Rigid Bodies and Contacts

Yanzhe Yang Feb 26, 2020

Rigid bodies and contacts

• Particle: State $Y = \begin{pmatrix} x \\ v \end{pmatrix}$, State Derivative $\frac{d}{dt}Y = \frac{d}{dt}\begin{pmatrix} x \\ v \end{pmatrix} = \begin{pmatrix} v \\ F/m \end{pmatrix}$ $x(t) \quad v(t)$

Rigid bodies and contacts

• Particle: State
$$Y = \begin{pmatrix} x \\ v \end{pmatrix}$$
, State Derivative $\frac{d}{dt}Y = \frac{d}{dt}\begin{pmatrix} x \\ v \end{pmatrix} = \begin{pmatrix} v \\ F/m \end{pmatrix}$
 $x(t) \quad v(t)$

• Rigid body: State
$$Y = \begin{pmatrix} x \\ R \\ mv \\ Iw \end{pmatrix}$$
, State Derivative $\frac{d}{dt}Y = \frac{d}{dt}\begin{pmatrix} x \\ R \\ mv \\ Iw \end{pmatrix} = \begin{pmatrix} v \\ w \times R \\ F \\ \tau \end{pmatrix}$



<i>R</i> :	rotation matrix
<i>mv</i> :	linear momentum
Iw:	angular momentum

Rigid bodies and contacts





Image source: <u>https://noobtuts.com/unity/2d-angry-birds-game</u> <u>https://giphy.com/explore/walking-in-the-snow</u>

Today's topic:

How to simulate contacts for rigid bodies?

Example: ball falling

Reference: Andrew Witkin and David Baraff, Physically Based Modeling: Principles and Practice, Online SIGGRAPH 1997 Course Notes, 1997 https://www.cs.cmu.edu/~baraff/sigcourse/

Soft collision





Reference: Andrew Witkin and David Baraff, Physically Based Modeling: Principles and Practice, Online SIGGRAPH 1997 Course Notes, 1997 https://www.cs.cmu.edu/~baraff/sigcourse/

Rigid body collision





Discontinuity

Reference: Andrew Witkin and David Baraff, Physically Based Modeling: Principles and Practice, Online SIGGRAPH 1997 Course Notes, 1997 https://www.cs.cmu.edu/~baraff/sigcourse/

A typical simulation loop







When and where collision happens?





When and where collision happens? How to compute impulses?

Outline

- Collision detection basics
- Computing impulses using a coefficient of restitution
- Penalty based method
- Constraint based method
- Recent work

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Collision detection basics

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- Penalty based method
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Finding the collision time by backtracking

• Bisection method.

If we know collision time t_c happens within $[t_0, t_0 + \Delta t)$, then check $t_0 + \Delta t/2$



(inter-penetration detected)

Finding the collision time by backtracking

• Bisection method.

If we know collision time t_c happens within $[t_0, t_0 + \Delta t)$, then check $t_0 + \Delta t/2$

• Easy to implement and quite robust, but a little slow. Faster convergence could be achieved using the *regula falsi* (false position) method

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• Easy to implement and quite robust, but a little slow. Faster convergence could be achieved using the *regula falsi* (false position) method

• t_c is not always needed (discuss in penalty-based method)

Detecting collision points

• If a separating plane is found, no inter-penetrating.



Detecting collision points: separating plane

• Exhaustive search for a separating plane considering two rigid bodies



A separating plane either contains <u>a face</u> of one of the convex polyhedral or contains <u>an edge</u> from one convex polyhedral and is parallel to an edge of the other convex polyhedral

Reference: David Baraff. Analytical Methods for Dynamic Simulation of Non-penetrating Rigid Bodies. SIGGRAPH 1989 https://www.cs.cmu.edu/~baraff/papers/sig89.pdf

Detecting collision points: defining face/edge

• The face/edge that is contained in the separating plane is called *defining* face/edge



Detecting collision points: subsequent time steps

• For subsequent time steps, we will still use the defining face/edge to define a separating plane until it no longer does so.



Reference: David Baraff. Analytical Methods for Dynamic Simulation of Non-penetrating Rigid Bodies. SIGGRAPH 1989 https://www.cs.cmu.edu/~baraff/papers/sig89.pdf

Separating axis theorem (SAT)

• Exhaustive search for projection gap in normal axes



Separating axis theorem (SAT): axes

• In 2d cases, axes could be obtained using the unique normal of edges



Separating axis theorem (SAT): projection gap

- If there is a gap in projection region, there is no inter-penetration/collision
- Vertex projection can be computed using dot production



Separating axis theorem (SAT): 3d case

- If there is a gap in projection region, there is no inter-penetration/collision
- Vertex projection can be computed using dot production
- In 3d case, axes are normal of faces or the cross product of two edges (one from each object)

Collision detection is only done when bounding boxes overlap

• Naïve algorithm $O(n^2)$

Collision detection is only done when bounding boxes overlap

- Naïve algorithm $O(n^2)$
- Sweep/sort algorithm $O(n \log n + k)$



Reference: David Baraff. Analytical Methods for Dynamic Simulation of Non-penetrating Rigid Bodies. SIGGRAPH 1989 https://www.cs.cmu.edu/~baraff/papers/sig89.pdf





When and where collision happens?

Questions



When and where collision happens? How to resolve the collision? (How to compute impulses or contact forces?)

Outline

- Collision detection basics
- Computing impulses using a coefficient of restitution
- Penalty based method
 Constraint based method
- Recent work

A simple example of collision



For rigid bodies, $p_a(t_0) = x_a(t_0) + R_a(t_0)r_a$ r_a is a vector from center of mass to collision point

•
$$v_{rel}^+ = -\epsilon v_{rel}^-$$
, $0 \le \epsilon \le 1$

•
$$v_{rel}^+ = \hat{n}(t_0)(\dot{p_a}^+(t_0) - \dot{p_b}^+(t_0))$$



What is the impulse in this process?



Solve $J = j\hat{n}(t_0)$, given newton's law on restitution $v_a^+(t_0) = v_a^-(t_0) + j\hat{n}(t_0)/m_a$ and rigid body dynamics

Solving
$$J = j\hat{n}(t_0)$$

$$v_{rel}^{+} = \hat{n}(t_0) \left(\dot{p_a}^{+}(t_0) - \dot{p_b}^{+}(t_0) \right) = -\epsilon v_{rel}^{-}$$

Solving
$$J = j\hat{n}(t_0)$$

$$v_{rel}^{+} = \hat{n}(t_0) \left(\dot{p_a}^{+}(t_0) - \dot{p_b}^{+}(t_0) \right) = -\epsilon v_{rel}^{-}$$

$$\dot{p_a}^{+}(t_0) = v_a^{+}(t_0) + w_a^{+}(t_0) \times r_a$$

$$v_a^{+}(t_0) = v_a^{-}(t_0) + j\hat{n}(t_0)/m_a$$

$$w_a^{+}(t_0) = w_a^{-}(t_0) + I_a^{-1}(t_0)(r_a \times j \hat{n}(t_0))$$

$$\Rightarrow \dot{p_a}^{+}(t_0) = \dot{p_a}^{-}(t_0) + j(\frac{\hat{n}(t_0)}{m_a} + I_a^{-1}(t_0)(r_a \times \hat{n}(t_0)) \times r_a$$

Rigid body dynamics for a

Solving
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Rigid body dynamics for a

Similarly,

$$\dot{p}_{b}^{+}(t_{0}) = \dot{p}_{b}^{-}(t_{0}) - j(\frac{\hat{n}(t_{0})}{m_{b}} + I_{b}^{-1}(t_{0})(r_{b} \times \hat{n}(t_{0})) \times r_{b}$$

Rigid body dynamics for b

Solving
$$J = j\hat{n}(t_0)$$

$$j = \frac{-(1+\epsilon)v_{rel}^{-1}}{\frac{1}{m_a} + \frac{1}{m_b} + \hat{n}(t_0) \cdot z_a + \hat{n}(t_0) \cdot z_b}$$

$$z_a = (I_a^{-1}(t_0)(r_a \times \hat{n}(t_0))) \times r_a$$

$$z_b = (I_b^{-1}(t_0)(r_b \times \hat{n}(t_0))) \times r_b$$

Reference: David Baraff.Analytical Methods for Dynamic Simulation of Non-penetrating Rigid Bodies. SIGGRAPH 1989 https://www.cs.cmu.edu/~baraff/papers/sig89.pdf
Impulse-based dynamic simulation in linear time



Reference: Jan Bender. Impulse-based dynamic simulation in linear time. Computer Animation and Virtual Worlds. 2007

Impulse-based methods: summary

• Newton's law of restitution: $v_{rel}^+ = -\epsilon v_{rel}^-$, $0 \le \epsilon \le 1$

•
$$j = \frac{-(1+\epsilon)v_{rel}^{-}}{\frac{1}{m_a} + \frac{1}{m_b} + \hat{n}(t_0) \cdot (I_a^{-1}(t_0)(r_a \times \hat{n}(t_0) \)) \times r_a + \hat{n}(t_0) \cdot (I_b^{-1}(t_0)(r_b \times \hat{n}(t_0) \)) \times r_b}$$
$$J = j\hat{n}(t_0)$$

• Impulses often applied in **local** contact resolution scheme



Reference:

James K. Hahn. Realistic animation of rigid bodies. Computer Graphics, Volume 22, Number 4, August 1988 Rick Parent. Compute Animation: Algorithm and Technique. Chapter 7.4 Brian Vincent Mirtich. Impulse-based Dynamic Simulation of Rigid Body Systems. PhD thesis, Fall 1996

Outline

- Collision detection basics
- Computing impulses using a coefficient of restitution
- Penalty based methodConstraint based method
- Recent work

- Force based

Prevent penetration using a spring

- A spring with zero resting length is attached to prevent interpenetration.
- t_c is not needed



Control parameter m, k_p

• $F = -k_p d$, a = F/m. Here m, k_p are control parameter for the collision simulation



Control parameter m, k_p, k_d

• $F = -\frac{d(k_p - k_d v_n)}{n_c}$. Here, v_n is the normal velocity and n_c is the number of contact

points.



Penalty based methods: convex polyhedral

- The penalty force will give rise to torque when not acting in line with the center of mass of an object
- The spring is attached to both objects and imparts an equal but opposite force on the two to restore nonpenetration.



Reference: Rick Parent. Compute Animation: Algorithm and Technique. Chapter 7.4

Pros:

- Easy to incorporate with other forces like gravity
- Scales well with the complexity of the scene

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- Scales well with the complexity of the scene

Cons:

- Need to specify control parameters in a trial-and-error process
- Unclear in determining where contact between objects should break

Reference: Rick Parent. Compute Animation: Algorithm and Technique. Chapter 7.4 Katsu Yamane and Yoshihiko Nakamura. Stable Penalty-based Model of Frictional Contacts. ICRA 2006

Pros:

- Easy to incorporate with other forces like gravity
- Scales well with the complexity of the scene

There are advanced work to do it right

Cons:

- Need to specify control parameters in a trial-and-error process
- Unclear in determining where contact between objects should break

Implicit Multibody Penalty-Based Distributed Contact

Hongyi Xu, Member, IEEE, Yili Zhao, Member, IEEE, and Jernej Barbič, Member, IEEE



EEE TRANSACTIONS ON VISUALIZATION AND COMPUTER GRAPHICS, VOL. 20, NO. 9, SEPTEMBER 2014

Implicit Multibody Penalty-Based Distributed Contact

Hongyi Xu, Member, IEEE, Yili Zhao, Member, IEEE, and Jernej Barbič, Member, IEEE



It addressed the stability problems due to the **highly variable and unpredictable net stiffness** by employing exact analytical contact gradients, symbolic Gaussian elimination, SVD solver, and semi-implicit integration.

Comparison to Bullet Physics

Stable Penalty-Based Model of Frictional Contacts

Katsu Yamane and Yoshihiko Nakamura Department of Mechano-Informatics, University of Tokyo 7-3-1 Hongo, Bunkyo-ku, Tokyo 113-8656 Japan yamane@ynl.t.u-tokyo.ac.jp



Proceedings of the 2006 IEEE International Conference on Robotics and Automation Orlando, Florida - May 2006

Stable Penalty-Based Model of Frictional Contacts

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• It solves the problems in implementing Coulomb's friction model, i.e. how to handle static/dynamic friction forces.

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Constraint based method

• Computes constraint forces that are designed to exactly cancel any external accelerations that would result in interpenetration



Reference: David Baraff. Non-penetrating Rigid Body Simulation. Eurographics 1993 State of the Art Reports. <u>https://www.cs.cmu.edu/~baraff/papers/eg93.pdf</u>

A simple example of equality constraint



•
$$C(x) = \frac{1}{2}(x \cdot x - l^2)$$

•
$$C(x) = 0$$

• In addition,
$$C(x) = 0$$
, $C(x) = 0$

Reference: <u>https://www.toptal.com/game/video-game-physics-part-iii-constrained-rigid-body-simulation</u>

- x x x
- From equality constraints, we have

$$C(x) = \frac{1}{2}(x \cdot x - l^{2}) = 0 \quad [1]$$

$$C(x) = x \cdot \dot{x} = 0 \quad [2]$$

$$C(x) = \ddot{x} \cdot x + \dot{x} \cdot \dot{x} = 0 \quad [3]$$

• From newton's 2nd law: $\ddot{p} = (f_{ext} + f_C)/m$ [4]



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- From [3][4], we can derive $f_C \cdot x = -f_{ext} \cdot x m \dot{x} \cdot \dot{x}$ [5]



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- Additional condition: $f_C \cdot \dot{x} = 0$ [6]
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- From [2][6], we can get $f_C = \lambda x$ [7]
- From [5][7], we can obtain $\lambda = \frac{-f_{ext} \cdot x m\dot{x} \cdot \dot{x}}{x \cdot x}$

- λ is also known as Lagrange multiplier
- For any constraints, the calculation involves determining the direction of force and its magnitude λ
- For rigid bodies, $JM^{-1}J^T\lambda = -\dot{J}\dot{q} JM^{-1}F_{ext}$

Here, q is a state vector for position and rotation, M is a matrix of mass and inertia, J is the Jacobian matrix of constraints

A simple example of inequality constraint



• A and B are colliding

•
$$R(\alpha_B) = \begin{bmatrix} \cos \alpha_B & -\sin \alpha_B \\ \sin \alpha_B & \cos \alpha_B \end{bmatrix}$$

Reference: https://www.toptal.com/game/video-game-physics-part-iii-constrained-rigid-body-simulation

A simple example of inequality constraint



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•
$$R(\alpha_B) = \begin{bmatrix} \cos \alpha_B & -\sin \alpha_B \\ \sin \alpha_B & \cos \alpha_B \end{bmatrix}$$

- $C(x_B, \alpha_B, x_A, \alpha_A) = (x_B + R(\alpha_B)r_B) (x_A + R(\alpha_A)r_A)$
- $n^T C(x_B, \alpha_B, x_A, \alpha_A) \ge 0$ (i.e. penetration depth is positive)

Reference: https://www.toptal.com/game/video-game-physics-part-iii-constrained-rigid-body-simulation

Constraint forces to avoid penetration

- Normal of surface $\nabla C(x(t))$
- $F_c(t) = \lambda(t) \nabla C(x(t))$, where $\lambda(t)$ is a scalar. $\lambda(t) \ge 0$ so that the force will only push not pull the two objects



Reference: David Baraff. Non-penetrating Rigid Body Simulation. Eurographics 1993 State of the Art Reports. <u>https://www.cs.cmu.edu/~baraff/papers/eg93.pdf</u>

Formulate as Linear Complementarity Problem (LCP)

- The constraint problem could be formulated as an LCP problem
- Given a real matrix M and vector q, the linear complementarity problem LCP(M, q) seeks vectors z and w which satisfy the following constraints:

$$w, z \ge 0$$
$$z^T w = 0$$
$$w = Mz + q$$

Resting contact

• Body separating (no response required)

 $v_{rel} > \epsilon$

• Colliding contact

 $v_{rel} < -\epsilon$

• Resting contact

 $-\epsilon < v_{rel} < \epsilon$

Resting constraint forces properties

- Prevent interpenetration $\ddot{d}_i(t_0) \ge 0$
- Repulsive normal force: $f_N(t) \ge 0$
- Normal force is zero when bodies start to separate: $f_i \ddot{d}_i(t_0) = 0$

Linear Complementarity Problem (LCP)

•
$$\ddot{d}_i(t_0) = a_{i1}f_1 + a_{i2}f_2 + \dots + a_{in}f_n + b_i$$

$$\begin{pmatrix} \ddot{d}_1(t_0) \\ \vdots \\ \ddot{d}_n(t_0) \end{pmatrix} = A \begin{pmatrix} f_1 \\ \vdots \\ f_n \end{pmatrix} + \begin{pmatrix} b_1 \\ \vdots \\ b_n \end{pmatrix}$$

 $\begin{cases} \ddot{d}_i(t_0) \ge 0 & \text{Prevent interpenetration} \\ f_i \ge 0 & \text{Repulsive} \\ f_i \ddot{d}_i(t_0) = 0 & \text{Is zero when bodies are starting to come apart} \end{cases}$

Refernce: http://www.cs.unc.edu/~lin/COMP768-F07/LEC/rbd2.pdf

Solving Linear Complementarity Problem (LCP)

- Pivoting algorithms (like Gaussian elimination)
 - Need read and write access to matrices
 - Do not provide useful intermediate results
 - May exploit sparsity well
- Iterative algorithms (like Conjugate gradients)
 - Only need read access to matrices
 - Can stop early for approximation
 - Faster for large matrices
 - Can be warm started (i.e. from previous results)

Constraint-based methods: summary

- Computes constraint forces that are designed to exactly cancel any external accelerations that would result in interpenetration
- Useful when the scene is composed of relatively small number of objects with simple shape
- Does not scale well with the complexity of the scene (the penalty based method scales well with the complexity of the scene)

Outline

- Collision detection basics
- Computing impulses using a coefficient of restitution
- Penalty based method
- Constraint based method
- Recent work

SIGGRAPH'22 Course: Contact and Friction Simulation for Computer Graphics

Changelog



Sheldon Andrews¹

¹École de technologie supérieure

Kenny Erleben² ²University of Copenhagen Zachary Ferguson³ ³New York University

This course covers fundamental topics on the nature of contact modeling and simulation for computer graphics. Specifically, we provide mathematical details about formulating contact as a complementarity problem in rigid body and soft body animations. We briefly cover several approaches for contact generation using discrete collision detection. Then, we present a range of numerical techniques for solving the associated LCPs and NCPs. The advantages and disadvantages of each technique are further discussed in a practical manner, and best practices for implementation are discussed. Finally, we conclude the course with several advanced topics such as methods for soft body contact problems, barrier functions, and anisotropic friction modeling. Programming examples are provided in our appendix as well as on the course website to accompany the course notes.

Updated for SIGGRAPH '22: This version of the course adds coverage of multivariate continuous collision detection, an extended treatment of penalty-based methods to include barrier methods, a new chapter on implicit time integration schemes and methods for solving soft body contact problems has been added. Additionally, we now include a more in-depth coverage of anisotropic friction simulation, as well as a tutorial that guides the reader through the steps of creating a rigid body simulator with frictional contact

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Incremental Potential Contact (SIGGRAPH 2020)



Rigid IPC (SIGGRAPH 2021)

Intersection-free Rigid Body Dynamics

Zachary Ferguson¹ Teseo Schneider^{1,4} Timothy Langlois⁵ Denis Zorin¹ Daniele Panozzo¹

UCLA

NYU

Minchen Li^{2,3} Francisca Gil-Ureta¹ Chenfanfu Jiang^{2,3} Danny M. Kaufman⁶



Adobe

Affine Body Dynamics (SIGGRAPH 2022)



Affine Body Dynamics:

Fast, Stable, and Intersection-free Simulation of Stiff Materials

Lei Lan¹², Danny M. Kaufman³, Minchen Li¹³, Chenfanfu Jiang¹⁵, Yin Yang¹²⁵



Minchen Li



 Will give a talk here at CMU March 13, 3pm











Reconfigurable Data Glove for Reconstructing Physical and Virtual GraspsHangxin Liu, Zeyu Zhang, Ziyuan Jiao, Zhenliang Zhang, Minchen Li, Chenfanfu Jiang, Yixin Zhu, Song-Chun ZhuEngineering, 2023PaperProject Page

TPA-Net: Generate A Dataset for Text to Physics-based AnimationYuxing Qiu, Feng Gao, Minchen Li, Govind Thattai, Yin Yang, Chenfanfu JiangArxiv 2211.13887PreprintGallery

A Sparse Distributed Gigascale Resolution Material Point Method Yuxing Qiu, Samuel T. Reeve, Minchen Li, Yin Yang, Stuart R. Slattery, Chenfanfu Jiang ACM Transactions on Graphics, 2022 (presentation at SIGGRAPH) Paper

PlasticityNet: Learning to Simulate Metal, Sand, and Snow for Optimization Time Integration Xuan Li, Yadi Cao, Minchen Li, Yin Yang, Craig Schroeder, Chenfanfu Jiang Neural Information Processing Systems (NIPS), 2022 Paper Video

Bi-Stride Multi-Scale Graph Neural Network for Mesh-Based Physical Simulation Yadi Cao, Menglei Chai, **Minchen Li**, Chenfanfu Jiang

Arxiv 2210.02573 Preprint

Midas: A Multi-Joint Robotics Simulator with Intersection-Free Frictional Contact Yunuo Chen, Minchen Li, Wenlong Lu, Chuyuan Fu, Chenfanfu Jiang Arxiv 2210.00130 Preprint

Summary

- Collision detection
 - backtracking t_c ,
 - determining interpenetration using separation plane
 - determining interpeneration using separating axis theorem (SAT)
- Impulse based method. Computing impulse based on restitution coefficient ϵ

- Force based

Penalty based method
Constraint based method

References

- David Baraff. Analytical Methods for Dynamic Simulation of Non-penetrating Rigid Bodies. SIGGRAPH 1989 <u>https://www.cs.cmu.edu/~baraff/papers/sig89.pdf</u>
- Andrew Witkin and David Baraff, Physically Based Modeling: Principles and Practice, Online SIGGRAPH 1997 Course Notes <u>https://www.cs.cmu.edu/~baraff/sigcourse/</u>
- David Baraff. Non-penetrating Rigid Body Simulation. Eurographics 1993 State of the Art Reports. <u>https://www.cs.cmu.edu/~baraff/papers/eg93.pdf</u>
- Rick Parent. Compute Animation: Algorithm and Technique. Chapter 7.4 2012
- Katsu Yamane and Yoshihiko Nakamura. Stable Penalty-based Model of Frictional Contacts. ICRA 2006 <u>https://ieeexplore.ieee.org/document/1641984</u>
- UNC COMP768 Physically-Based Modeling, Simulation and Animation, Course Slides. Ming C. Lin 2007
- Crispin Deul, Patrick Charrier, Jan Bender. Position-Based Rigid Body Dynamics. Computer Animation and Virtual Worlds 2014
- Jan Bender, Matthias Müller and Miles Macklin, A Survey on Position Based Dynamics, 2017, In Tutorial Proceedings of Eurographics, 2017