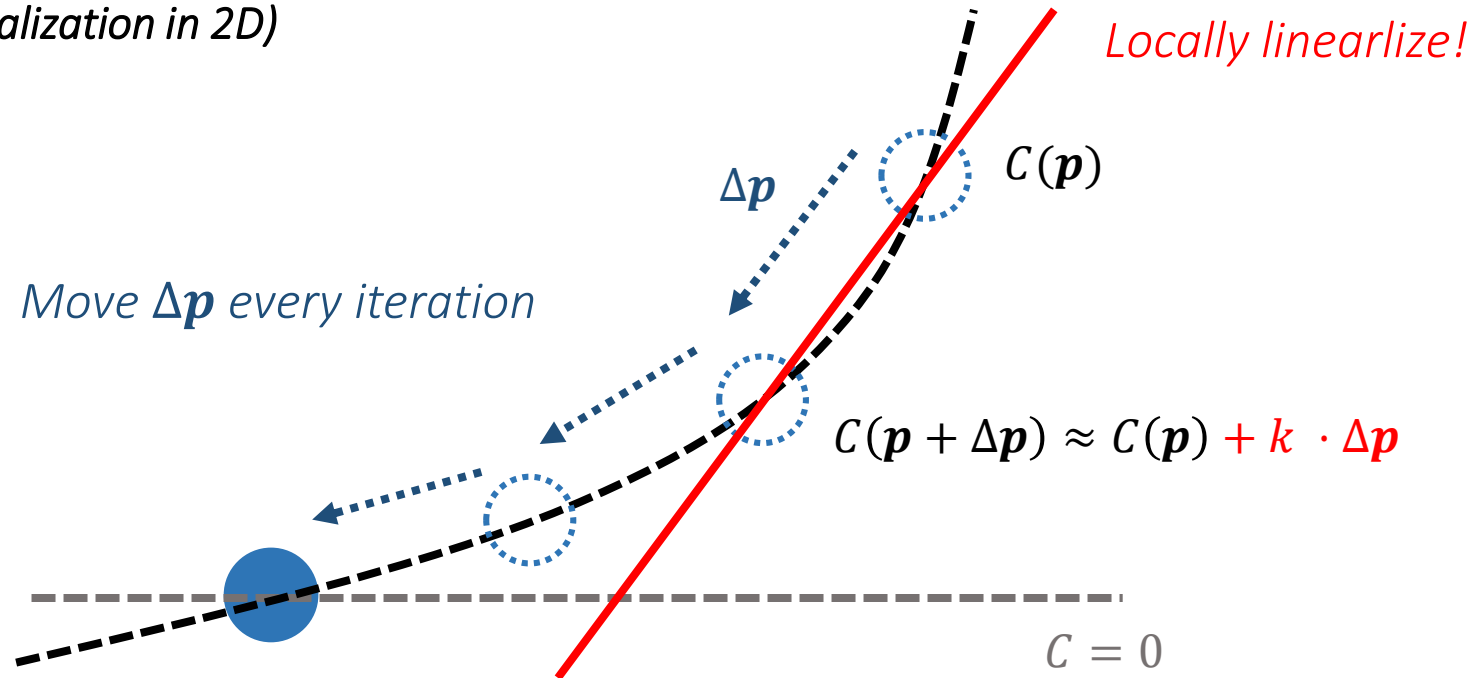
Iteration method

*Newton-Raphson process
(visualization in 2D)*



Iteration method

*Newton-Raphson process
(visualization in 2D)*

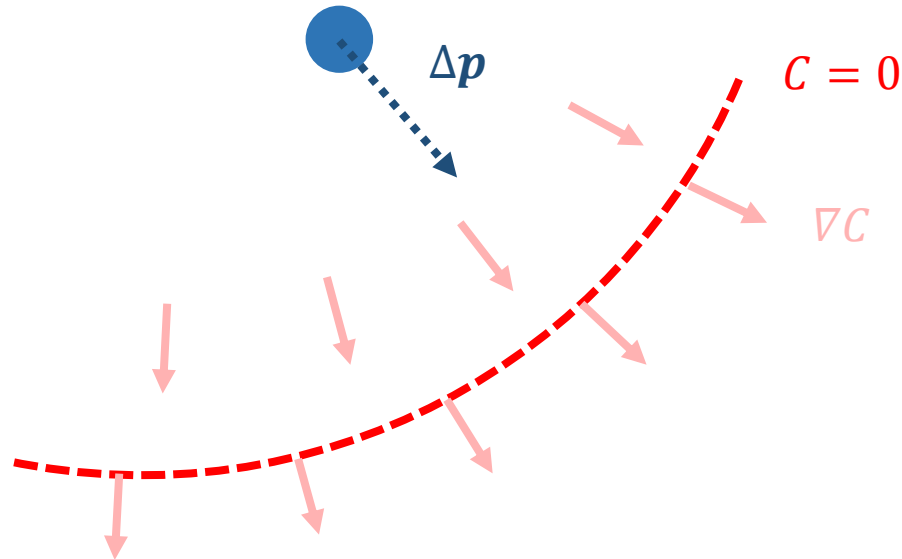


Iteration method

C : Constraint of n points

$$\mathbf{p} = [\mathbf{p}_1^T, \dots, \mathbf{p}_n^T]^T \quad (\text{Concatenation})$$

$3n$ Dimension



$$C(\mathbf{p} + \Delta\mathbf{p}) \approx C(\mathbf{p}) + \nabla_{\mathbf{p}} C(\mathbf{p}) \cdot \Delta\mathbf{p} = 0$$

Fastest approach $\Delta\mathbf{p} \parallel \nabla C$

$$\Delta\mathbf{p} = \lambda \nabla_{\mathbf{p}} C(\mathbf{p}) = - \frac{C(\mathbf{p})}{|\nabla_{\mathbf{p}} C(\mathbf{p})|^2} \nabla_{\mathbf{p}} C(\mathbf{p})$$

For a single point i ,

$$\Delta\mathbf{p}_i = - \underbrace{\frac{n \cdot w_i}{\sum_j w_j}}_{\text{Weight distribution}} \underbrace{\frac{C(\mathbf{p}_1, \dots, \mathbf{p}_n)}{\sum_j |\nabla_{\mathbf{p}_j} C(\mathbf{p}_1, \dots, \mathbf{p}_n)|^2}}_{\text{Scaling factor } s} \nabla_{\mathbf{p}_i} C(\mathbf{p}_1, \dots, \mathbf{p}_n)$$

Weight
distribution

Scaling factor s

Constraint type

Type equality $C(\mathbf{p}_1, \dots, \mathbf{p}_n) = 0$

\Rightarrow Always perform a projection

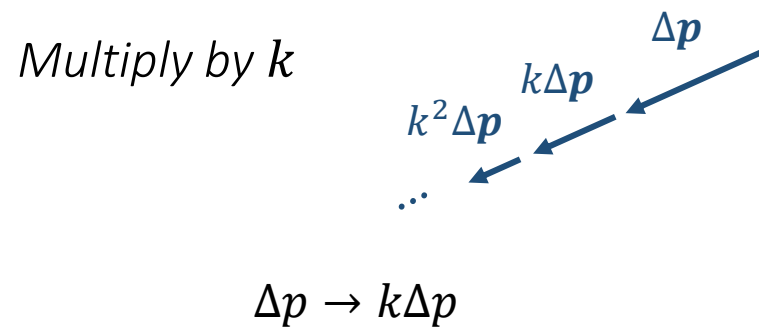
Type inequality $C(\mathbf{p}_1, \dots, \mathbf{p}_n) \leq 0$

\Rightarrow Only when $C < 0$

+

Stiffness parameter

$$0 \leq k \leq 1$$



Error after n_s iterations

$$\Rightarrow \Delta p(1 - k)^{n_s} \quad \text{Non-linear}$$



$$\text{Set } k' = 1 - (1 - k)^{1/n_s}$$

$$\Rightarrow \Delta p(1 - k')^{n_s} = \Delta p(1 - k) \quad \text{Linear}$$

Collision handling

Total number of
constraints $M + M_{coll}$

Collision constraint
(Generated every step)

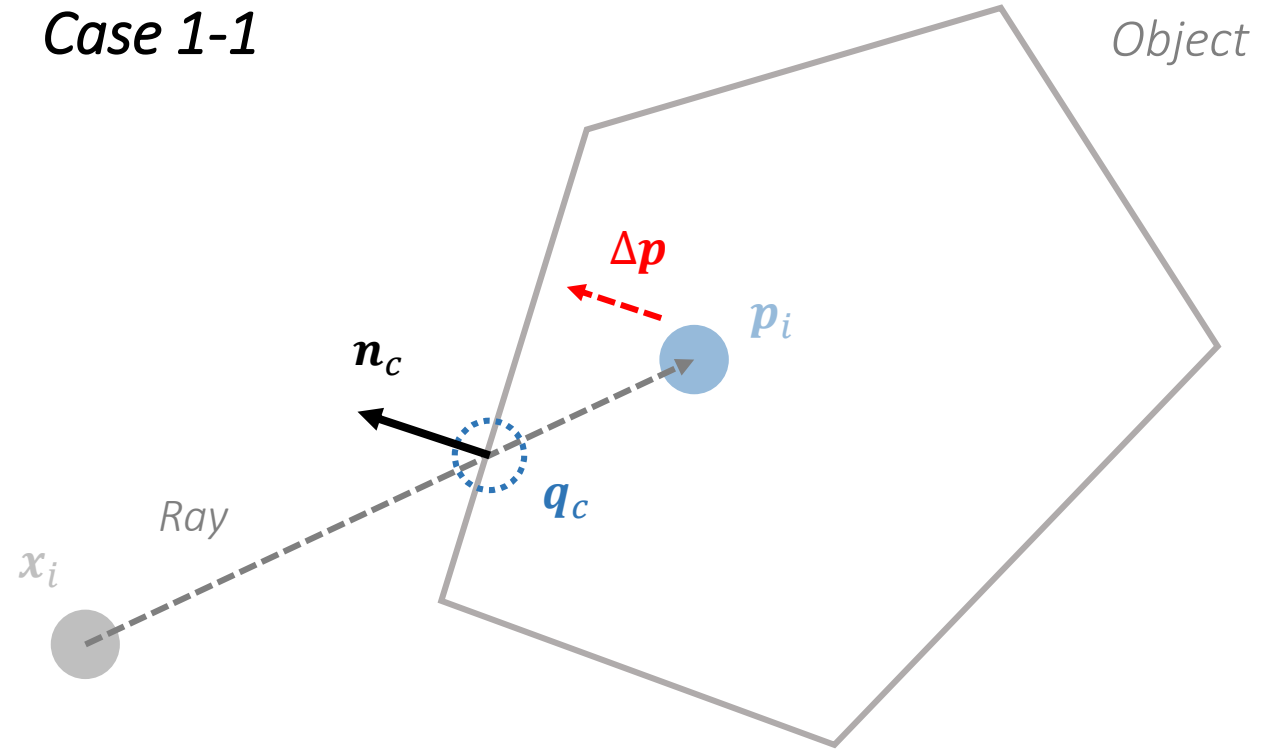
Case 1 with static objects

1-1 Continuous collision handling

1-2 Static collision handling

Case 2 between dynamic objects

Case 1-1



$$C(p) = (p - q_c) \cdot n_c \leq 0$$

$$k = 1$$

Collision handling

Total number of
constraints $M + M_{coll}$

Collision constraint
(Generated every step)

Case 1 with static objects

1-1 Continuous collision handling

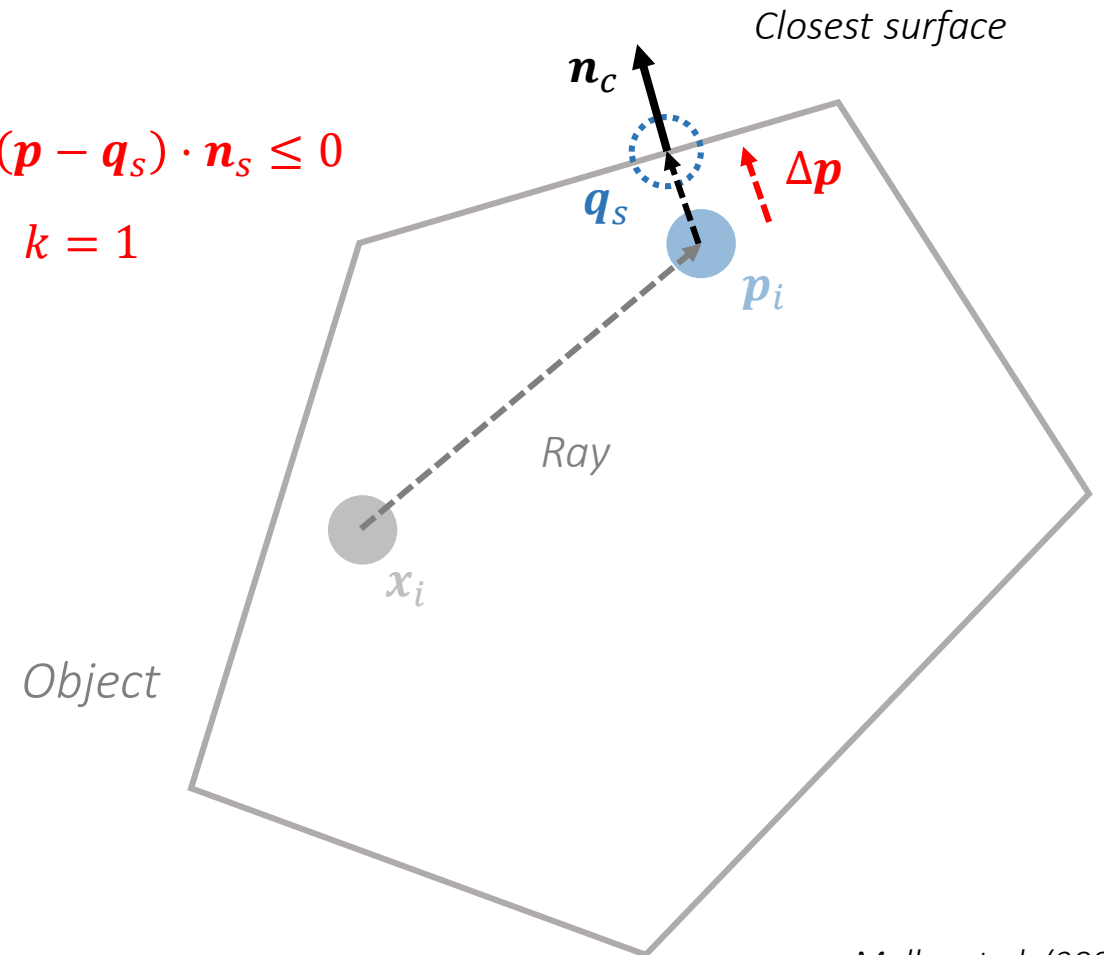
1-2 Static collision handling

Case 2 between dynamic objects

Case 1-2

$$C(\mathbf{p}) = (\mathbf{p} - \mathbf{q}_s) \cdot \mathbf{n}_s \leq 0$$

$k = 1$



Collision handling

Total number of
constraints $M + M_{coll}$

Collision constraint
(Generated every step)

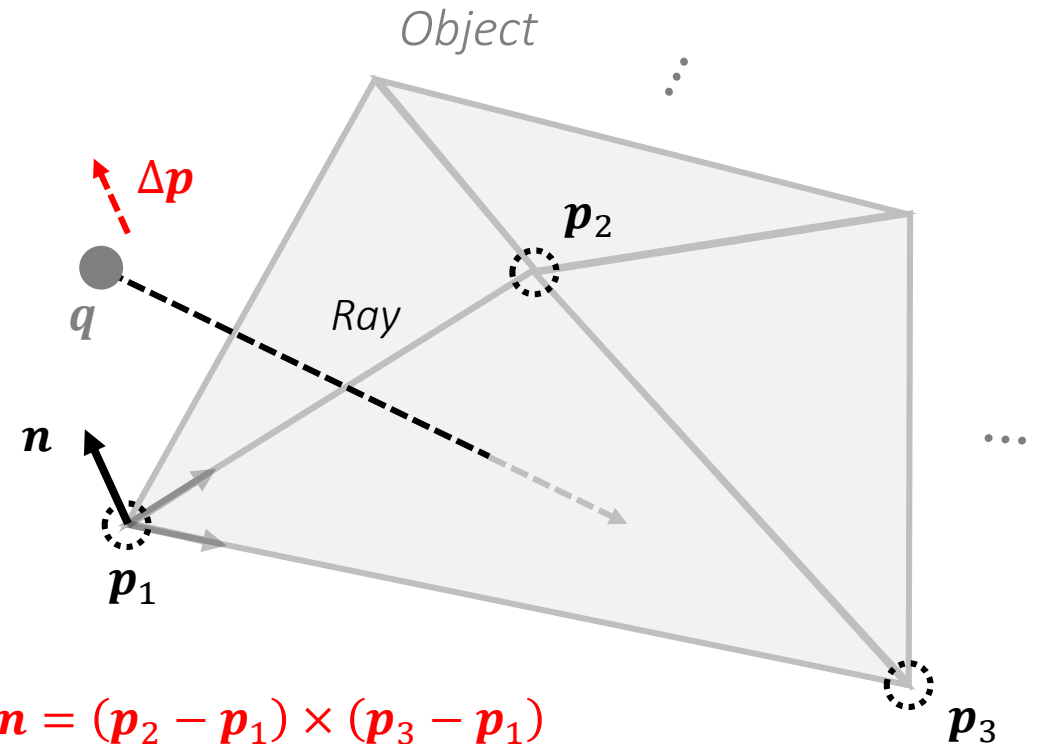
Case 1 with static objects

1-1 Continuous collision handling

1-2 Static collision handling

Case 2 between dynamic objects

Case 2

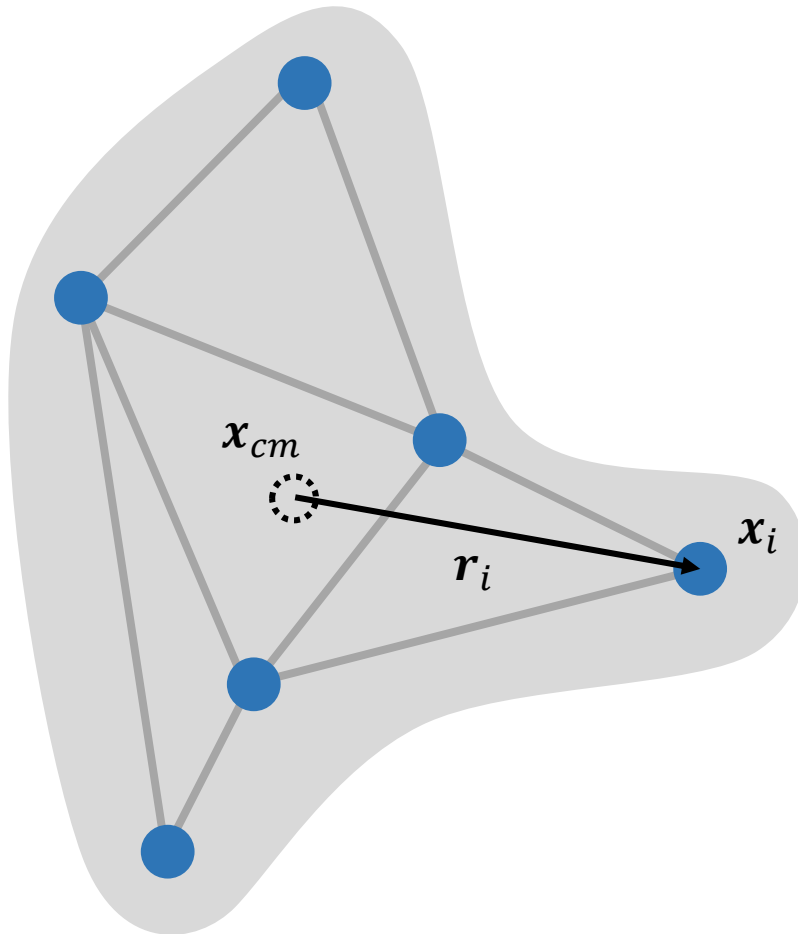


$$n = (p_2 - p_1) \times (p_3 - p_1)$$

$$C(q, p_1, p_2, p_3) = \pm(q - p_1) \cdot n \leq 0$$

Damping

$$I = ?$$



Skew-symmetric matrix

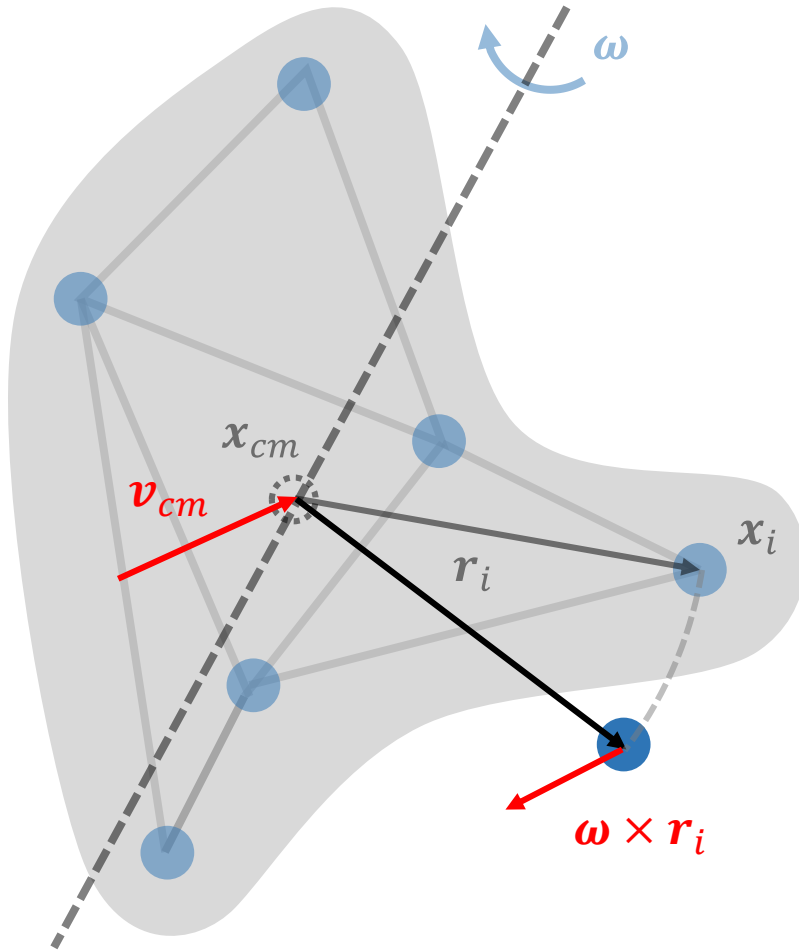
$$\tilde{\mathbf{r}}_i \mathbf{v} = \mathbf{r}_i \times \mathbf{v}$$

$$\mathbf{r}_i = (r_x, r_y, r_z)_i \quad \tilde{\mathbf{r}}_i = \begin{bmatrix} 0 & -r_z & r_y \\ r_z & 0 & -r_x \\ -r_y & r_x & 0 \end{bmatrix}_i$$

$$\tilde{\mathbf{r}}_i \tilde{\mathbf{r}}_i^T m_i = \begin{bmatrix} I_{xx} & I_{xy} & I_{xz} \\ I_{yx} & I_{yy} & I_{yz} \\ I_{zx} & I_{zy} & I_{zz} \end{bmatrix}_i = \mathbf{I}_i$$

$$\text{Inertia tensor} \quad \mathbf{I} = \sum_i \tilde{\mathbf{r}}_i \tilde{\mathbf{r}}_i^T m_i$$

Damping



$$I = \sum_i \tilde{r}_i \tilde{r}_i^T m_i \quad L = \sum_i r_i \times (m_i v_i)$$

$$\omega = I^{-1} L$$

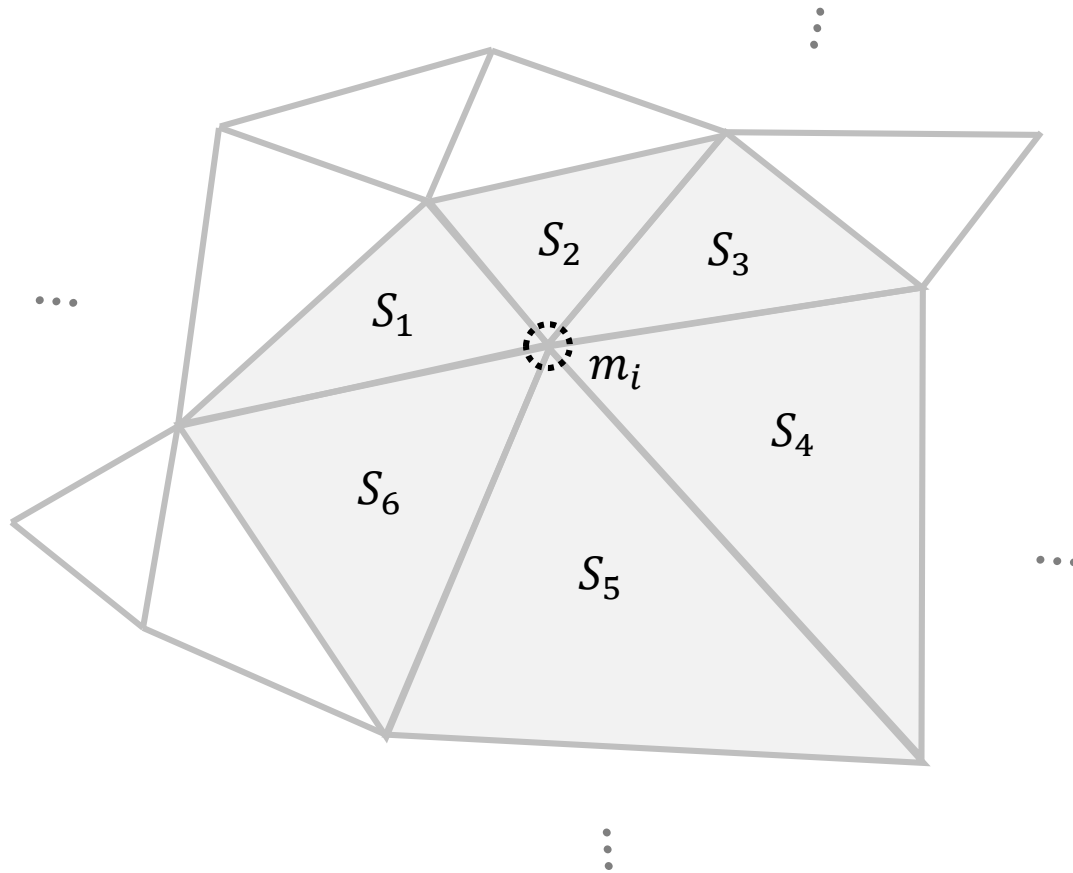
Global motion $v_{cm} + \omega \times r_i$

Damping for each i

$$\Delta v_i = v_{cm} + \omega \times r_i - v_i$$

$$v_i \leftarrow v_i + k_{damping} \Delta v_i$$

Cloth simulation

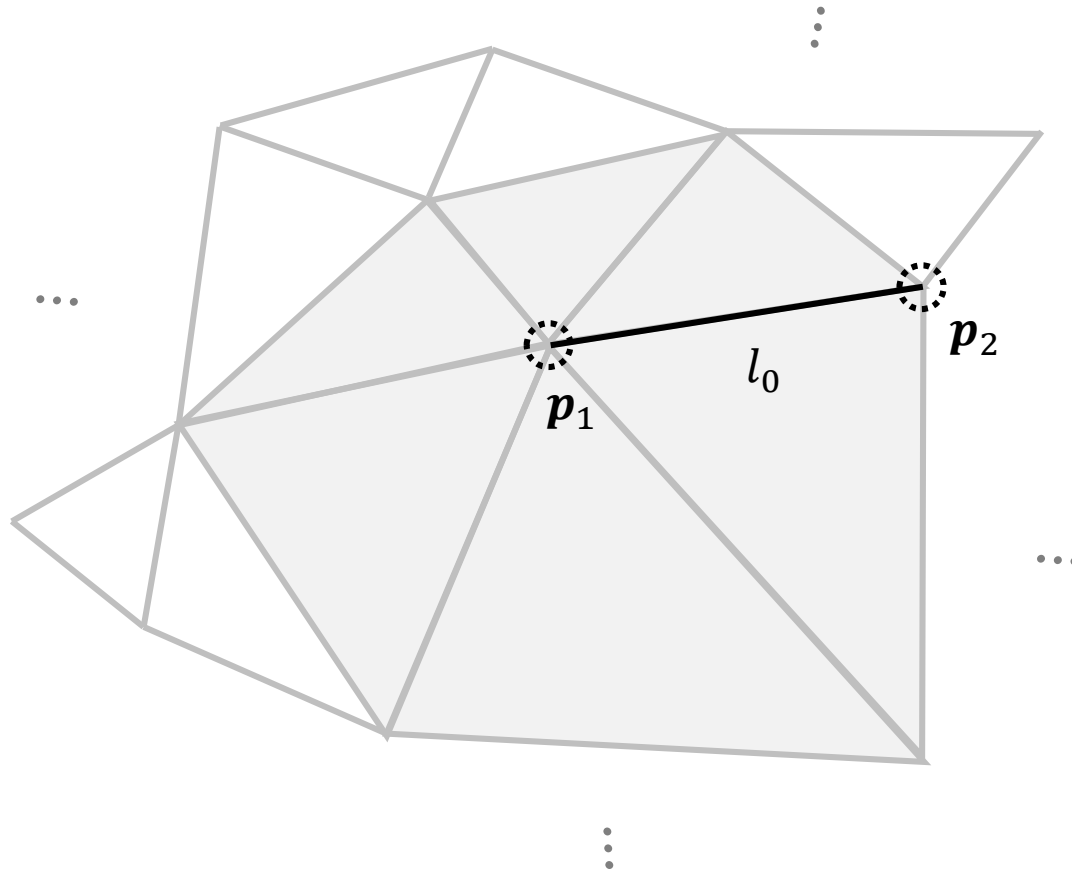


Point mass

Density ρ

$$m_i = \frac{1}{3} \sum_j \rho S_j$$

Cloth simulation

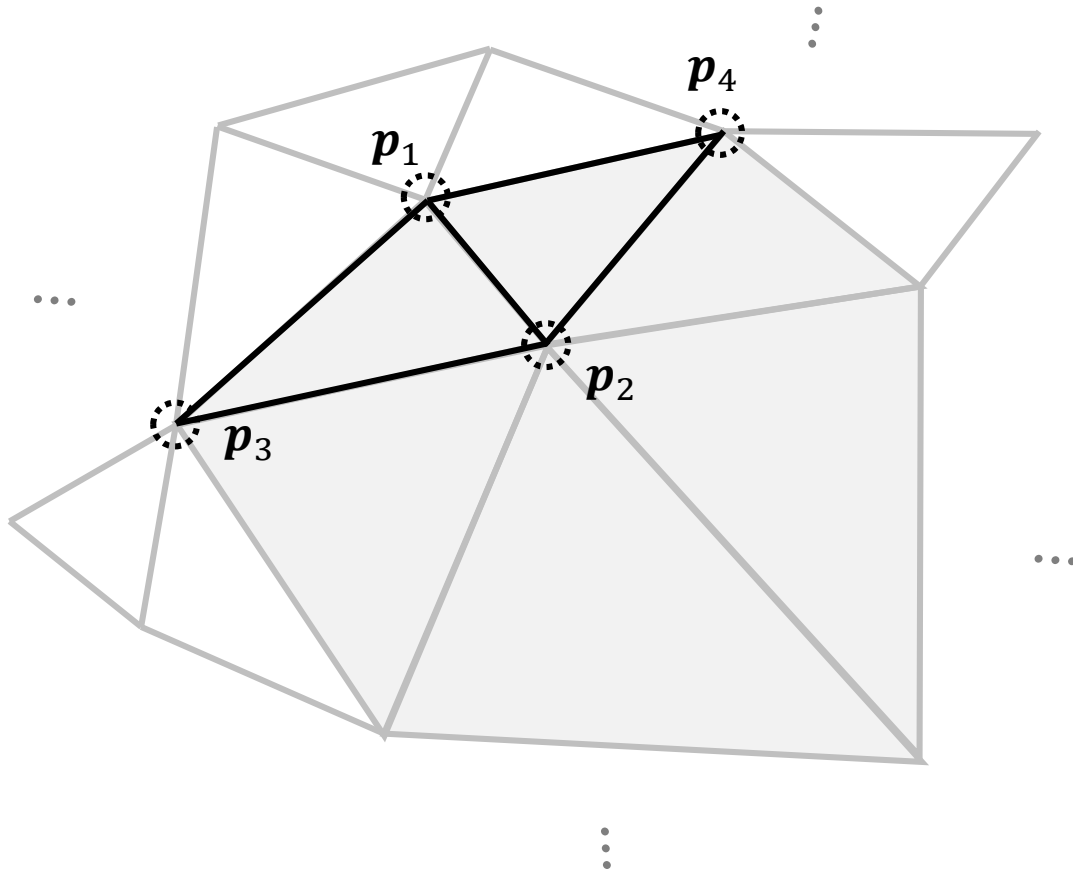


Stretching constraint
(Type equality)

$$C_{stretch}(\mathbf{p}_1, \mathbf{p}_2) = |\mathbf{p}_1 - \mathbf{p}_2| - l_0$$

$$0 \leq k_{stretch} \leq 1$$

Cloth simulation

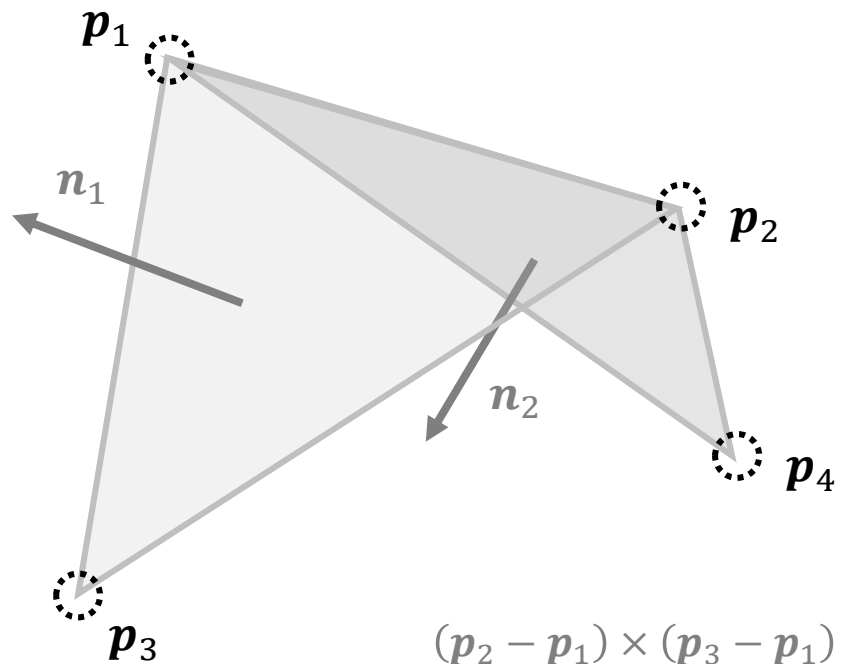


Bending constraint
(Type equality)

$$C_{bend}(\mathbf{p}_1, \mathbf{p}_2, \mathbf{p}_3, \mathbf{p}_4) \\ = \arccos \left(\frac{(\mathbf{p}_2 - \mathbf{p}_1) \times (\mathbf{p}_3 - \mathbf{p}_1)}{|(\mathbf{p}_2 - \mathbf{p}_1) \times (\mathbf{p}_3 - \mathbf{p}_1)|} \cdot \frac{(\mathbf{p}_2 - \mathbf{p}_1) \times (\mathbf{p}_4 - \mathbf{p}_1)}{|(\mathbf{p}_2 - \mathbf{p}_1) \times (\mathbf{p}_4 - \mathbf{p}_1)|} \right) - \varphi_0$$

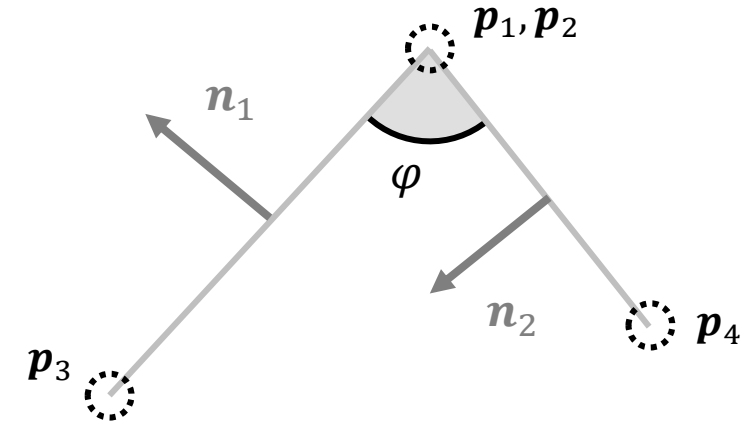
$$0 \leq k_{bend} \leq 1$$

Bending constraint



$$\mathbf{n}_1 = \frac{(\mathbf{p}_2 - \mathbf{p}_1) \times (\mathbf{p}_3 - \mathbf{p}_1)}{|(\mathbf{p}_2 - \mathbf{p}_1) \times (\mathbf{p}_3 - \mathbf{p}_1)|}$$

$$\mathbf{n}_2 = \frac{(\mathbf{p}_2 - \mathbf{p}_1) \times (\mathbf{p}_4 - \mathbf{p}_1)}{|(\mathbf{p}_2 - \mathbf{p}_1) \times (\mathbf{p}_4 - \mathbf{p}_1)|}$$

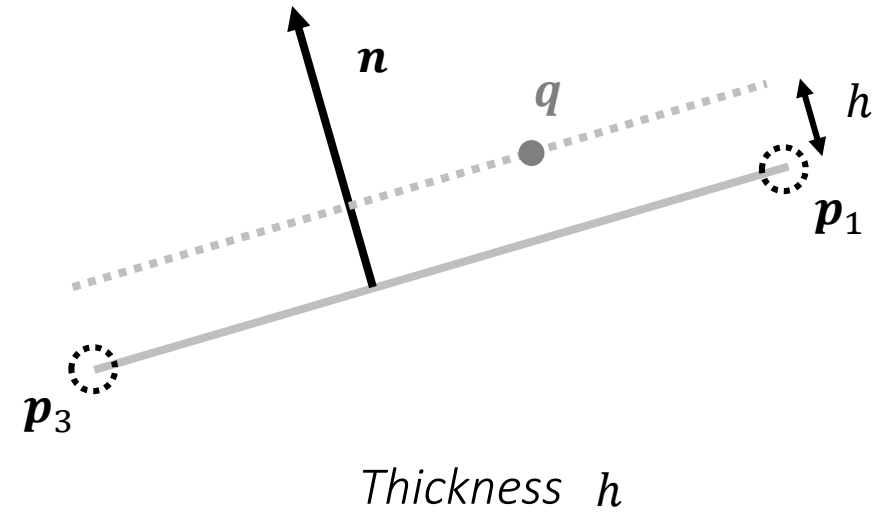
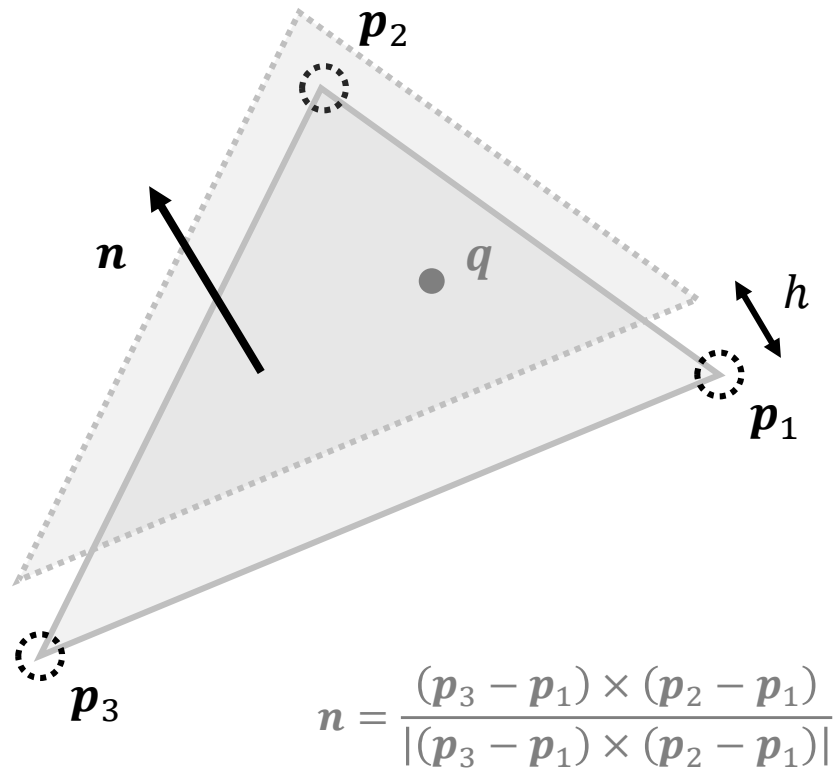


Dihedral angle φ

$$\mathbf{n}_1 \cdot \mathbf{n}_2 = \cos \varphi$$

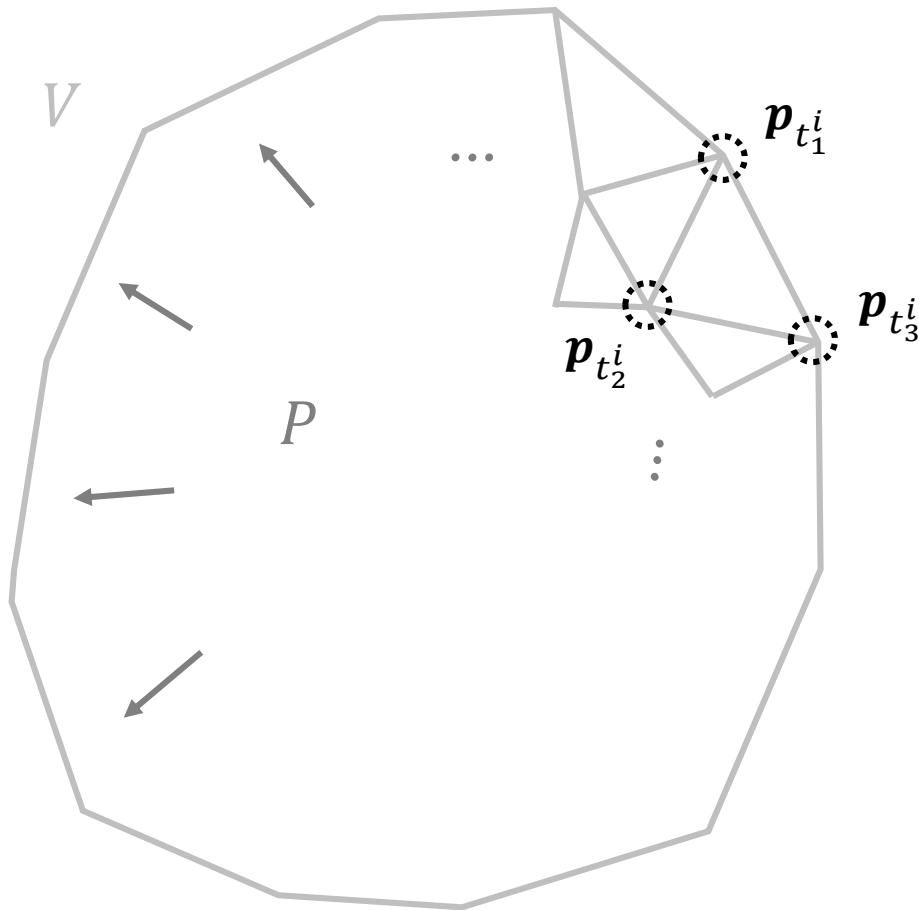
$$C_{bend} = \arccos(\mathbf{n}_1 \cdot \mathbf{n}_2) - \varphi_0$$

Self collision



$$\begin{aligned} C(q, p_1, p_2, p_3) &= (q - p_1) \cdot n - h \\ &= (q - p_1) \cdot \frac{(p_3 - p_1) \times (p_2 - p_1)}{|(p_3 - p_1) \times (p_2 - p_1)|} - h \end{aligned}$$

Cloth balloons



$$P \cdot V = \text{const}$$

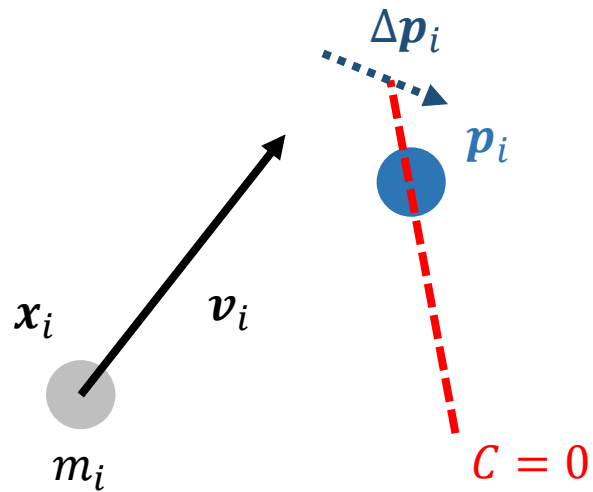
↓
Constant

Volume constraint
(Type equality)

Initial volume V_0

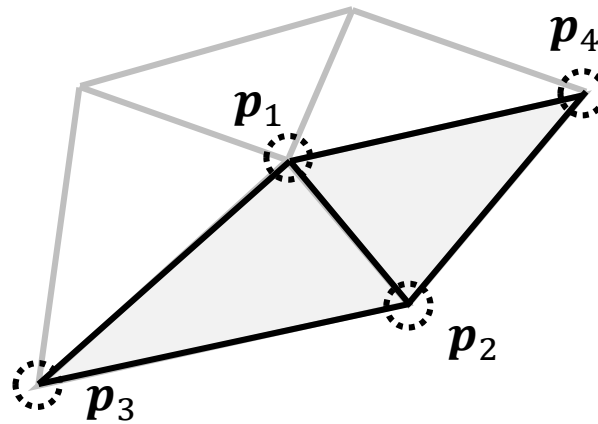
$$C(\mathbf{p}_1, \dots, \mathbf{p}_N) = \left(\sum_{i=1}^{n_{\text{triangles}}} (\mathbf{p}_{t_1^i} \times \mathbf{p}_{t_2^i}) \cdot \mathbf{p}_{t_3^i} \right) - k_{\text{pressure}} V_0$$

Summary



① Constraint function

② Iteration
$$\Delta \mathbf{p}_i = -\frac{n \cdot w_i}{\sum_j w_j} \frac{C(\mathbf{p}_1, \dots, \mathbf{p}_n)}{\sum_j |\nabla_{\mathbf{p}_j} C(\mathbf{p}_1, \dots, \mathbf{p}_n)|^2} \nabla_{\mathbf{p}_i} C(\mathbf{p}_1, \dots, \mathbf{p}_n)$$



③ Cloth simulation

$$C_{stretch}, C_{bend}, C_{collision}, \dots$$

$$C_{stretch}(\mathbf{p}_1, \mathbf{p}_2) = |\mathbf{p}_1 - \mathbf{p}_2| - l_0$$

$$C_{bend}(\mathbf{p}_1, \mathbf{p}_2, \mathbf{p}_3, \mathbf{p}_4) = \arccos(\mathbf{n}_1 \cdot \mathbf{n}_2) - \varphi_0$$

Implementation

Implementation

```

(1) forall vertices  $i$ 
(2)   initialize  $\mathbf{x}_i = \mathbf{x}_i^0$ ,  $\mathbf{v}_i = \mathbf{v}_i^0$ ,  $w_i = 1/m_i$ 
(3) endfor
(4) loop
(5)   forall vertices  $i$  do  $\mathbf{v}_i \leftarrow \mathbf{v}_i + \Delta t w_i \mathbf{f}_{\text{ext}}(\mathbf{x}_i)$ 
(6)   dampVelocities( $\mathbf{v}_1, \dots, \mathbf{v}_N$ )
(7)   forall vertices  $i$  do  $\mathbf{p}_i \leftarrow \mathbf{x}_i + \Delta t \mathbf{v}_i$ 
(8)   forall vertices  $i$  do
generateCollisionConstraints( $\mathbf{x}_i \rightarrow \mathbf{p}_i$ )
(9)   loop solverIterations times
(10)    projectConstraints( $C_1, \dots, C_{M+M_{\text{coll}}}, \mathbf{p}_1, \dots, \mathbf{p}_N$ )
(11)   endloop
(12)   forall vertices  $i$ 
(13)     $\mathbf{v}_i \leftarrow (\mathbf{p}_i - \mathbf{x}_i) / \Delta t$ 
(14)     $\mathbf{x}_i \leftarrow \mathbf{p}_i$ 
(15)   endfor
(16)   velocityUpdate( $\mathbf{v}_1, \dots, \mathbf{v}_N$ )
(17) endloop

```



```

void ClothSimulator::updatePBD() {
    explicitEuler();
    for (int n = 0; n < itr; n++) {
        calDistanceConstraint();
        calBendingConstraint();
    }
    integrationForPBD();
}

```

Implementation

```
void ClothSimulator::calDistanceConstraint() {  
    for (int i = 0; i < nE; i++) {  
        Vector3d p1 = pred_pos[edges[i][0]];  
        Vector3d p2 = pred_pos[edges[i][1]];  
        Vector3d n = (p1 - p2) / (p1 - p2).norm();  
  
        double w1 = inv_mass[edges[i][0]];  
        double w2 = inv_mass[edges[i][1]];  
        double C = (p1 - p2).norm() - restLengthsOfBending[i];  
  
        Vector3d dp1 = -(w1 / (w1 + w2)) * C * n;  
        Vector3d dp2 = (w2 / (w1 + w2)) * C * n;  
  
        pred_pos[edges[i][0]] += dp1;  
        pred_pos[edges[i][1]] += dp2;  
    }  
}
```

Implementation

```
void ClothSimulator::calBendingConstraint() {
    for (int i = 0; i < bendingElementIdx.size() / 6; i++) {
        int idx1 = bendingElementIdx[6 * i + 3];
        int idx2 = bendingElementIdx[6 * i + 2];
        int idx3 = bendingElementIdx[6 * i + 0];
        int idx4 = bendingElementIdx[6 * i + 1];

        Vector3d p2 = pred_pos[idx2] - pred_pos[idx1];
        Vector3d p3 = pred_pos[idx3] - pred_pos[idx1];
        Vector3d p4 = pred_pos[idx4] - pred_pos[idx1];
        Vector3d n1 = cross(p2, p3) / cross(p2, p3).norm();
        Vector3d n2 = cross(p2, p4) / cross(p2, p4).norm();
        double d = dot(n1, n2);
        if (d < -1) d = -1;

        Vector3d q3 = (cross(p2, n2) + cross(n1, p2) * d) / cross(p2, p3).norm();
        Vector3d q4 = (cross(p2, n1) + cross(n2, p2) * d) / cross(p2, p4).norm();
        Vector3d q2 = - (cross(p3, n2) + cross(n1, p3) * d) / cross(p2, p3).norm() - (cross(p4, n1) + cross(n2, p4) * d) / cross(p2, p4).norm();
        Vector3d q1 = - q2 - q3 - q4;

        double w1 = inv_mass[idx1];
        double w2 = inv_mass[idx2];
        double w3 = inv_mass[idx3];
        double w4 = inv_mass[idx4];

        double s = 4 / (w1 + w2 + w3 + w4);
        double dp = - s * sqrt(1 - d * d) * (acos(d) - restAngles[i]) / (q1.norm() + q2.norm() + q3.norm() + q4.norm());

        pred_pos[idx1] += dp * w1 * q1;
        pred_pos[idx2] += dp * w2 * q2;
        pred_pos[idx3] += dp * w3 * q3;
        pred_pos[idx4] += dp * w4 * q4;
    }
}
```

Implementation

