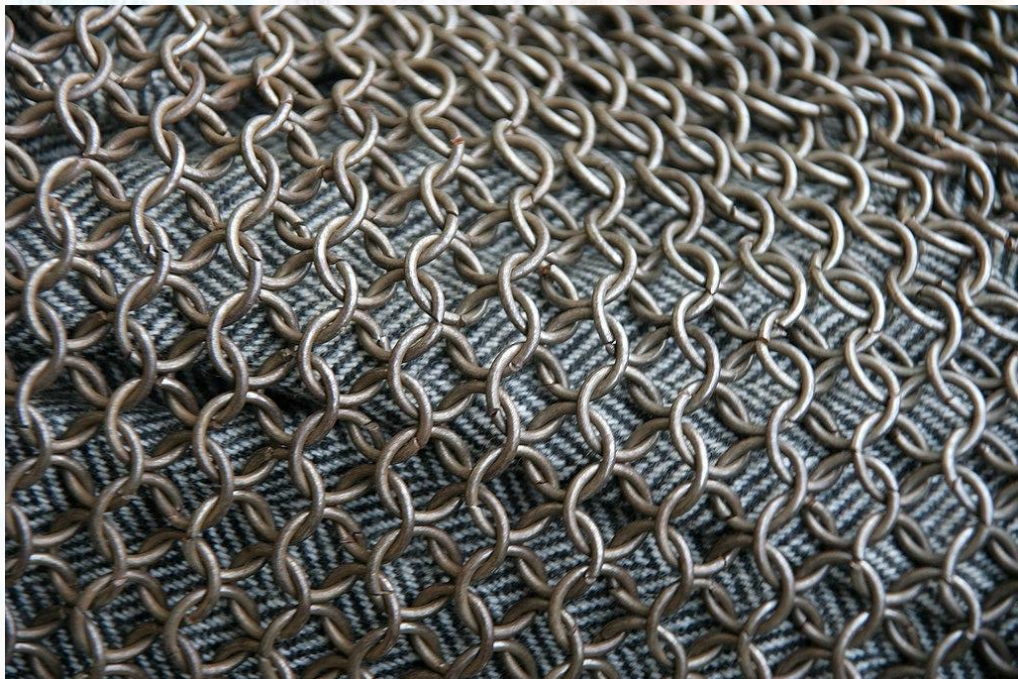


CSCI 4530/6530 Advanced Computer Graphics

<https://www.cs.rpi.edu/~cutler/classes/advancedgraphics/S25/>

Lecture 6: Mass-Spring Systems



https://simple.wikipedia.org/wiki/File:Roman_chainmail_detail.jpg

High Fashion in Equations



*MIRALab,
University of Geneva,
SIGGRAPH 2007*



Simulating Knitted Cloth at the Yarn Level

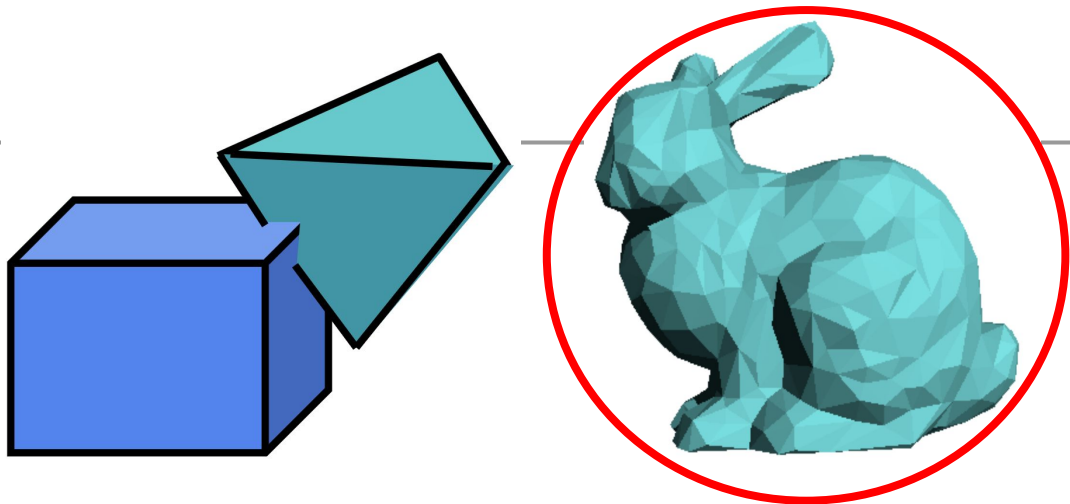


Kaldor, James, & Marshner, SIGGRAPH 2008

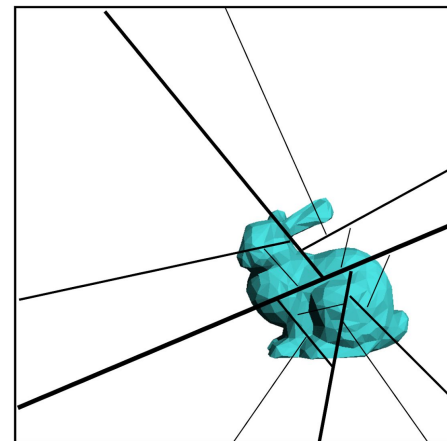
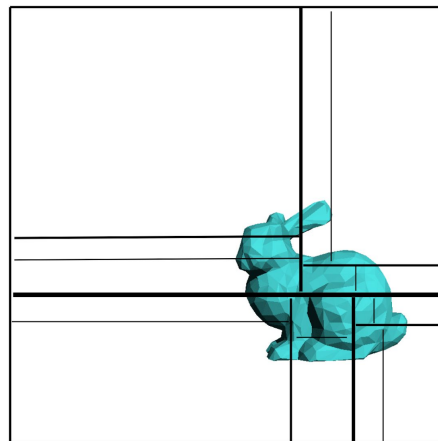
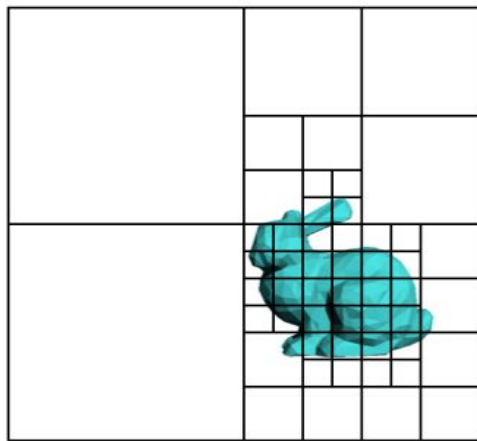


Last Time?

- Collision Detection
- Conservative Bounding Regions
- Spatial Acceleration Data Structures



- Octree
- k-d Tree
- BSP



Today

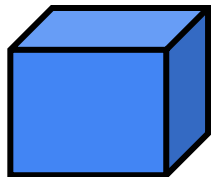
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Types of Dynamics

- Point

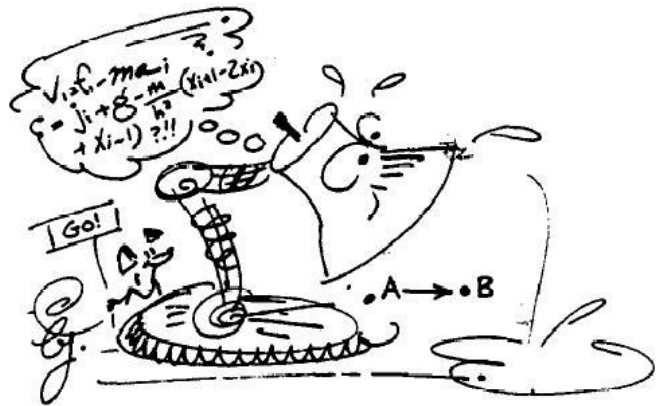


- Rigid body



- Deformable body

(include clothes, fluids, smoke, etc.)



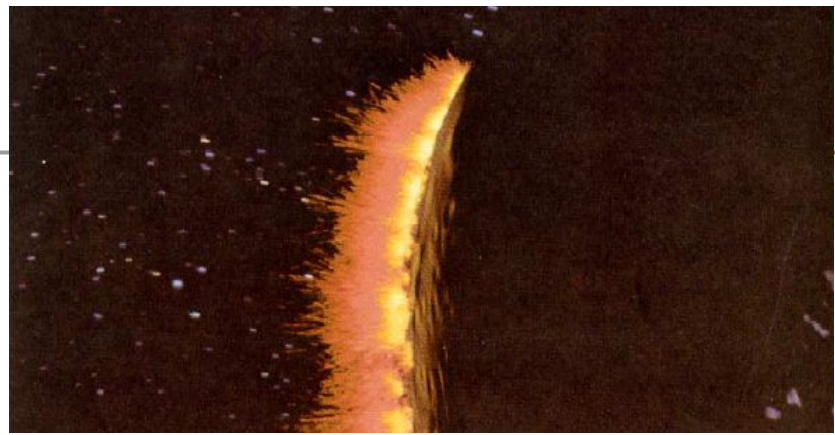
Witkin & Kass, "Spacetime Constraints", 1988



Carlson, Mucha, Van Horn, & Turk 2002

What is a Particle System?

- Collection of many small simple particles that maintain *state* (position, velocity, color, etc.)
- Particle motion influenced by external *force fields*
- *Integrate* the laws of mechanics (ODE Solvers)
- To model: sand, dust, smoke, sparks, flame, water, etc.



Star Trek, The Wrath of Kahn, 1982



Sateesh Malla, 2008, <http://www.sateeshmalla.com/blog/2008/05/water-fountain-simulation/>

Particle Motion

- mass m , position x , velocity v
- equations of motion:

$$\frac{d}{dt} x(t) = v(t)$$

$$\frac{d}{dt} v(t) = \frac{1}{m} F(x, v, t) \quad F = ma$$

- Analytic solutions can be found for some classes of differential equations, but most can't be solved analytically
- Instead, we will numerically approximate a solution to our *initial value problem*

Higher Order ODEs

- Basic mechanics is a 2nd order ODE:

$$\frac{d^2}{dt^2} \mathbf{x} = \frac{1}{m} \mathbf{F}$$

- Express as 1st order ODE by defining $\mathbf{v}(t)$:

$$\frac{d}{dt} \mathbf{x}(t) = \mathbf{v}(t)$$

$$\frac{d}{dt} \mathbf{v}(t) = \frac{1}{m} \mathbf{F}(\mathbf{x}, \mathbf{v}, t)$$

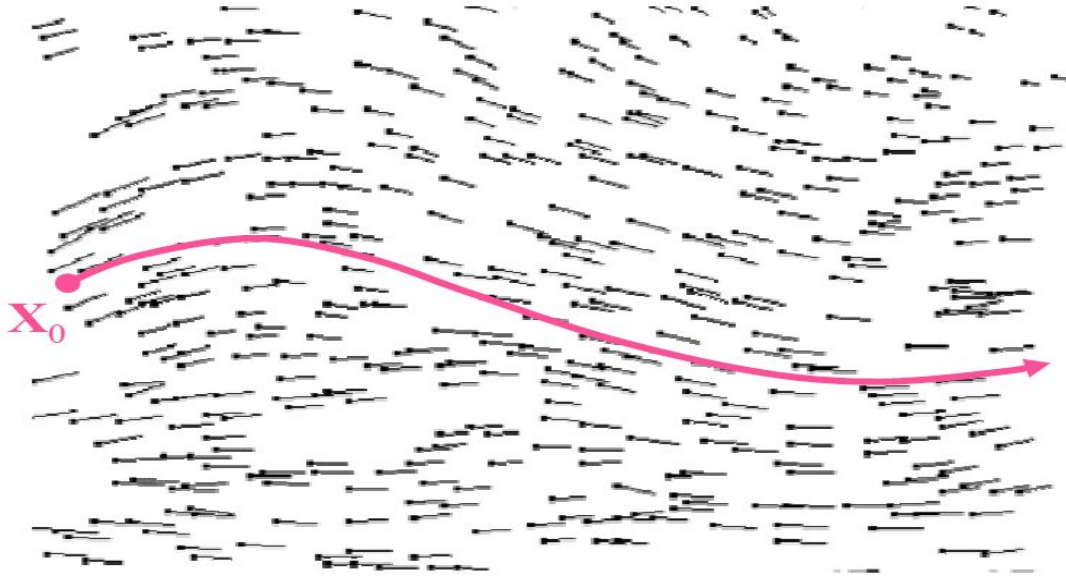
$$\mathbf{X} = \begin{pmatrix} \mathbf{x} \\ \mathbf{v} \end{pmatrix} \quad f(\mathbf{X}, t) = \begin{pmatrix} \mathbf{v} \\ \frac{1}{m} \mathbf{F}(\mathbf{x}, \mathbf{v}, t) \end{pmatrix}$$

\mathbf{X} is a vector storing the *current state* of the particle

$f(\mathbf{X}, t)$ describes how to *update* the state of the particle

Path Through a Field

- $f(\mathbf{X}, t)$ is a vector field defined everywhere
 - E.g. a velocity field which may change over time



Note: In the simplest particle systems, the particles do not interact with each other, only with external force fields

- $\mathbf{X}(t)$ is a path through the field

For a Collection of 3D particles...

$$\mathbf{X} = \begin{pmatrix} p_x^{(1)} \\ p_y^{(1)} \\ p_z^{(1)} \\ v_x^{(1)} \\ v_y^{(1)} \\ v_z^{(1)} \\ p_x^{(2)} \\ p_y^{(2)} \\ p_z^{(2)} \\ v_x^{(2)} \\ v_y^{(2)} \\ v_z^{(2)} \\ \vdots \end{pmatrix} \quad f(\mathbf{X}, t) = \begin{pmatrix} v_x^{(1)} \\ v_y^{(1)} \\ v_z^{(1)} \\ \frac{1}{m_1} F_x^{(1)}(\mathbf{X}, t) \\ \frac{1}{m_1} F_y^{(1)}(\mathbf{X}, t) \\ \frac{1}{m_1} F_z^{(1)}(\mathbf{X}, t) \\ v_x^{(2)} \\ v_y^{(2)} \\ v_z^{(2)} \\ \frac{1}{m_2} F_x^{(2)}(\mathbf{X}, t) \\ \frac{1}{m_2} F_y^{(2)}(\mathbf{X}, t) \\ \frac{1}{m_2} F_z^{(2)}(\mathbf{X}, t) \\ \vdots \end{pmatrix}$$

more generally, we can define \mathbf{X} as a huge vector storing the current state of all particles in a system

Questions?

- Current state \mathbf{X} can also include color & transparency
- $f(\mathbf{X}, t)$ can animate changes in these values over time



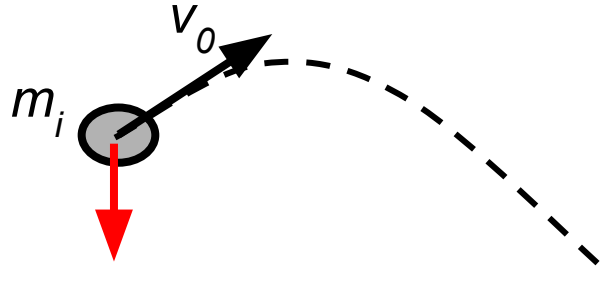
MixPixVisuals
Mikael Bellander
<https://www.youtube.com/watch?v=M-Hz9Za5mCE>

Today

- **Particle Systems**
 - Equations of Motion (Physics)
 - **Forces: Gravity, Spatial, Damping**
 - Numerical Integration (Euler, Midpoint, etc.)
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Forces: Gravity

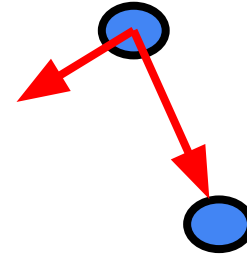
- Simple gravity: depends only on particle mass



*For smoke, flame:
make "gravity" point up!*

$$\text{Gravity: } f^{(i)} = \begin{pmatrix} 0 \\ 0 \\ -m_i G \end{pmatrix}$$

- N-body problem: depends on all other particles
 - Magnitude inversely proportional to square distance
 - $F_{ij} = G m_i m_j / r^2$



*Quickly gets impractical to compute analytically.
Expensive to numerically approximate too!*

Forces: Spatial Fields

- Force on particle i depends only on position of i
 - wind
 - attractors
 - repulsors
 - vortices
- Can depend on time (e.g., wind gusts)
- *Note: these forces will generally add energy to the system, and thus may need damping...*

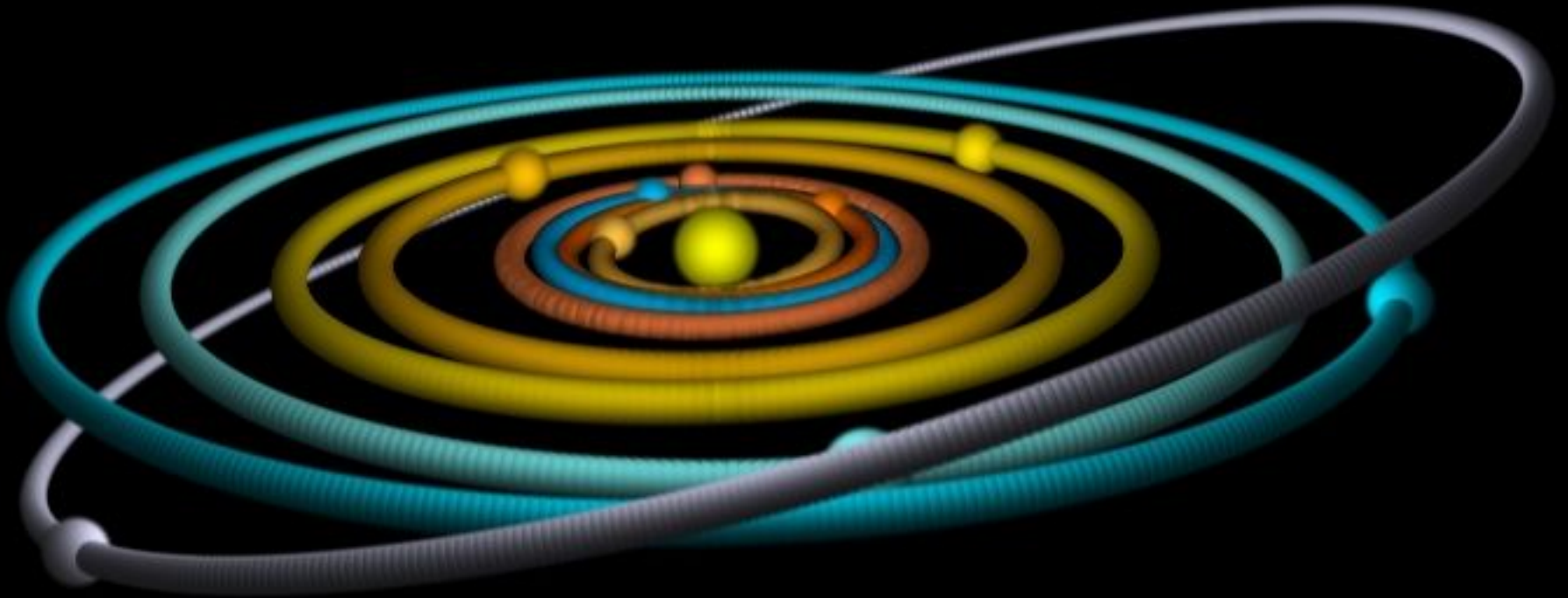
Forces: Damping

- Force on particle i depends only on velocity of i

$$f^{(i)} = -dv^{(i)}$$

- Force opposes motion
 - *A hack mimicking real-world friction/drag*
 - *Friction is complicated...*
- Damping removes energy, so system can settle
- Small amount of damping can stabilize solver
- Too much damping makes motion too glue-like and unrealistic

Questions?



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Euler's Method

- Examine $f(\mathbf{X}, t)$ at (or near) current state
- Take a step of size h to new value of \mathbf{X} :

$$t_1 = t_0 + h$$

$$\mathbf{X}_1 = \mathbf{X}_0 + h f(\mathbf{X}_0, t_0)$$

$$\mathbf{X} = \begin{pmatrix} x \\ v \end{pmatrix} \quad f(\mathbf{X}, t) = \begin{pmatrix} v \\ \frac{1}{m} F(x, v, t) \end{pmatrix}$$

*update the position
by adding a
little bit of the
current velocity*

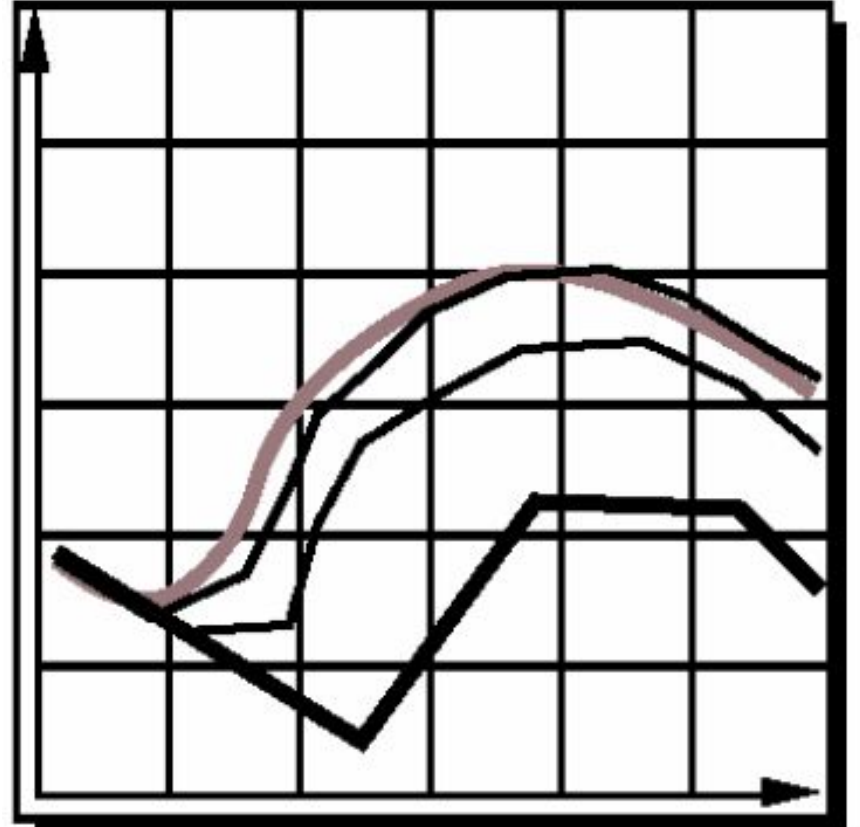
&

*update the velocity by
adding a little bit of the
current acceleration*

- Piecewise-linear approximation to the curve

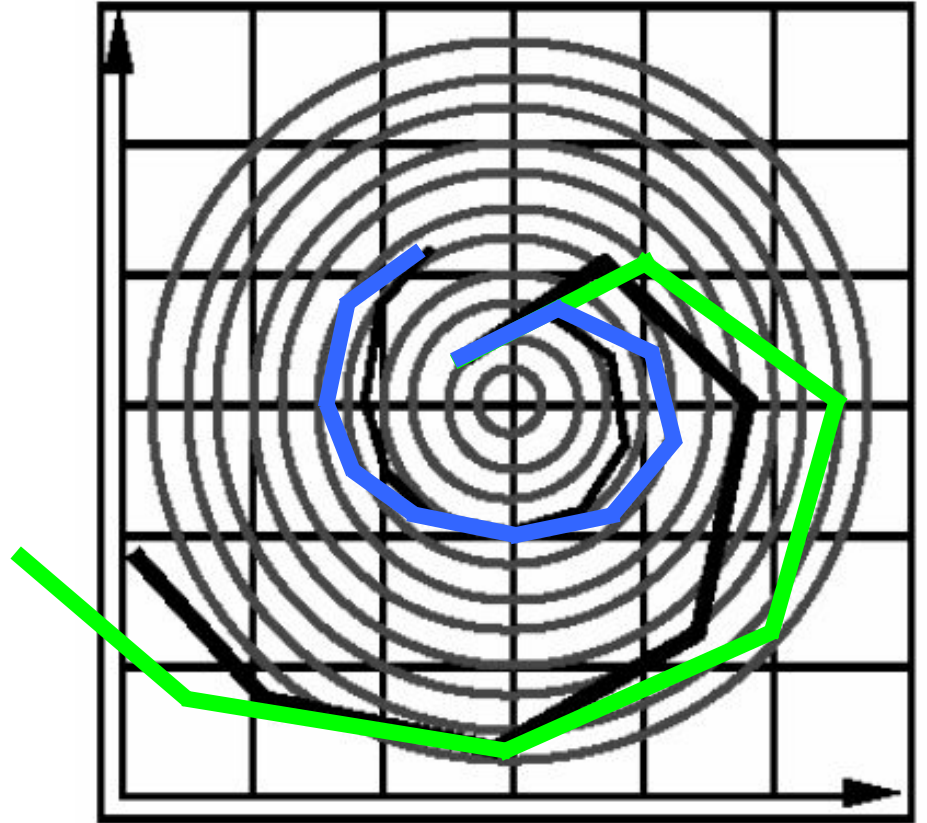
Effect of Step Size

- Step size controls accuracy
- Smaller steps more closely follow curve
- For animation, we may want to take *many* small steps per frame
 - How many frames per second for animation?
 - How many steps per frame?



Euler's Method: Inaccurate

- Simple example: particle in stable circular orbit around planet (origin)
- Current velocity is always tangent to circle
- Force is perpendicular to circle
- Euler method will spiral outward no matter how small h is



Euler's Method: Unstable

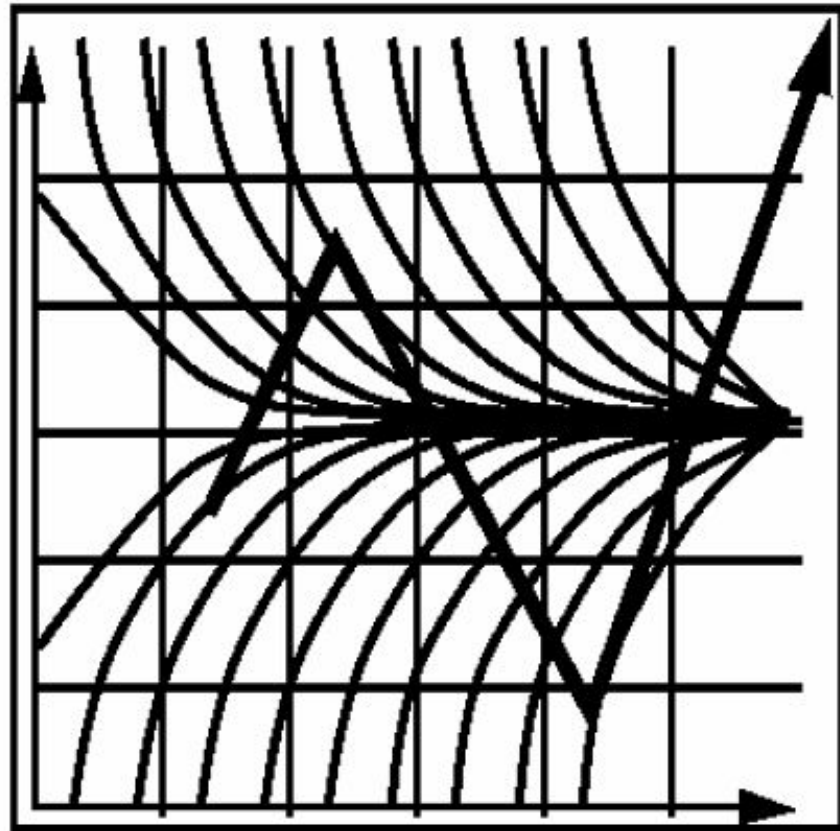
- Problem: $f(x, t) = -kx$
- Solution: $x(t) = x_0 e^{-kt}$

- Limited step size:

$$x_1 = x_0 (1 - hk)$$

$$\begin{cases} h \leq 1/k & \text{ok} \\ h > 1/k & \text{oscillates } \pm \\ h > 2/k & \text{explodes} \end{cases}$$

- If k is big, h must be small



Analysis using Taylor Series

- Expand exact solution $\mathbf{X}(t)$

$$\mathbf{X}(t_0 + h) = \mathbf{X}(t_0) + h \left(\frac{d}{dt} \mathbf{X}(t) \right) \Big|_{t_0} + \frac{h^2}{2!} \left(\frac{d^2}{dt^2} \mathbf{X}(t) \right) \Big|_{t_0} + \frac{h^3}{3!} (\dots) + \dots$$

- Euler's method:

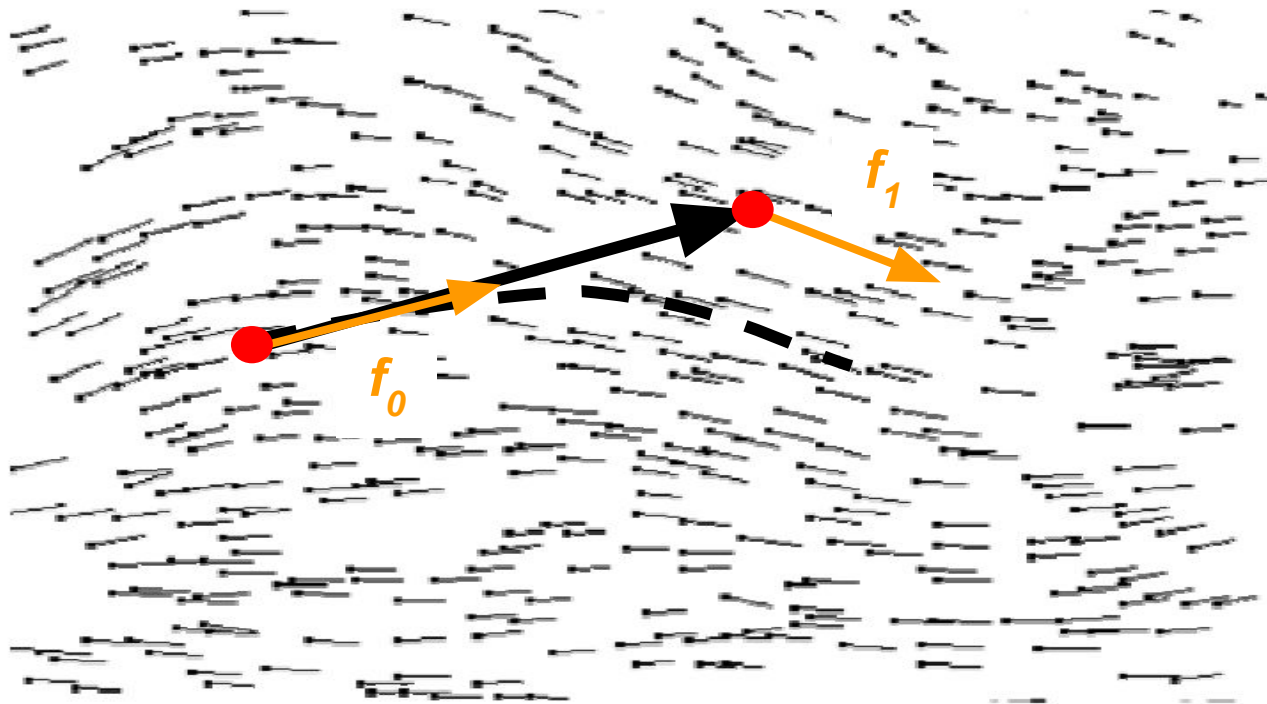
$$\mathbf{X}(t_0 + h) = \mathbf{X}_0 + h f(\mathbf{X}_0, t_0) \quad \dots + O(h^2) \text{ error}$$

$h \rightarrow h/2 \Rightarrow \text{error} \rightarrow \text{error}/4$ per step \times twice as many steps
 $\rightarrow \text{error}/2$

- First-order method: Accuracy varies with h
 - To get 100x better accuracy need 100x more steps

Can we do better than Euler's Method?

- Problem: f has varied along the step
- Idea: look at f at the arrival of the step and compensate for variation



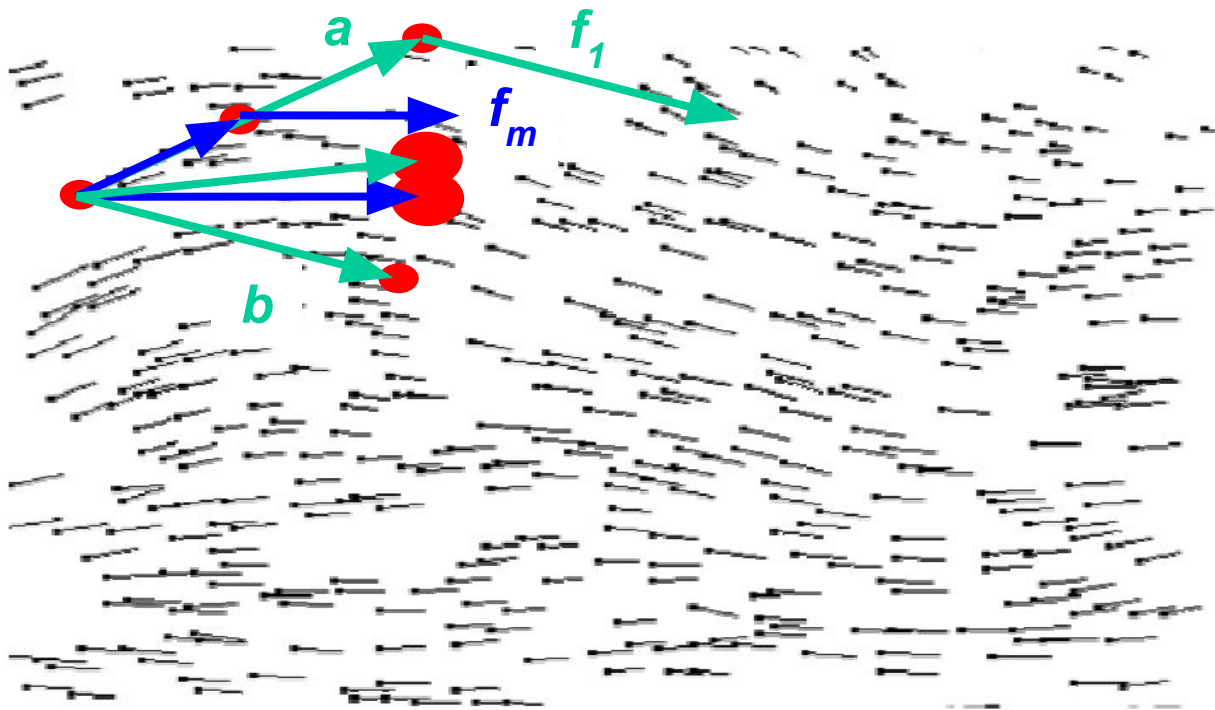
2nd-Order Methods

- Midpoint:

- $\frac{1}{2}$ Euler step
- evaluate f_m
- full step using f_m

- Trapezoid:

- Euler step (a)
- evaluate f_1
- full step using f_1 (b)
- average (a) and (b)



*Midpoint & trapezoid do not yield exactly the same result,
but they have same order of accuracy*

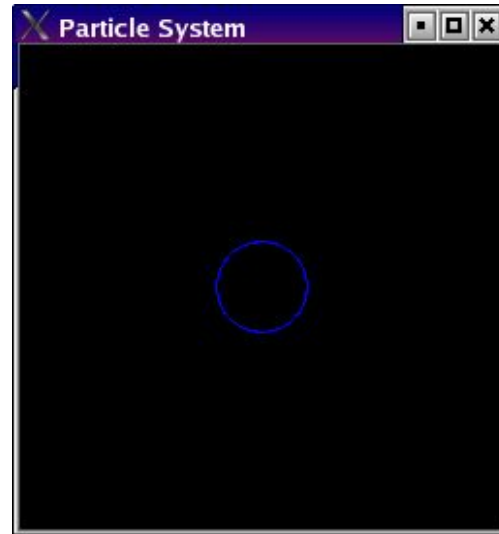
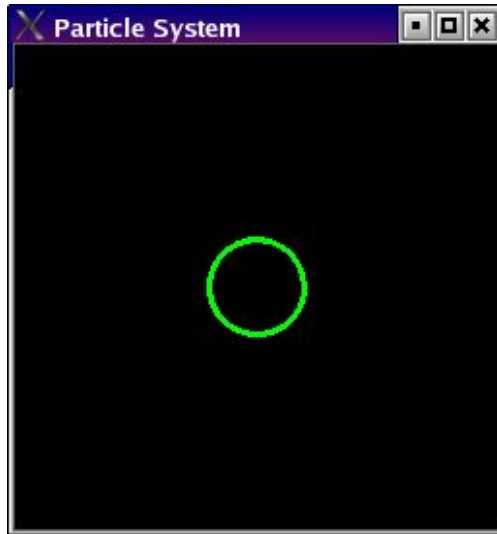
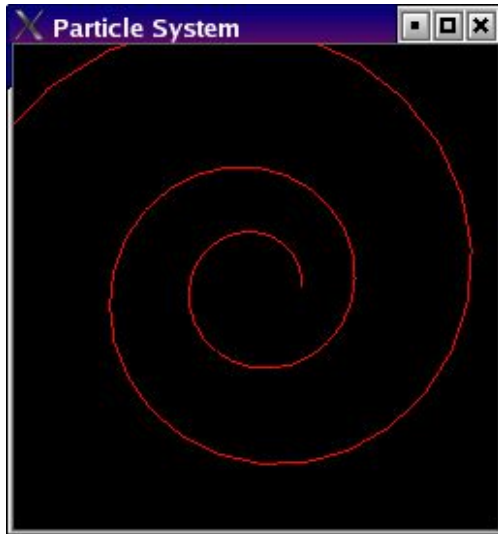
Comparison: Euler, Midpoint, Runge-Kutta

- *initial position* : $(1,0,0)$
- *initial velocity* : $(0,5,0)$
- *force field* : pulls particles to origin with magnitude proportional to distance from origin

A 4th order method!

- *correct answer* : circle

Euler will always diverge (even with small dt)



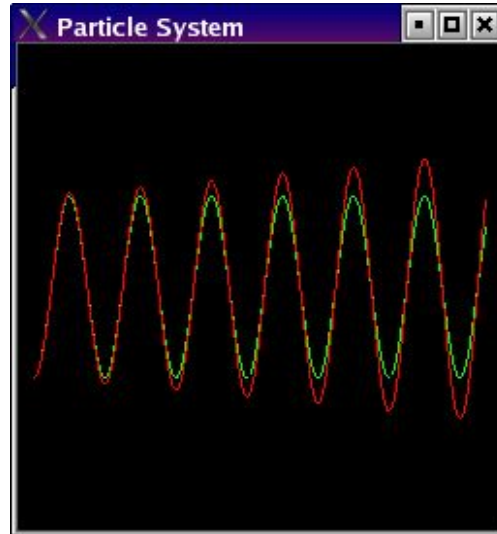
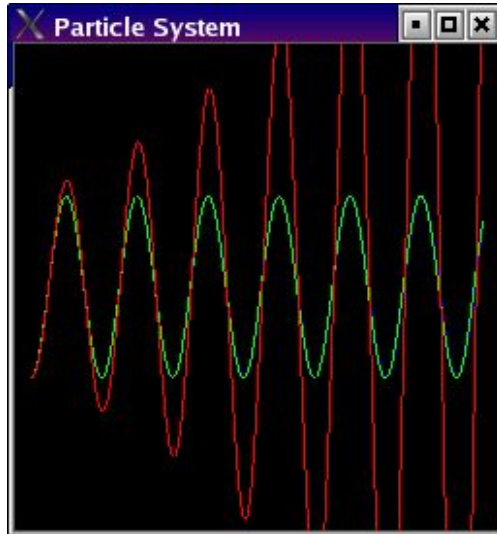
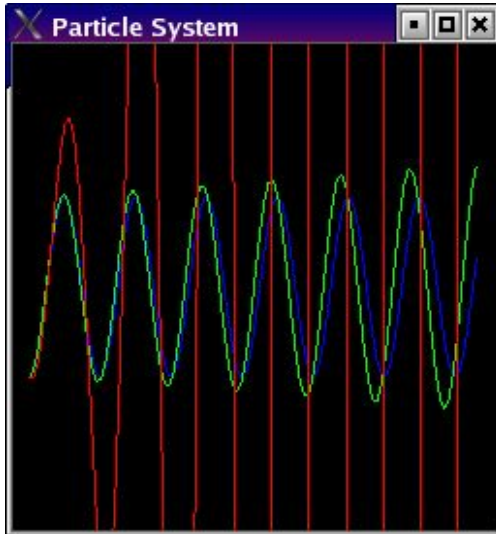
Comparison: Euler, Midpoint, Runge-Kutta

- *initial position* : (0,-2,0)
- *initial velocity* : (1,0,0)
- *force field* : pulls particles to line $y=0$ with magnitude proportional to distance from line

A 4th order method!

- *correct answer* :
sine wave

Decreasing the timestep (dt) improves the accuracy



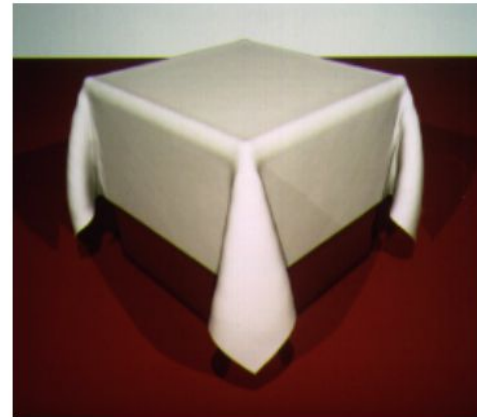
Questions?

“Predicting the Drape of Woven Cloth Using Interacting Particles”
Breen, House, and Wozny,
SIGGRAPH 1994

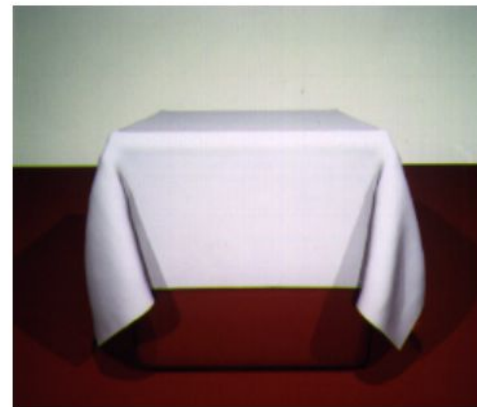
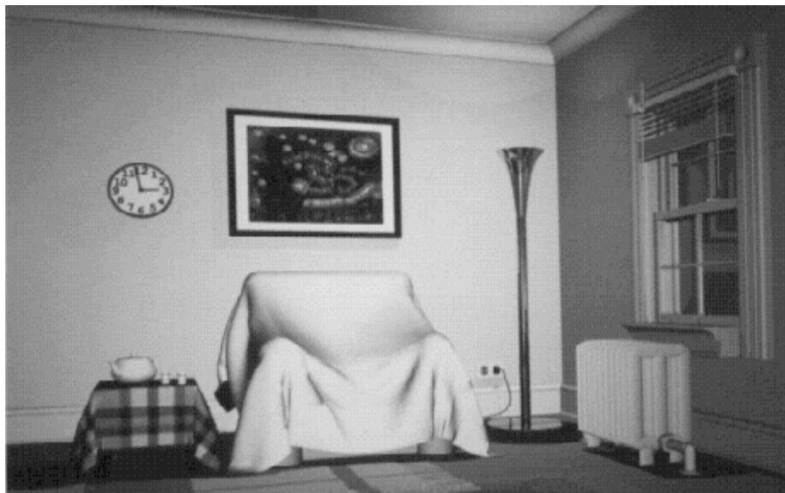
actual



virtual



100% Cotton Weave

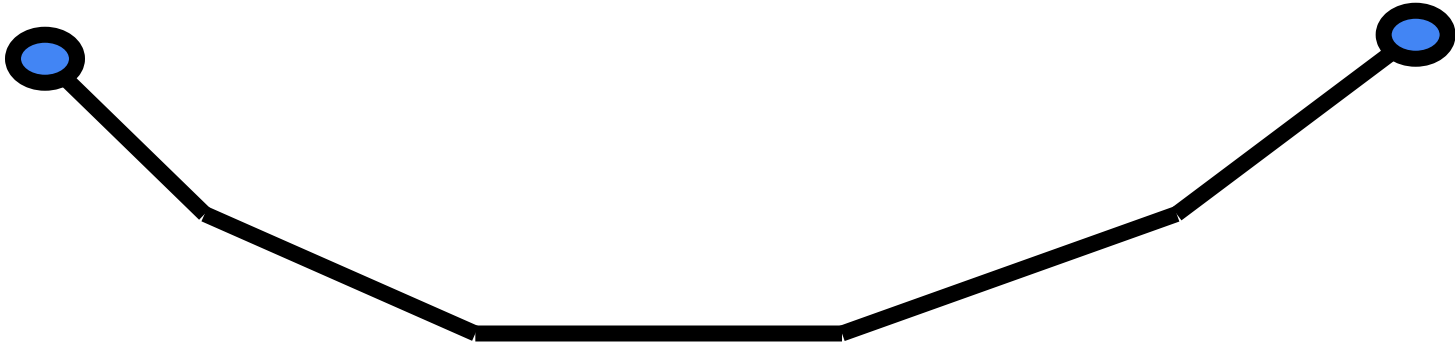


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How would you simulate a string?

- Each particle is linked to two particles
- Forces try to keep the distance between particles constant
- What force?

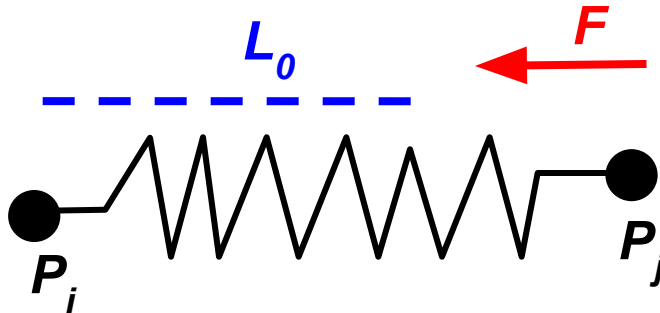


Spring Forces

- **Force** in the direction of the spring and proportional to difference with **rest length** L_0

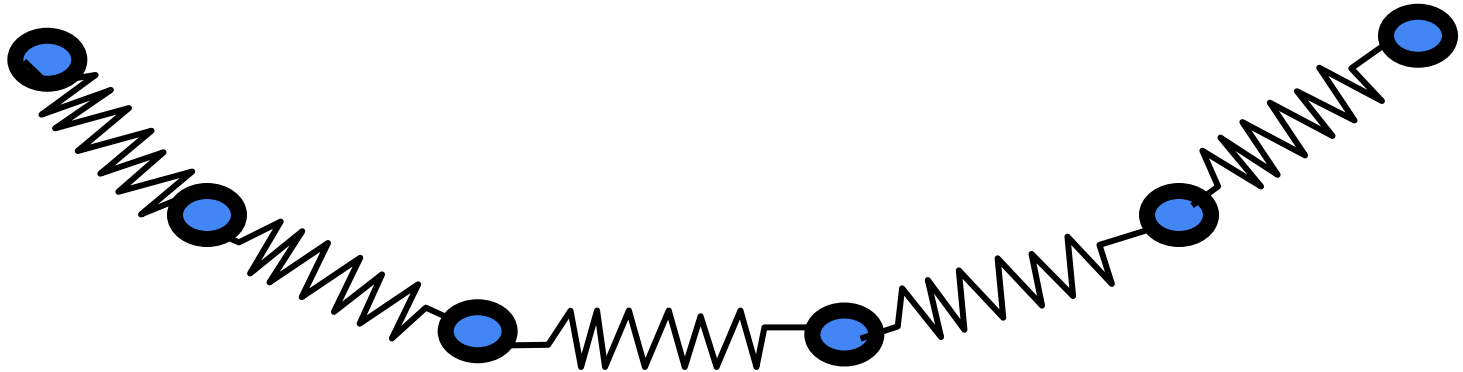
$$F(P_i, P_j) = K(L_0 - \|P_i \vec{P}_j\|) \frac{P_i \vec{P}_j}{\|P_i \vec{P}_j\|}$$

- K is the stiffness of the spring
 - *When K gets bigger, the spring really wants to keep its rest length*



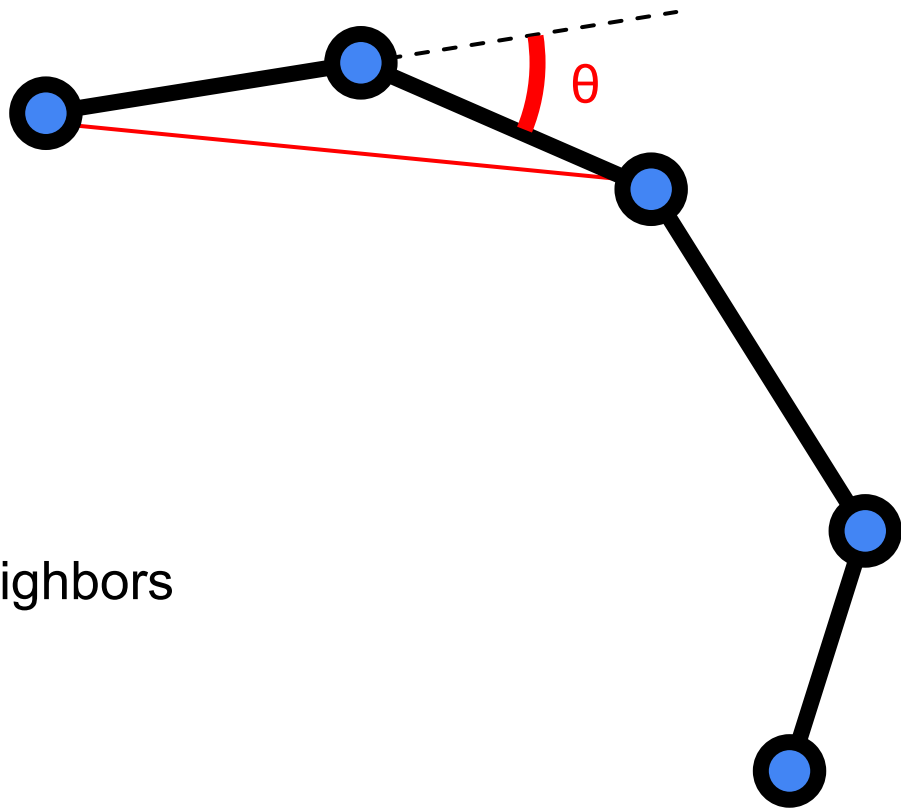
How would you simulate a string?

- Springs link the particles
- Springs try to keep their rest lengths and preserve the length of the string
- Problems?
 - Stretch, actual length will be greater than rest length
 - Numerical oscillation



How would you simulate hair?

- Similar to string
- Also, to specify hair shape (e.g., straight or curly)
 - Add forces based on the angle between segments
 - Add additional springs/constraints stretching between the non-immediate neighbors



Cloth Modeled with Mass-Spring

- Network of masses and springs

- structural springs :

- link (i, j) & $(i+1, j)$
and (i, j) & $(i, j+1)$

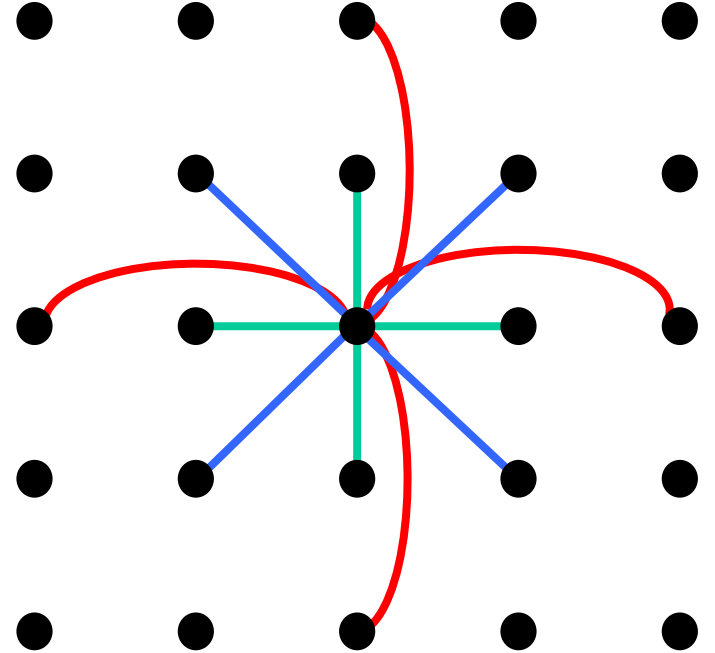
- shear springs :

- link (i, j) & $(i+1, j+1)$
and $(i+1, j)$ & $(i, j+1)$

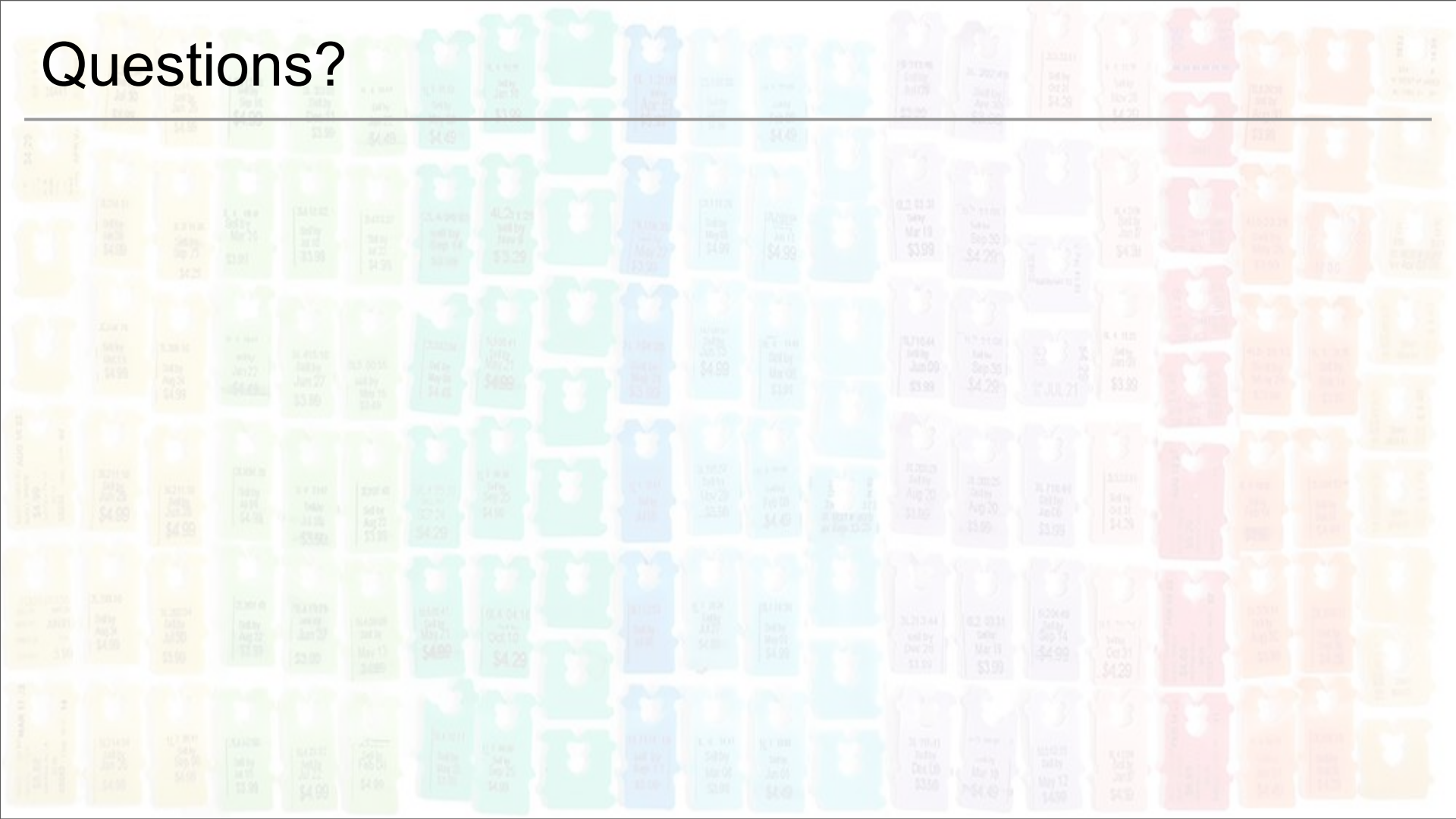
- flexion (bend) springs :

- link (i, j) & $(i+2, j)$
and (i, j) & $(i, j+2)$

- *Be careful not to index out of bounds on the cloth edges!*



Questions?



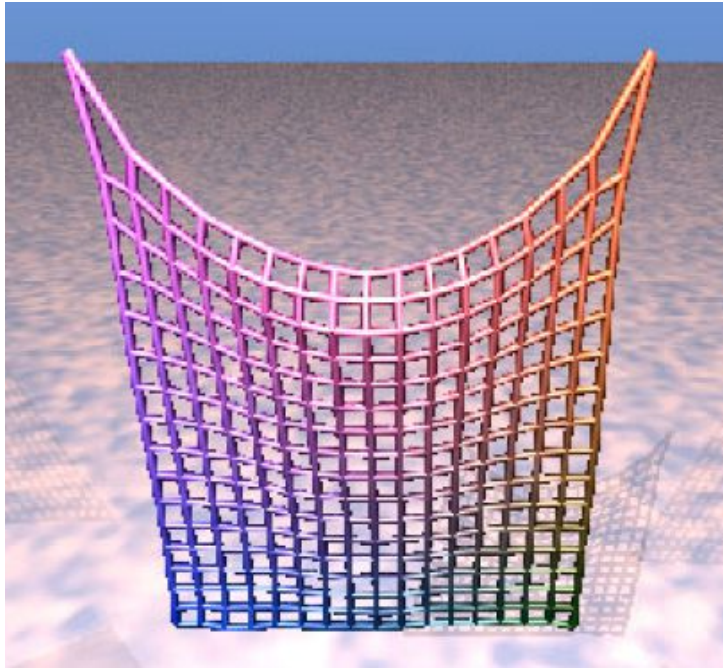
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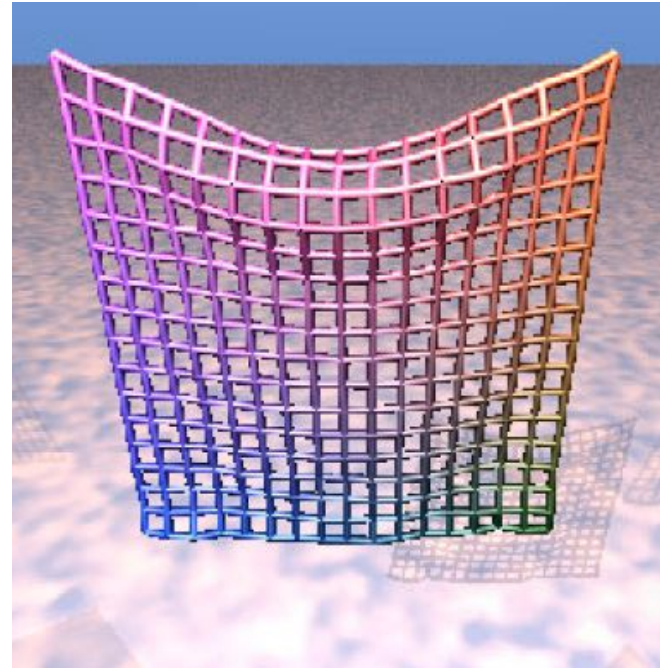
Reading for Next Time:

*Everyone should read this paper!
(simple cloth model used in HW2)*

- “Deformation Constraints in a Mass-Spring Model to Describe Rigid Cloth Behavior”, Provot, 1995.



Simple mass-spring system



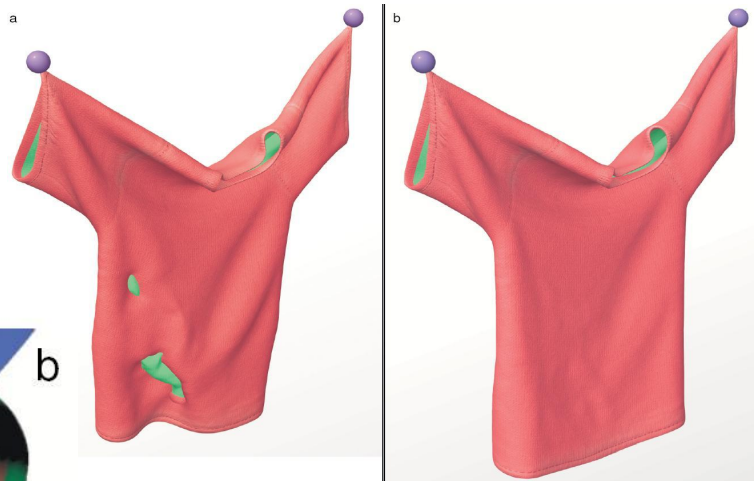
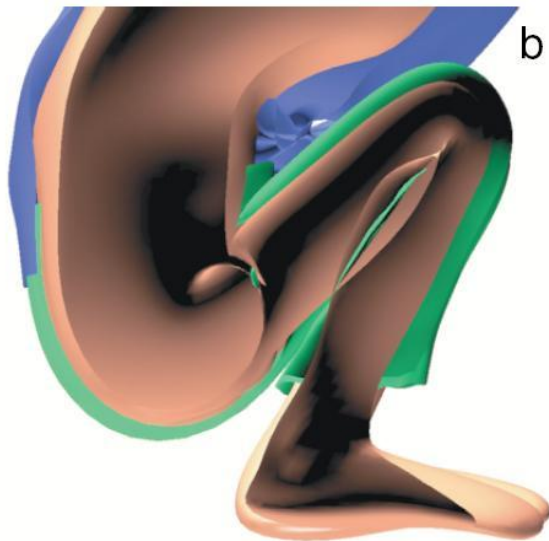
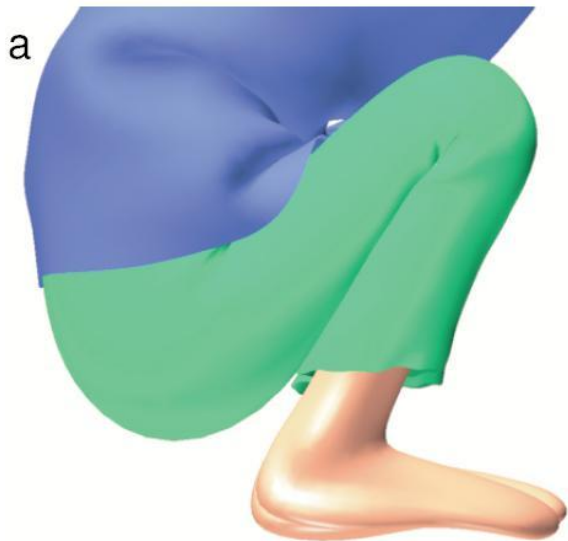
Improved solution

- In order to be more realistic, we increase the stiffness of the cloth?
- Adjust parameters to simulate different materials
- Implementation details are intuitive, well presented in logical order
- (mostly) Effective use of images in paper, labels could be improved
- Knit vs. woven, dry vs. wet - has impacts on drape of cloth
- Limitation/weakness: cannot handle large forces in small area of cloth
- What about collisions with objects & cloth self-collisions? & friction?
- Does order of update/adjustment matter? why/why not?
- Surprising that this simple 'hack' visually works well enough.
- Only simulated flat topologies of cloth - no fitted, structured clothing
- Sadly, we only notice cloth in an animation if it looks wrong.

Cloth in Practice (w/ Animation)

Optional Reading

- Baraff, Witkin & Kass, *Untangling Cloth*, SIGGRAPH 2003



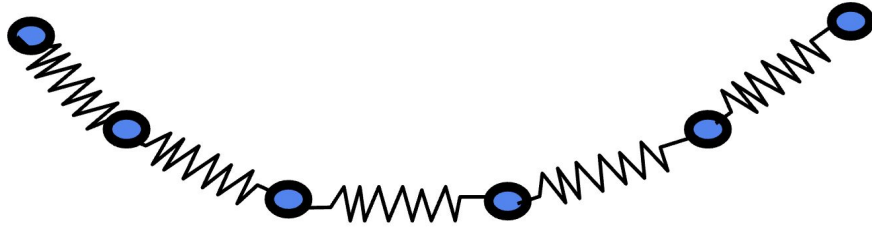
- Overall algorithm seem too simple - surprised that it works well
- Observation: Self-intersection is often hidden by other parts of the scene
- Glad paper discussed other attempts to solve the problem that did not work

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The Stiffness Issue

- What relative stiffness K do we want for the different springs in the network?

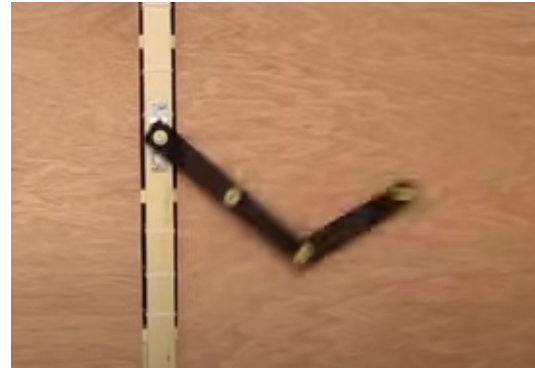
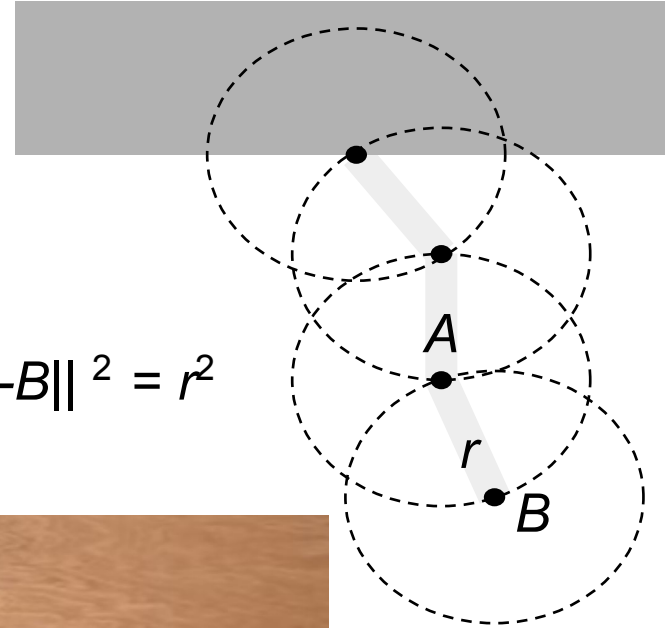


- Simple (non-spandex) cloth is barely elastic - *it shouldn't stretch much!*
- The actual spring length will always be greater than rest length
- Challenge/Unpleasant Compromise: Inverse relationship between stiffness & Δt necessary for stable simulation
 - Numerical oscillation and instability if Δt is too big
 - Simulation is costly & slow if Δt is small

What about Rigid Constraints?

- What we really want is *no stretch or maximum stretch constraints* (not springs!)
- *E.g., rigid, fixed-length bars that link the particles*
 - Dynamics + constraints must be solved simultaneously
 - non-trivial, even for tiny systems

$$\|A-B\|^2 = r^2$$

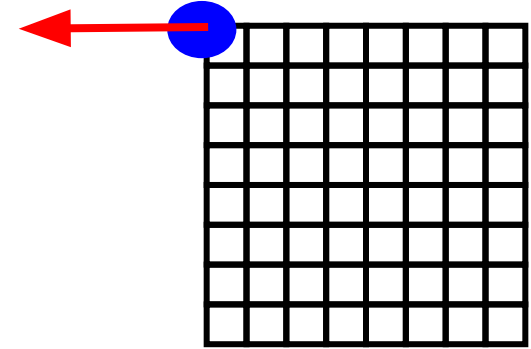
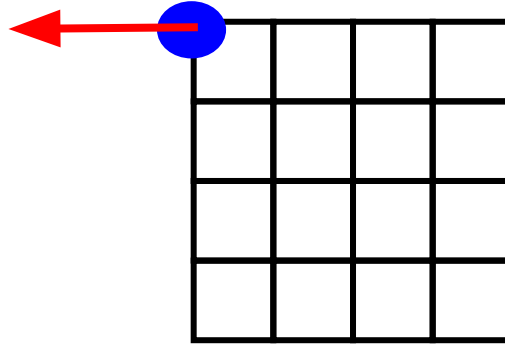


even 2 rigid links = **Double Pendulum** is chaotic!
<https://www.youtube.com/watch?v=AwT0k09w-jw>



The Discretization Problem

- What is the impact of the grid resolution?
- What happens if we double the resolution of our mesh?
- Do we get the same simulation behavior for the two meshes?
 - *Usually not! It takes a lot of effort to design a scheme that does not depend on the discretization.*
- Using (explicit) Euler simulation, how many timesteps before a force propagates across the mesh in the two meshes?
 - *It will take twice as many timesteps in the higher resolution mesh!*



A Better Solution: Explicit vs. Implicit Integration

- Explicit/forward integration :

$$\mathbf{y}_{k+1} = \mathbf{y}_k + h \mathbf{g}(\mathbf{y}_k)$$

The future state (position & velocity) of this particle is a function of the current state of the particle.

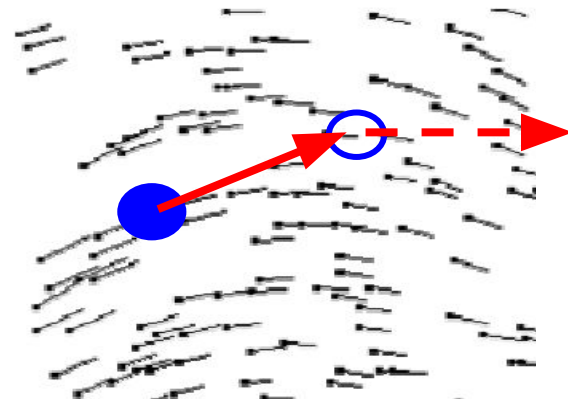
- Implicit/backwards integration :

$$\mathbf{y}_{k+1} = \mathbf{y}_k + h \mathbf{g}(\mathbf{y}_{k+1})$$

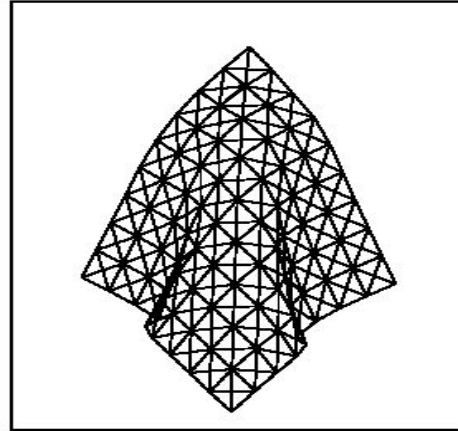
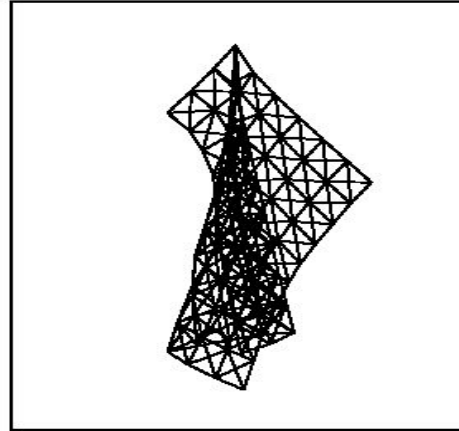
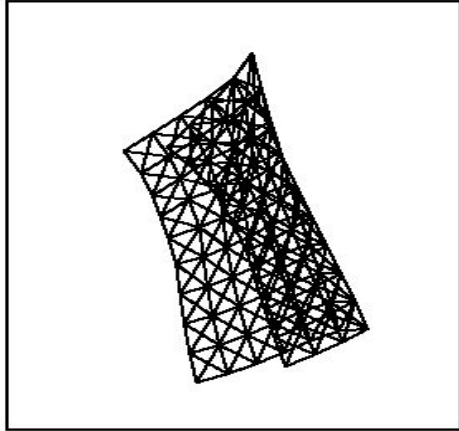
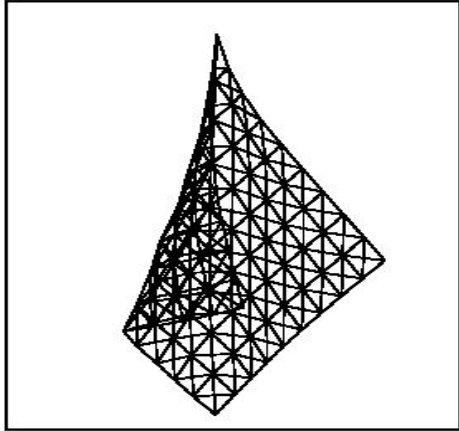
$$\mathbf{y}_{k+1} - h \mathbf{g}(\mathbf{y}_{k+1}) = \mathbf{y}_k$$

The future state of this particle depends on the current state AND the future state.

- Because **particles are interconnected**, must solve global system (not just local)
- Solving each each step is more expensive (Newton's Method, Conjugate Gradients, ...)
- *Larger timesteps are possible with implicit methods!*
- Thus it can be overall faster than the equivalent explicit simulation



Questions?



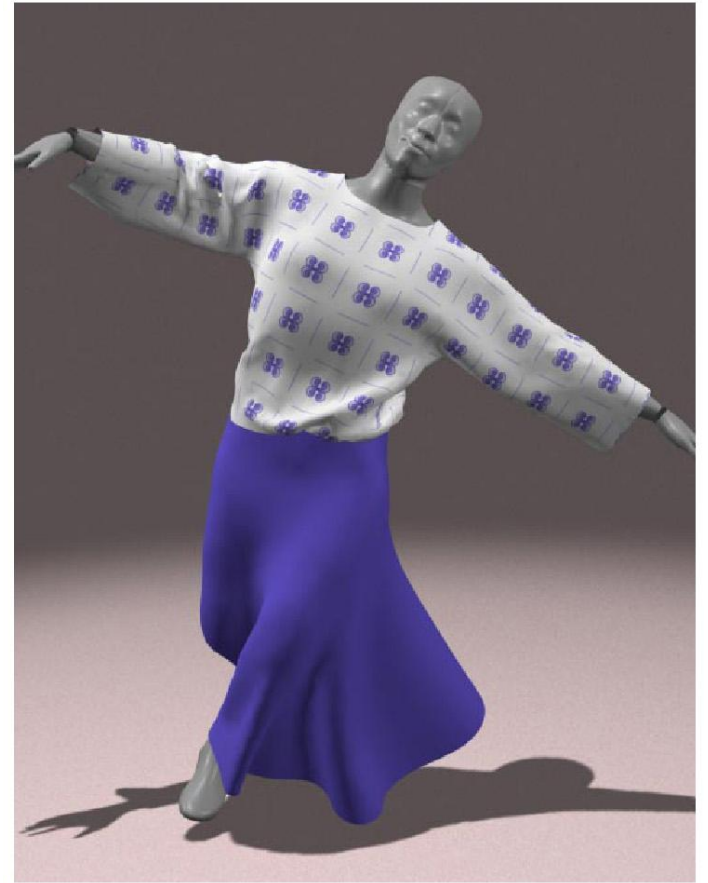
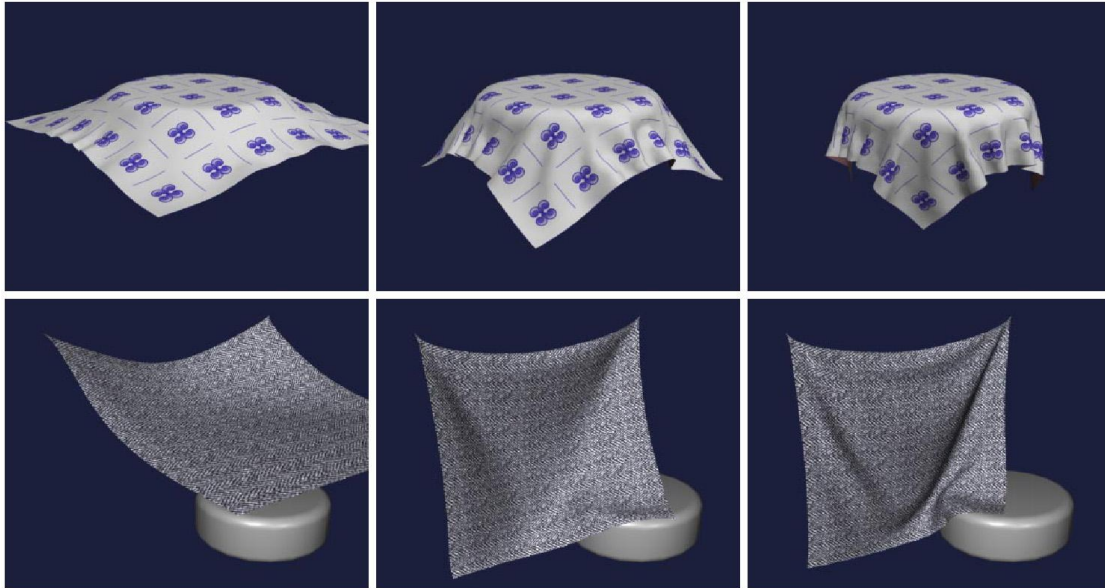
*Interactive Animation of
Structured Deformable Objects
Desbrun, Schröder, & Barr 1999*

Today

- Particle Systems
 - Equations of Motion (Physics)
 - Forces: Gravity, Spatial, Damping
 - Numerical Integration (Euler, Midpoint, etc.)
- Mass Spring System Examples
 - String, Hair, Cloth
- Papers for Today
- Stiffness & Discretization
- **Papers for Tuesday**
- Worksheet on Volumetric Structures (if time allows)

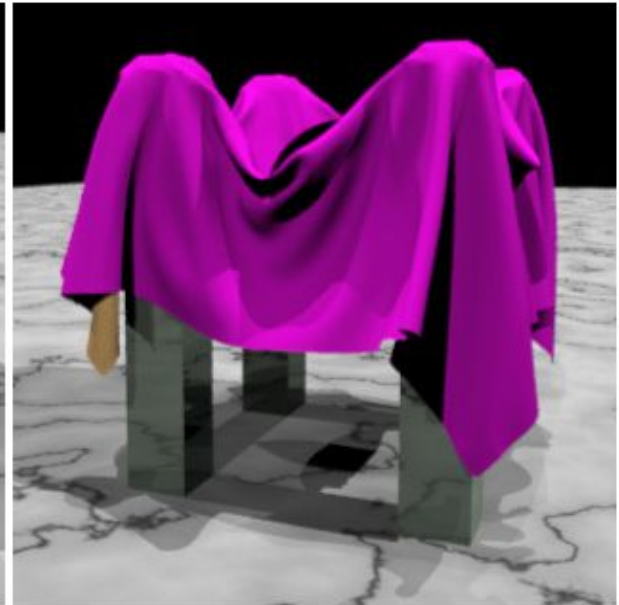
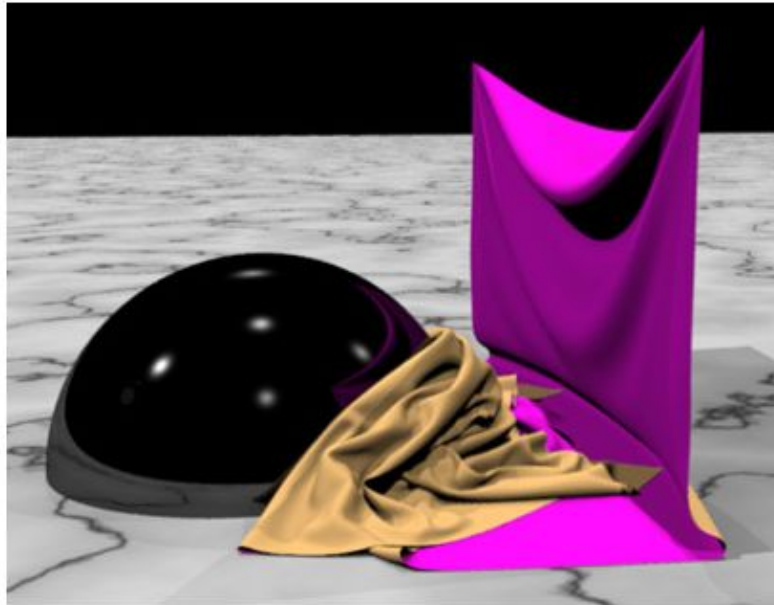
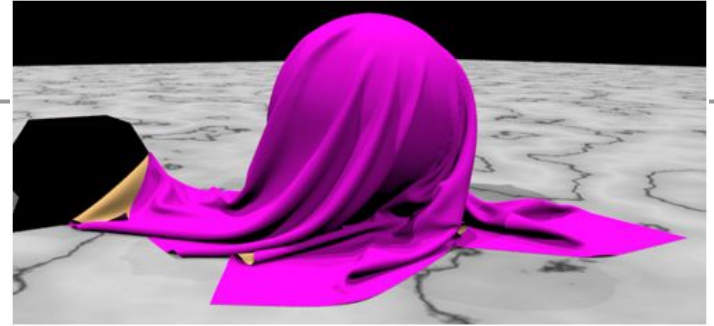
Papers for Tuesday (*pick one*)

- “Large Steps in Cloth Simulation”,
Baraff & Witkin,
SIGGRAPH 1998



Papers for Tuesday (*pick one*)

- “Robust Treatment of Collisions, Contact and Friction for Cloth Animation”, Bridson, Fedkiw & Anderson, SIGGRAPH 2002



Papers for Tuesday (*pick one*)



“Artistic Simulation of Curly Hair”, Iben, Meyer, Petrovic, Soares, Anderson, and Witkin, Symposium on Computer Animation 2013

Today

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Worksheet: Spatial Data Structures

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NOTE: We'll be doing pair worksheets throughout the term. Bonus points if you work with a different partner for every worksheet!