



**Trinity College Dublin**  
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The University of Dublin

# 14: MASS-SPRING SYSTEMS & CLOTH

24/03/2016

# HAVOK CLOTH DEMO (GDC 2010)



© Havok <https://www.youtube.com/watch?v=wcds8eY93Zk>

# DEFORMABLE SOLIDS IN GAMES

**1D:** ropes, hair

**2D:** cloth, clothing

**3D:** fat, tires, organs



- In fact all real objects are 3D
- In practice, approximate object with a lower dimensional model if possible ~ for efficiency
- Dimension reduction substantially saves simulation time

# MASS SPRING SYSTEMS

## Approach:

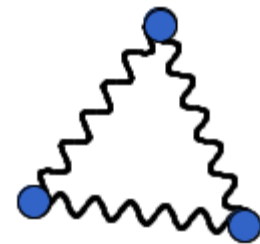
- Spatially discretize an object into component **point masses**
- Represent internal forces between mass points using massless elastic **springs**
- Compute positions and velocities at discrete time steps

## Pros:

- Easy to implement
- Reasonably fast

## Some problems:

- Lack of preservation of volume
- Behaviour is heavily dependent on mesh topology and choice of springs
- Hard to find springs that correspond with real-world parameter values of specific materials

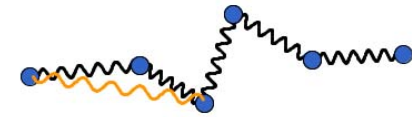


Content based on [Mueller'08]

# MASS SPRING SYSTEMS

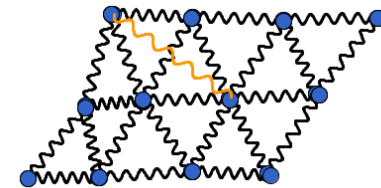
## Rope: Chain

- Additional springs for bending and torsional resistance needed

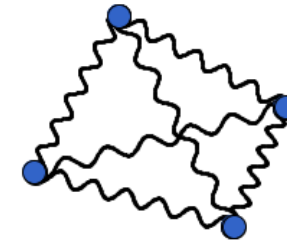


## Cloth: triangle mesh

- Additional springs for shearing and bending resistance needed



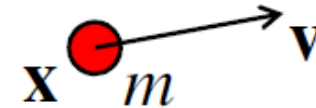
## Soft body: tetrahedral mesh



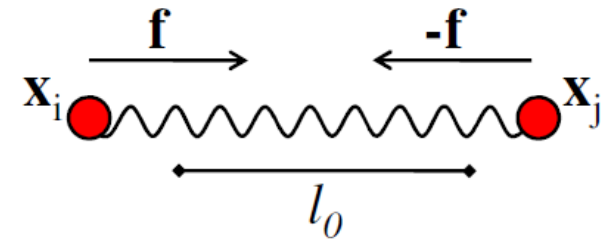
Content based on [Mueller'08] Images © Muller 2008, Top 3 images © Teschner 2003

# MASS SPRING PHYSICS

Mass point: mass  $m$ , position  $x$ , velocity  $v$



Spring motion based on Hooke's Law  
(Linear Strain model)



$$\mathbf{f} = \frac{\mathbf{x}_j - \mathbf{x}_i}{|\mathbf{x}_j - \mathbf{x}_i|} \left[ k_s (|\mathbf{x}_j - \mathbf{x}_i| - l_o) + k_d (\mathbf{v}_j - \mathbf{v}_i) \cdot \frac{\mathbf{x}_j - \mathbf{x}_i}{|\mathbf{x}_j - \mathbf{x}_i|} \right]$$

where:  $k_s, k_d$  are the stretching and damping coefficients

# TIME INTEGRATION: EXPLICIT EULER

ODE (Newton):

$$\dot{\mathbf{v}} = \frac{\mathbf{f}}{m}$$

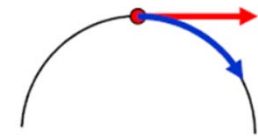
$$\dot{\mathbf{x}} = \mathbf{v}$$

Using Explicit Euler Integration:  $\mathbf{x}_i^{t+1} = \mathbf{x}_i^t + \Delta t \mathbf{v}_i^t$

$$\mathbf{v}_i^{t+1} = \mathbf{v}_i^t + \Delta t \frac{1}{m_i} \sum_j \mathbf{f}(\mathbf{x}_i^t, \mathbf{v}_i^t, \mathbf{x}_j^t, \mathbf{v}_j^t)$$

Assumes velocity and force constant within timestep  $\Delta t$

- Correct solution would be  $\mathbf{x}(t + \Delta t) = \mathbf{x}(t) + \int_t^{t+\Delta t} \mathbf{v}(t) dt$



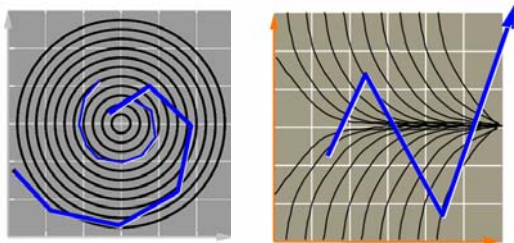
# EXPLICIT INTEGRATION ISSUES

## Accuracy

- Can be improved with higher-order implicit schemes e.g. runge-kutta; or by decreasing size of time-steps (usually at the cost of efficiency)
- Not always critical in real-time applications

## Stability

- Leads to over-shooting
- Critical for real-time applications e.g. games



Content based on [Mueller'08] Images © Baraff et al



# IMPLICIT INTEGRATION

Use values of next time-step on the right hand side of the equation

$$\mathbf{x}_i^{t+1} = \mathbf{x}_i^t + \Delta t \mathbf{v}_i^{t+1}$$

$$\mathbf{v}_i^{t+1} = \mathbf{v}_i^t + \Delta t \frac{1}{m_i} \sum_j \mathbf{f}(\mathbf{x}_i^{t+1}, \mathbf{v}_i^{t+1}, \mathbf{x}_j^{t+1}, \mathbf{v}_j^{t+1})$$

Reasoning:

- Don't extrapolate blindly
- Arrive at a physically-based configuration

# IMPLICIT INTEGRATION

Need to solve:  $\Delta \mathbf{v} = h \mathbf{M}^{-1} \left( \mathbf{f}_0 + \frac{\partial \mathbf{f}}{\partial \mathbf{x}} h(\mathbf{v}_0 + \Delta \mathbf{v}) + \frac{\partial \mathbf{f}}{\partial \mathbf{v}} \Delta \mathbf{v} \right)$

where  $\mathbf{M}$  is an  $n \times n$  mass matrix with diagonals representing masses,  
 $h$  is the time step (a.k.a.  $\Delta t$ )

- rewrite as  $\left( \mathbf{M} - h \frac{\partial \mathbf{f}}{\partial \mathbf{v}} - h^2 \frac{\partial \mathbf{f}}{\partial \mathbf{x}} \right) \Delta \mathbf{v} = h \left( \mathbf{f}_0 + h \frac{\partial \mathbf{f}}{\partial \mathbf{x}} \mathbf{v}_0 \right)$
- use Conjugate Gradient Method to solve a linear equation of the form

$$\mathbf{r} = \mathbf{A} \Delta \mathbf{v} - \mathbf{b}$$

where  $\mathbf{A} = \left( \mathbf{M} - h \frac{\partial \mathbf{f}}{\partial \mathbf{v}} - h^2 \frac{\partial \mathbf{f}}{\partial \mathbf{x}} \right)$

and  $\mathbf{b} = h \left( \mathbf{f}_0 + h \frac{\partial \mathbf{f}}{\partial \mathbf{x}} \mathbf{v}_0 \right)$

From Baraff and Witkin “Large Steps in Cloth Simulation” Siggraph 1998

A detailed Practical Explanation is provided in “Implementing the implicit Euler method for mass-spring systems” by Mikko Kauppila. available at: <http://hugi.scene.org/online/hugi28/>

# IMPLICIT INTEGRATION ISSUES

Unconditionally stable (for any  $\Delta t$ )

Have to solve a system of equations for velocities

- $n$  mass point,  $3n$  unknowns
- Non-linear when the forces are non-linear in the positions (as with springs)
- Linearize force at each time step

Slow → need large time steps

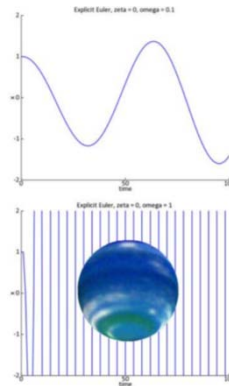
- Some temporal details disappear, numerical damping

See Implicit vs. Explicit Integration (John Foster) <http://engineering.utsa.edu/~foster/me4603/files/integration.pdf>

# COMPARISON OF INTEGRATORS FOR A SPRING

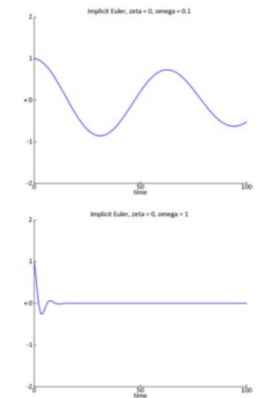
## Explicit Euler:

- Fast but unstable
- $x_2 = x_1 + v_1 \Delta t$
- $v_2 = v_1 + \omega^2 x_1 \Delta t$



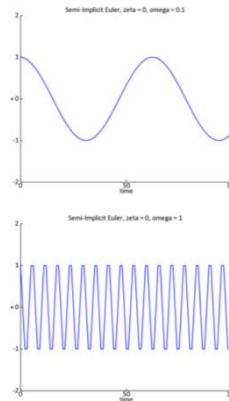
## Implicit Euler:

- Slow but unconditionally stable
- $x_2 = x_1 + v_2 \Delta t$
- $v_2 = v_1 + \omega^2 x_2 \Delta t$



## Semi-Implicit Euler

- Fast and "stable enough"
- $x_2 = x_1 + v_2 \Delta t$
- $v_2 = v_1 + \omega^2 x_1 \Delta t$



N.B.  $\omega = \frac{k_s}{m}$  For any spring constant  $k_s$  and mass  $m$

Semi-implicit Euler is used in Bullet, Box2D and Open Dynamics Engine (ODE)

Catto, E. "Soft Constraints: Reinventing the Spring" GDC 2011 Talk. 2011. <https://box2.googlecode.com>

# VERLET INTEGRATION

Originated in molecular dynamics (central difference approximation: find  $x$  based on previous frame and next frame)

$$\underset{\substack{\uparrow \\ \text{Position}}}{x}(t + \Delta t) = 2\underset{\substack{\uparrow \\ \text{Acceleration}}}{x}(t) - x(t - \Delta t) + a(t)\Delta t^2$$

- Velocity-free formulation:
  - velocity implicitly represented by current and previous positions
  - Need to store current and previous  $x$
- Not always accurate but fast and stable
- Everything depends on position – so good for constraints (e.g. Rag dolls, cloth)

Change this to something like 1.99 to induce drag

```
// Verlet integration step
void ParticleSystem::Verlet() {
    for(int i=0; i<NUM_PARTICLES; i++) {
        Vector3& x = m_x[i];
        Vector3 temp = x;
        Vector3& oldx = m_oldx[i];
        Vector3& a = m_a[i];
        x += x-oldx+a*fTimeStep*fTimeStep;
        oldx = temp;
    }
}
```

Jakobsen GDC 2001 talk: Advanced Character Physics [http://www.floatingorigin.com/mirror/jakobsen\\_01.shtml](http://www.floatingorigin.com/mirror/jakobsen_01.shtml)



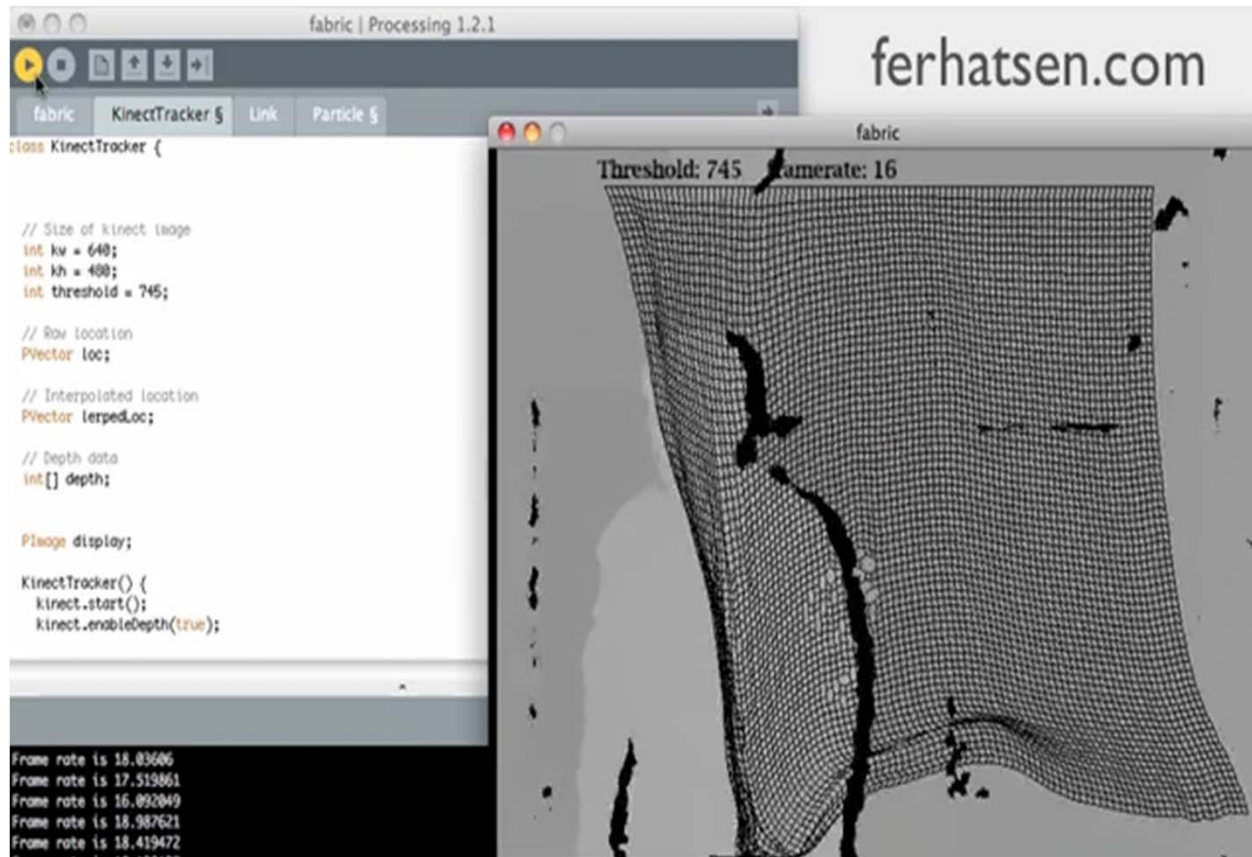
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# MASS SPRING SYSTEM FOR CLOTH

See Curtain Demo

# OPEN THE CURTAIN



Kinect + Cloth video by Ferhat Sen <http://vimeo.com/20964926>

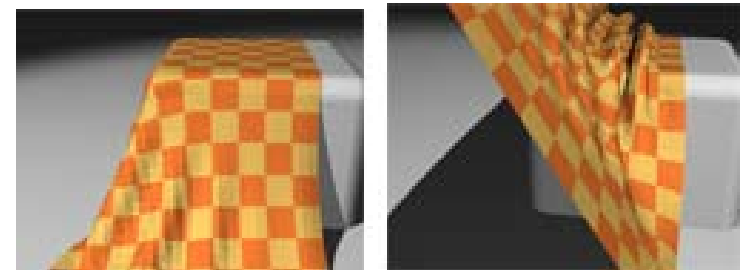
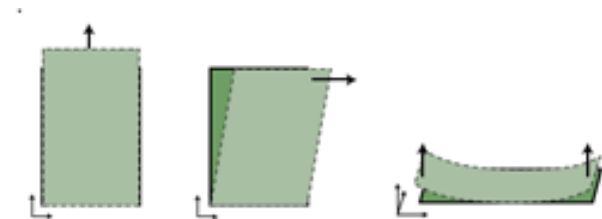
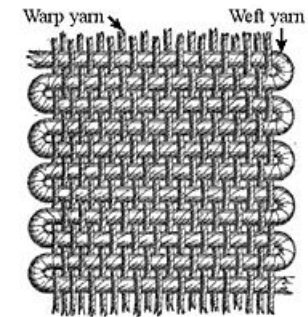
Based on Curtain demo by Jared Counts. <http://www.openprocessing.org/sketch/20140>

# CLOTH

Flexible material consisting of a network of natural or artificial fibres

## Basic behaviour:

- Stretch/Compression: Displacement along warp or weft direction.
  - Can't compress at all.
  - Stretched to a limit of ~ 10 percent.
- Shear: Displacement along diagonal directions.
- Bend: Curvature of cloth surface.
  - Easy to bend.
- Drape
- Wrinkle/Buckling



Yalcin & Yaldiz, Techniques for animating cloth, Lecture Notes. Bilkent University. 2009.



# PROPERTIES OF CLOTH

**Hard to simulate because it has,**

- Many primitives and/or nodes within the model
- High degree of freedom at those nodes
- Not perfectly elastic, has stiffness against stretch
- Variety of properties.



**Collision detection response is also hard: thin object, self collisions**

**Must decide between Simple Model vs. Realism.**

**Often modelled as elastically deformable solids**

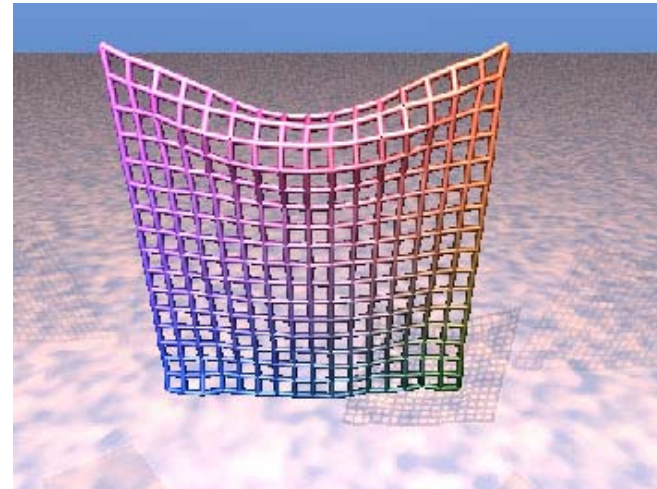
- However cloth behaviour is different from normal elastic models: Non linear response to strain

Yalcin & Yaldiz, Techniques for animating cloth, Lecture Notes. Bilkent University. 2009.

# MASS-SPRING CLOTH SIMULATION

Provot [Provot95]: a lattice of springs chosen in a grid structure to model deformable dynamic properties.

- Springs are good for linear strain representation
- Not quite enough to capture 2d/3d elastic behaviour e.g. Shear & Bulk Modulus
  - Need to account for this some other way!

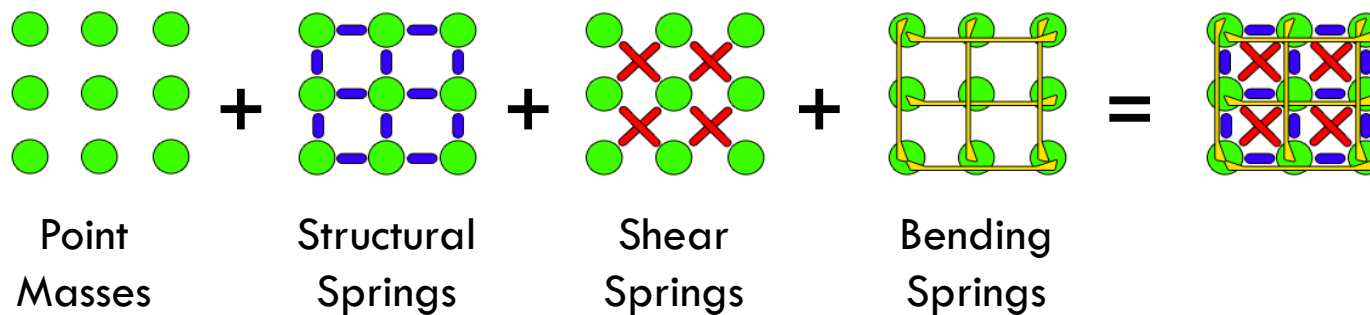


[Provot95] Provot. X, "Deformation constraints in a mass-spring model to describe rigid cloth behaviour" Graphics Interface 1995.

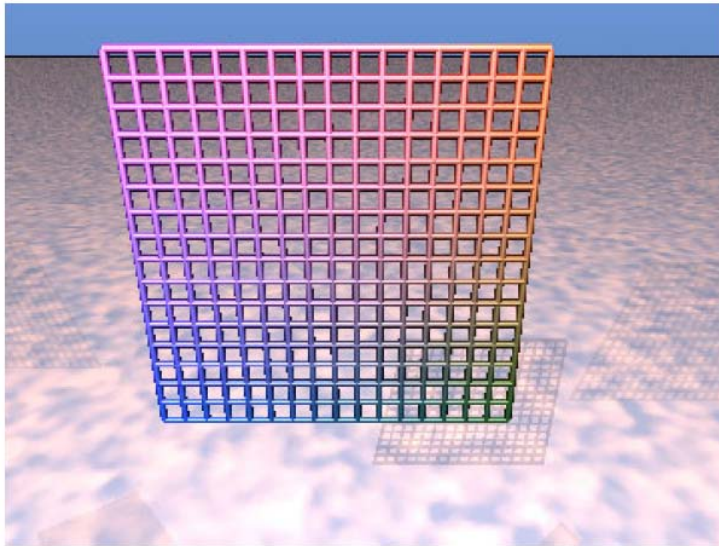
# MASS-SPRING SYSTEM FOR CLOTH

Point masses e.g. Particle system:

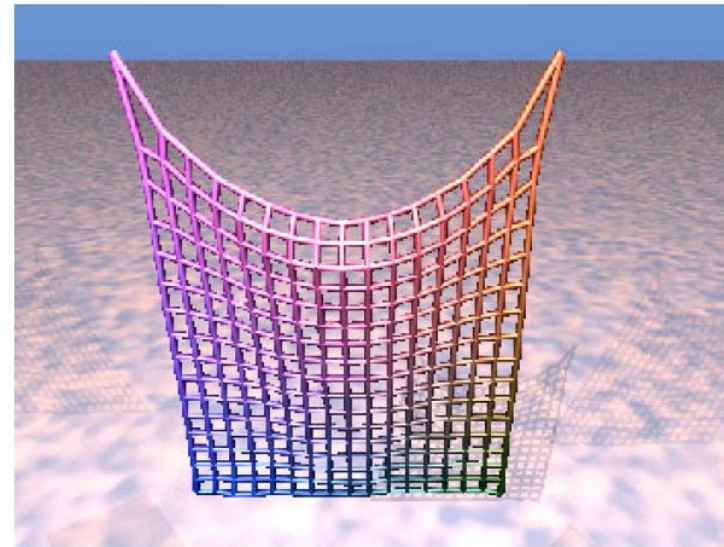
- Specify distance constraint using flexible spring model:
  - Structural** springs : adjacent springs, resist stretching/compression. Typically high  $k_s$
  - Shear** springs : diagonals on grid, resist shearing
  - Bend** (flexion) springs : between every 2nd or 3rd particle, Resist bending



# PROBLEMS WITH BASIC MODEL



(a) Initial position



(b) After 200 iterations

## Problems:

- Edge springs stretch more than other springs: locally concentrated deformation (super-elasticity) ~ unrealistic, high oscillation
- Hard to associate constants (e.g. bend) with real physical parameters

# INCREASING STIFFNESS

Obvious solution to reducing super elastic effect but has problems

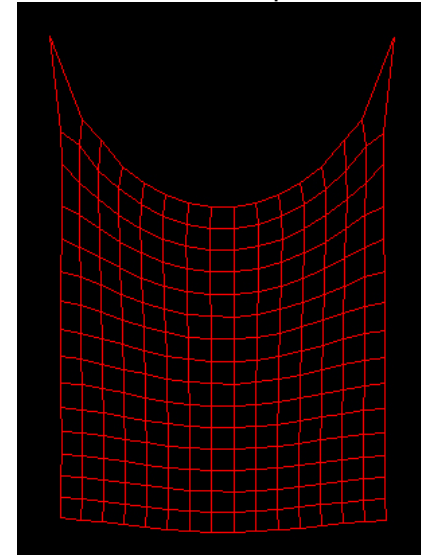
High stiffness can lead to instability (Provot uses explicit integration):

- Must take more shorter time steps to ensure stability
- Leads to more processing time for same length of animation
- For a stiffness value  $k_S$  of a mass  $\mu$ , and a natural period of oscillation defined as

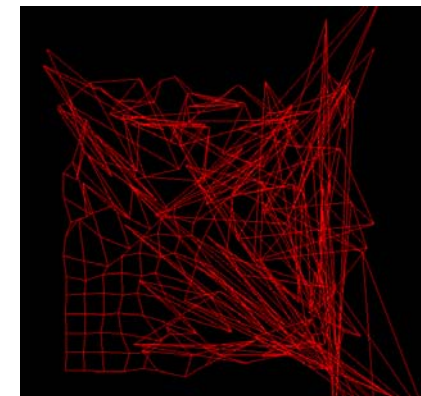
$$T_0 \approx \pi \sqrt{\frac{\mu}{k_S}}$$

the timestep  $\Delta t$  must be less than  $T_0$

Small timestep



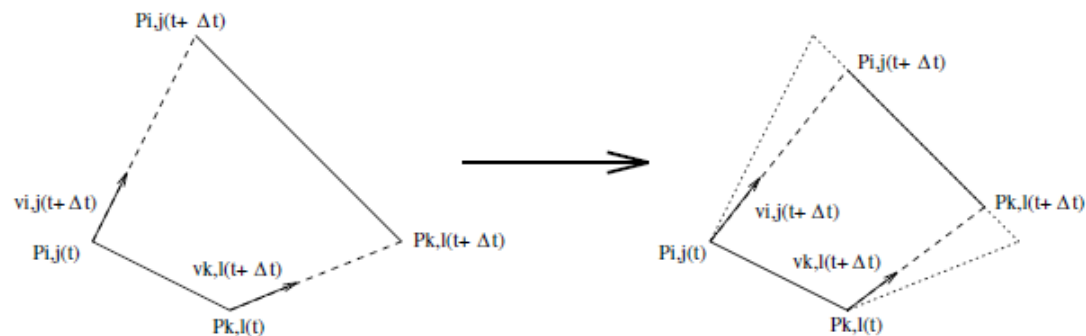
Large timestep



# CONSTRAINING DEFORMATIONS

## The “Rigid Cloth” Technique [Provot95]

- **Goal:** avoid super elastic effect without excessively decreasing  $\Delta t$
- **Solution:**
  - Simulate Mass-spring systems as usual
  - Calculate deformation rate of each spring
  - Iff deformation rate > critical deformation rate  $\tau_c$ 
    - Apply “dynamic inverse procedure” to limit deformation to  $\tau_c$
    - e.g. If  $\tau_c = 0.1$ , springs should not ever exceed 110% length



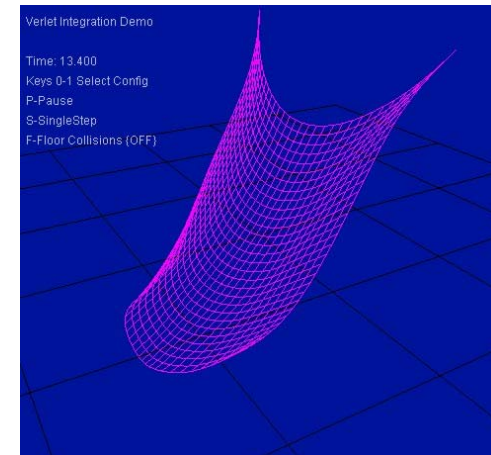
Adjustment of a “super-elongated” spring linking two loose masses [Provot 95].

# PRACTICAL EXAMPLE

```

void SatisfyConstraints()
{
    const int numIterations = 10;
    for (int i=0; i<numIterations; i++)
    {
        for (int k=0; k< m_numConstraints; k++)
        {
            // Constraint 1 (Floor)
            if (g_floorCollisions)
                for (int v=0; v<m_numPoints; v++)
                {
                    if (m_points[v].curPos.y < 0.0f) m_points[v].curPos.y = 0.0f;
                }
            // Constraint 2 (Cloth)
            Constraint* c = &m_constraints[k];
            D3DXVECTOR3& p0 = m_points[c->index0].curPos;
            D3DXVECTOR3& p1 = m_points[c->index1].curPos;
            D3DXVECTOR3 delta = p1-p0;
            float len = D3DXVec3Length(&delta);
            float diff = (len - c->restLength) / len;
            p0 += delta*0.5f*diff;
            p1 -= delta*0.5f*diff;
        }
        // Keep these two points constraints to there original position
        float gap = g_gap;
        m_points[0].curPos = D3DXVECTOR3(0, g_disOffFloor, 0);
        m_points[g_width-1].curPos = D3DXVECTOR3((g_width-1)*gap, g_disOffFloor, 0);
    }
}

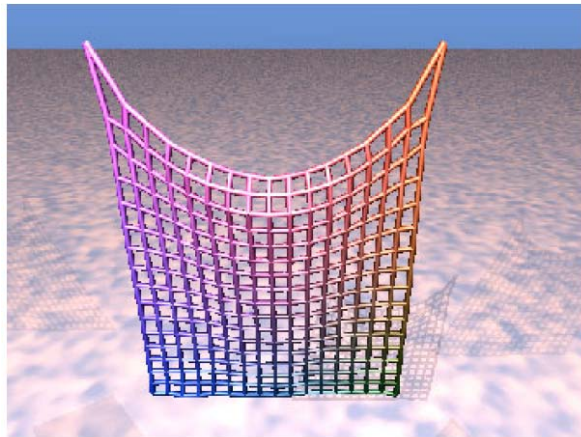
```



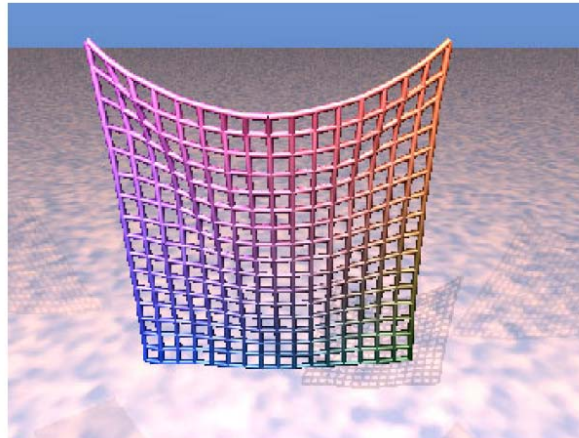


# RESULTS (1)

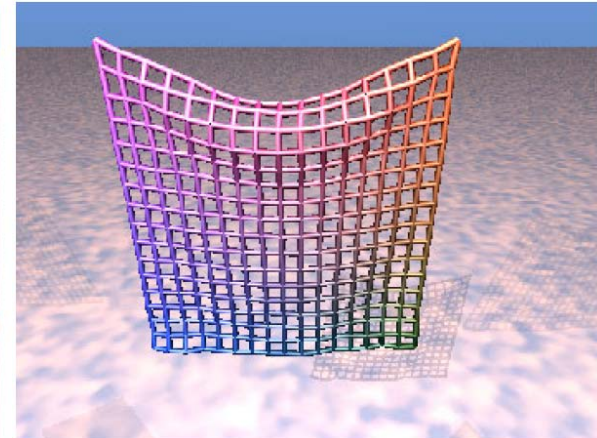
After 200 frames of animation



No constraints



Constraints Applied  
to structural springs

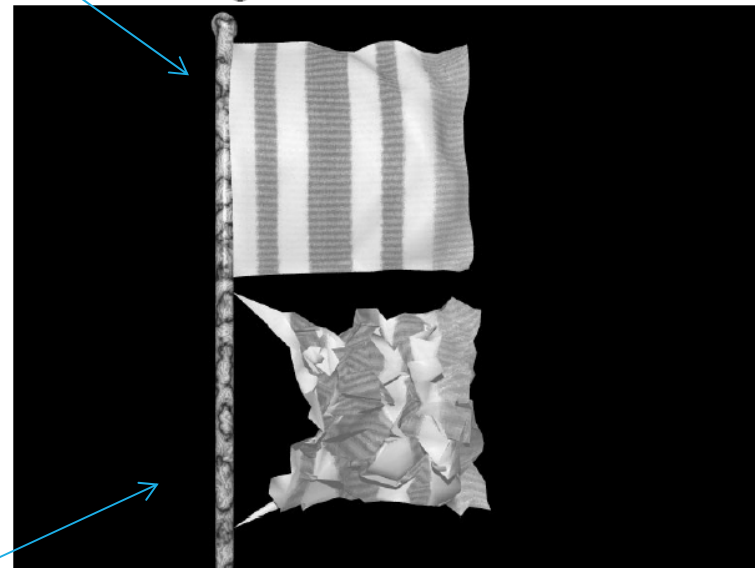
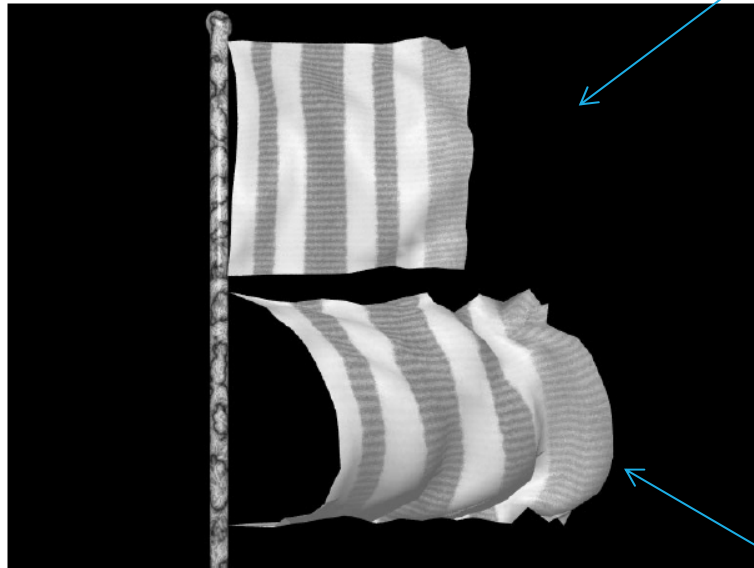


With Constraints applied to  
structural and shear springs



## RESULTS (2)

“Rigid” Technique  $\tau_C = 0.05$



Basic Spring-Mass

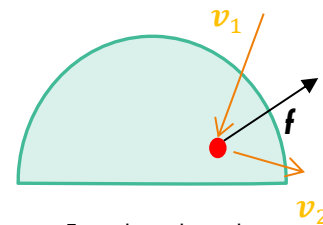
**Low Stiffness**

**High Stiffness**

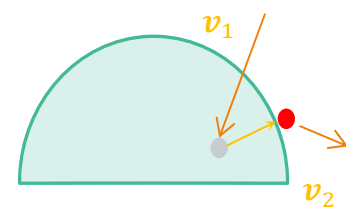
# OTHER TECHNIQUES

## Position based dynamics

- For cloth and other deformable objects
- Omit velocity layer deal with positions directly: Somewhat related to verlet + constraints discussed earlier
- Manipulate positions to satisfy constraints e.g.
  - if penetration is detected, instead of applying a force or impulse, move objects to enforce non-interpenetration and update to appropriate velocities



Force based: apply collision impulse



Position based: apply constraint and then find correct velocity

Muller et al Position Based Dynamics. VRIPhys 2006.

<http://matthias-mueller-fischer.ch/publications/posBasedDyn.pdf>

# OTHER TECHNIQUES

## Baraff & Witkin: Large time steps in cloth simulation

Uniform triangular mesh

**Continuum model:**  
solve internal energy equations

**Implicit Integration:**  
System of equations solved by modified Conjugate Gradient method

**Adaptive time step:**  
leads to graceful degradation



David Baraff and Andrew Witkin, "Large steps in cloth simulation" SIGGRAPH '98

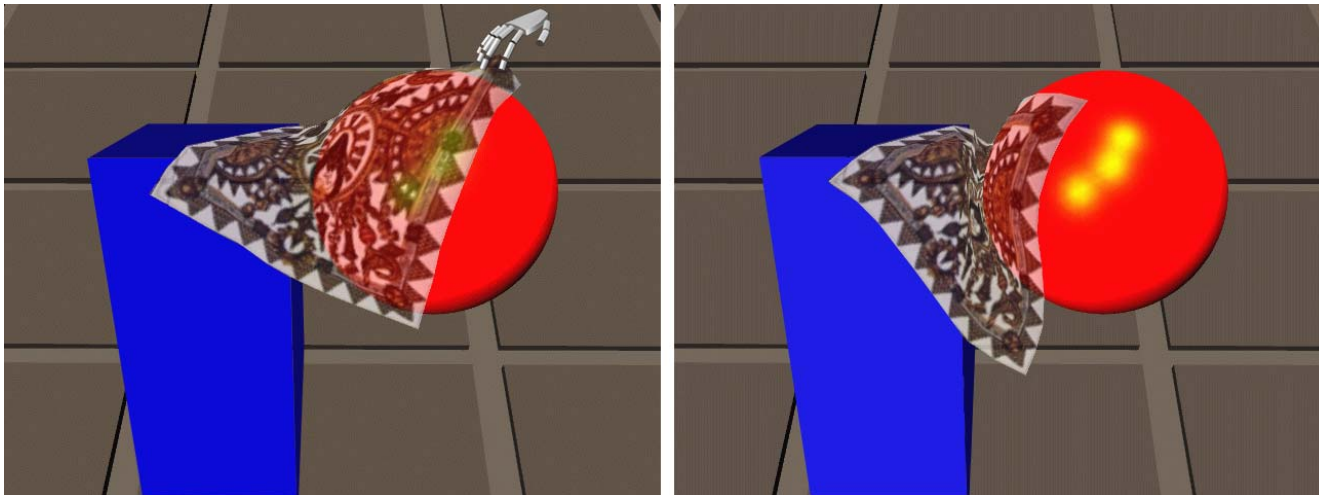
# OTHER TECHNIQUES

Cloth as Inverse Kinematics [Desbrun et al '99]. Hybrid approach:

Mass-spring  
system: Force  
based simulation

Solve with Inverse  
Kinematics to  
ensure stiffness

Implicit Euler  
integration



Mathieu Desbrun, Peter Schroder, and Alan Barr. "Interactive animation of structured deformable objects" In *Proceedings Graphics interface 1999*.

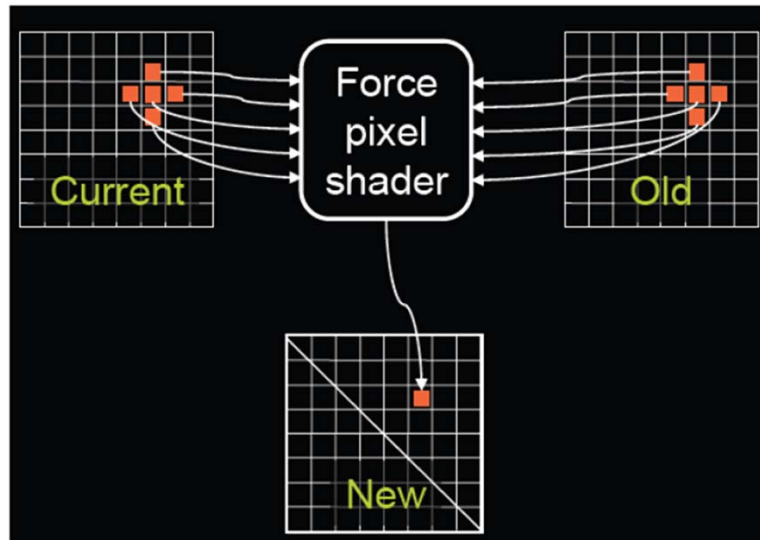
# OTHER TECHNIQUES

## Cloth on the GPU

- Particle collision and update can be done in shaders (several papers on this)

### Overview:

- For every particle, apply external forces
- In each relaxation step, for each cloth particle
  - Evaluate the spring constraints and forces
  - For every intersectable scene geometry, check for collisions and solve collisions by moving the particle out of collided volume.



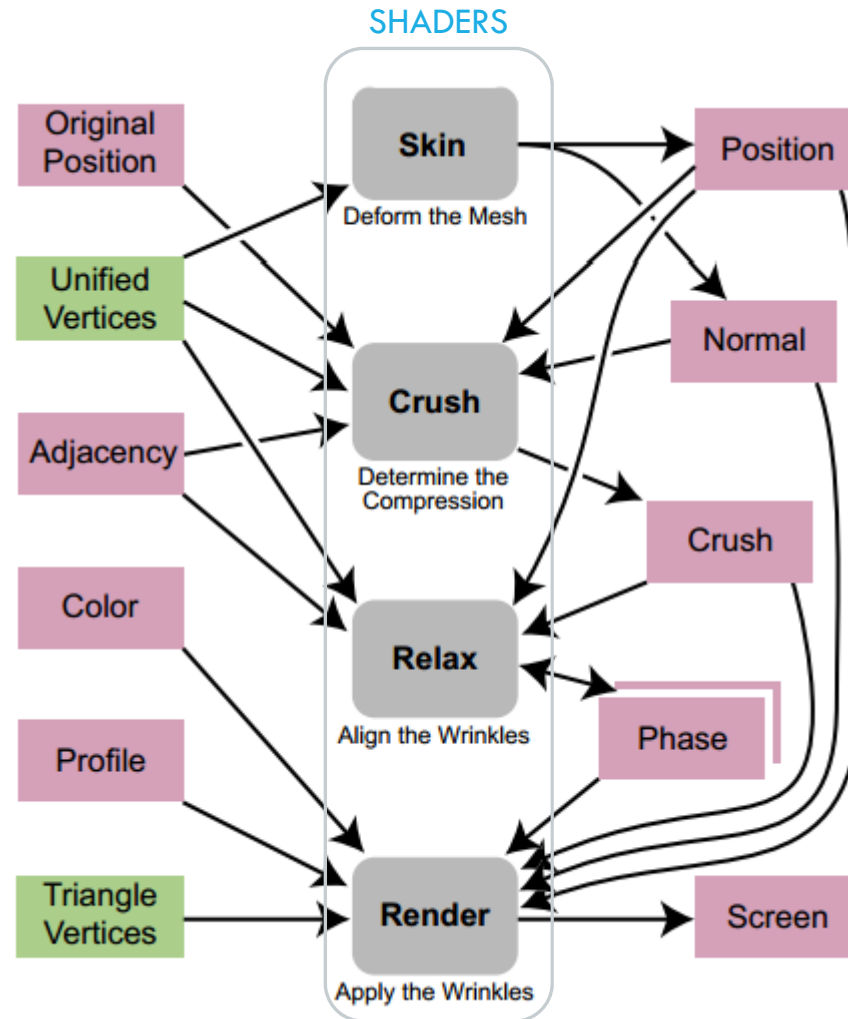
- Cloth is stored as a texture where each pixel is the position of a cloth vertex.
- 3 rotating textures are used to hold the previous frames, for Verlet integration
- To update cloth, draw a full-screen quad into one of the position textures and do the work in the pixel shader.
- To draw cloth, draw a vertex buffer where each vertex's texture coordinates lookup into the position texture, do lookup in the vertex shader

Cyril Zeller. Cloth Simulation - White Paper, nVidia. <http://portal.acm.org/citation.cfm?id=1187158>  
<http://developer.download.nvidia.com/whitepapers/2007/SDK10/Cloth.pdf>

# OTHER TECHNIQUES

## Geometric solution on GPU

- Assumes tightly stretched over surface ~ apply geometric techniques to fake effects such as wrinkling



Jörn Loviscach. Wrinkling coarse meshes on the GPU. In Proceedings of Eurographics 2006.

# MANY OTHER WORKS: SOME SURVEYS BELOW

N. Magnenat-Thalmann, F.Corder, M.Keckeisen, S.Kimmerle "Simulation of Clothes for Real-time Applications" Eurographics 2004 Tutorials

- <http://cg.cs.uni-bonn.de/en/publications/paper-details/eg-tutorial-2004/>

J. Long, K. Burns, J. Yang. "Cloth Modelling and Simulation – A literature Survey" in Proceedings of the Third international conference on Digital human modelling. 2011

- [http://link.springer.com/chapter/10.1007%2F978-3-642-21799-9\\_35](http://link.springer.com/chapter/10.1007%2F978-3-642-21799-9_35)





# TRY IT YOURSELF: CLOTH SIMULATION

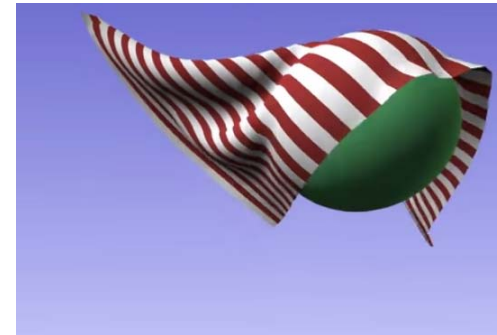
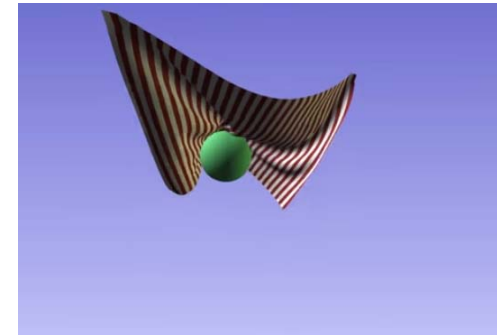
[N.B. Optional. No marks; unless this is chosen as a part of Assignment 6.  
All external resources used should be cited]

## Jesper Mosegaards's Cloth Simulation Tutorial

- Summarizes most of the points discussed here
- Featuring:
  - Particle system
  - Verlet integration
  - Iterative constraint satisfaction
  - Forces e.g. wind
  - Collisions (with sphere)
- <http://cg.alexandra.dk/?p=147>

Also: Ben Kenwright "Position-based Dynamics (e.g. Verlet)" Practical Tutorial, Edinburgh Napier University

- [http://games.soc.napier.ac.uk/study/pba\\_practicals/Practical%2003%20-%20Position%20Based%20Dynamics.pdf](http://games.soc.napier.ac.uk/study/pba_practicals/Practical%2003%20-%20Position%20Based%20Dynamics.pdf)







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The University of Dublin

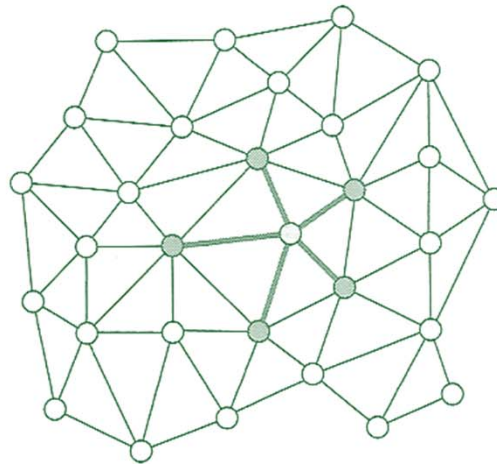
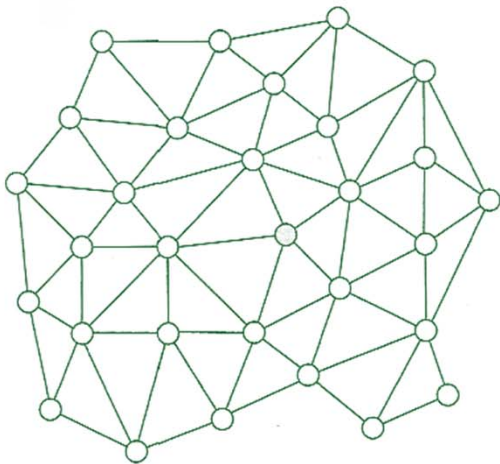


# OTHER MASS SPRING MODELS

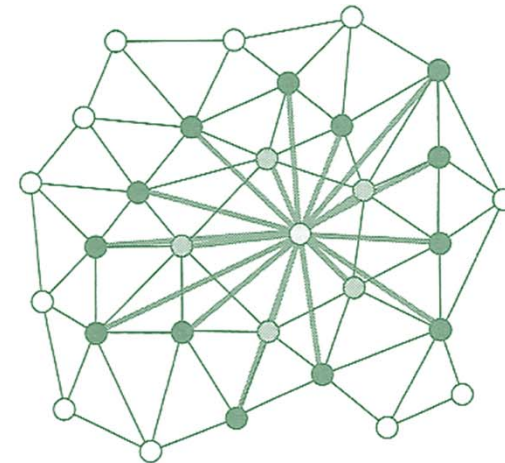
# NON-GRID STRUCTURES

For an unstructured mesh:

- Structural springs correspond to 1-neighbourhood
- Shearing and bending to a 2-neighbourhood

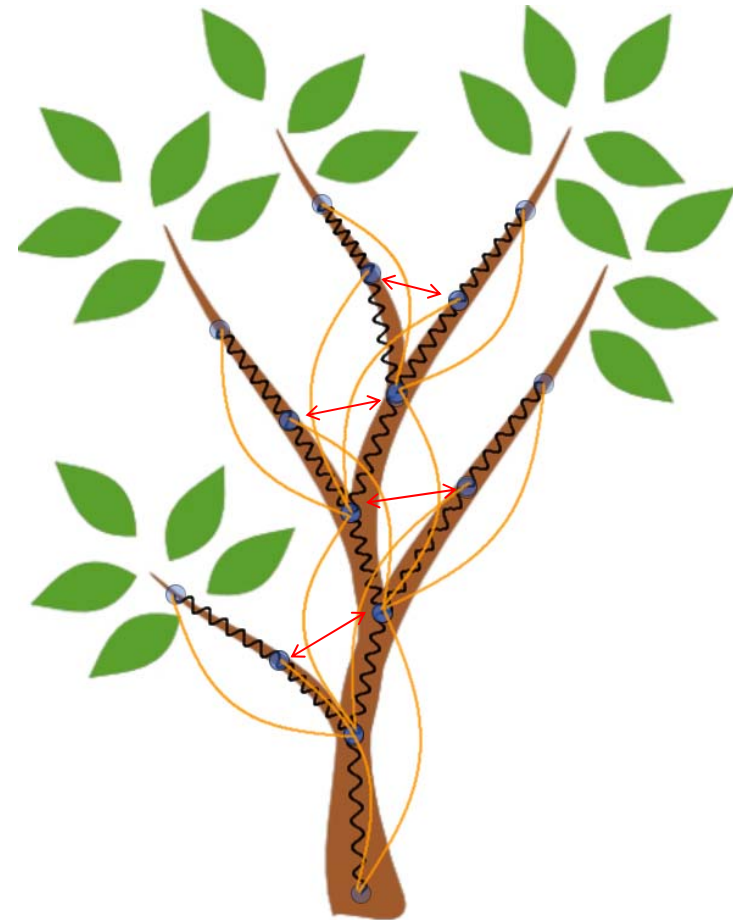
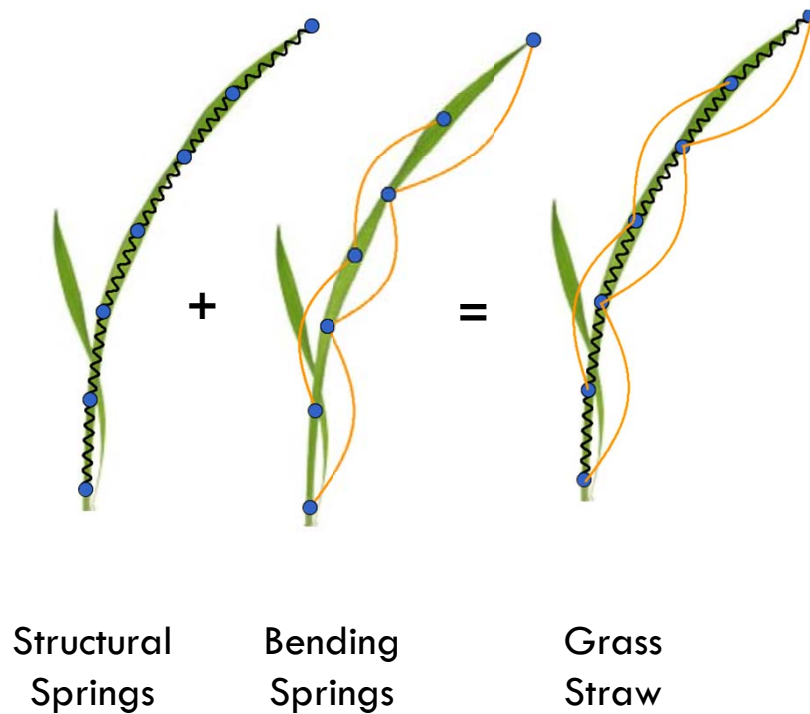


1 - neighbourhood



2 - neighbourhood

# EXAMPLE: PLANTS AND TREES

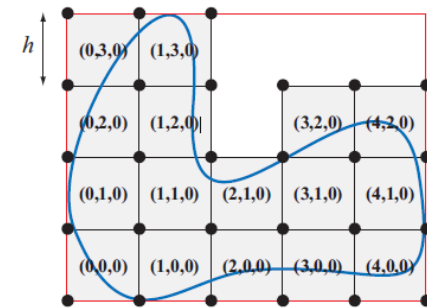
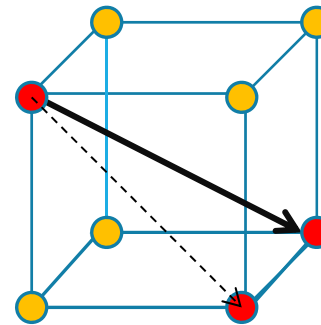


Spring model dynamic  
proxy for a tree

# 3D SOLIDS

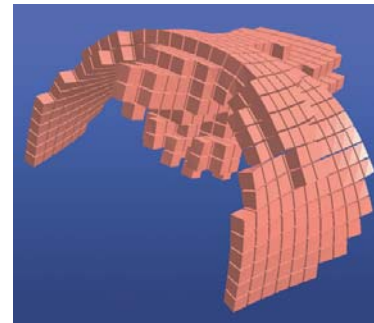
## Discretise object into 3d rectilinear grid (voxels)

- In addition to shearing diagonals we need spatial diagonals that counter volume loss (approximate the bulk modulus)



## Unstructured solid meshes can be voxelised

- Mesh points in between grid nodes are updated by trilinear interpolation



Muller, M., Teschner, M., and Gross, M. Physically-Based Simulation of Objects Represented by Surface Meshes. In *Computer Graphics International* 2004.

# TETRAHEDRAL DECOMPOSITION

Split mesh up into tetrahedra

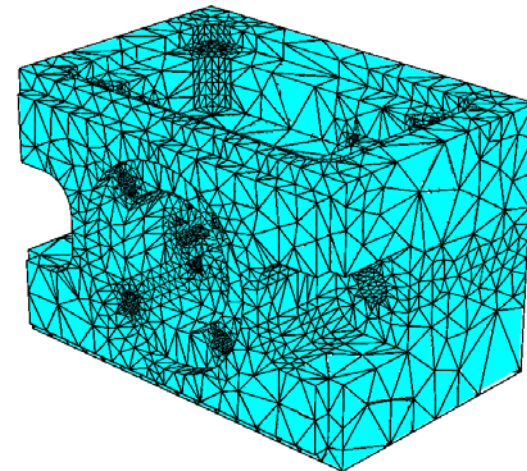
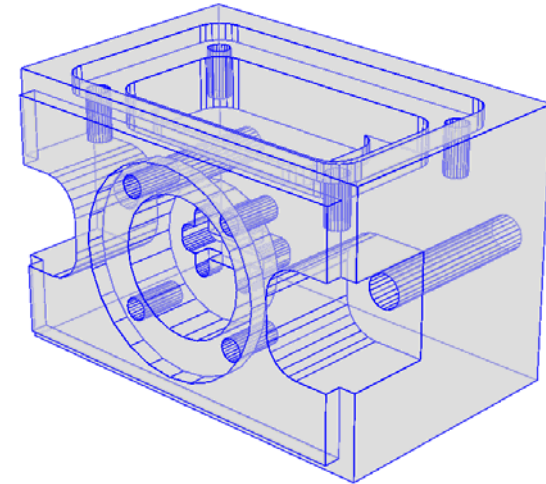
Note that interior details are important (not just surface)

Delaunay tetrahedralization

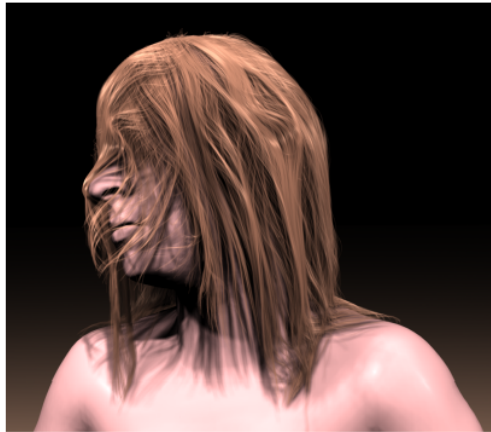
Springs between vertices and 2+ neighbourhoods depending on rigidity

Various tetrahedralization solutions exist

- e.g. tetgen: <http://tetgen.berlios.de/>



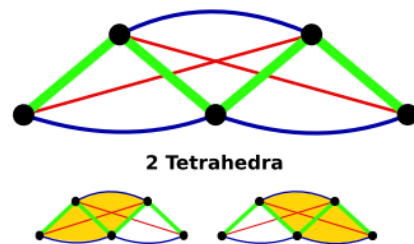
# HAIR SIMULATION



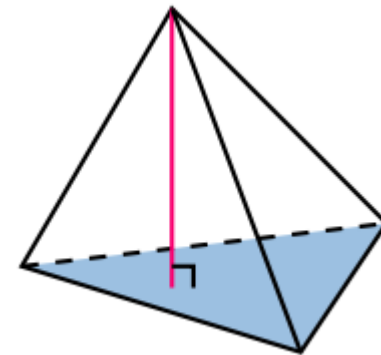
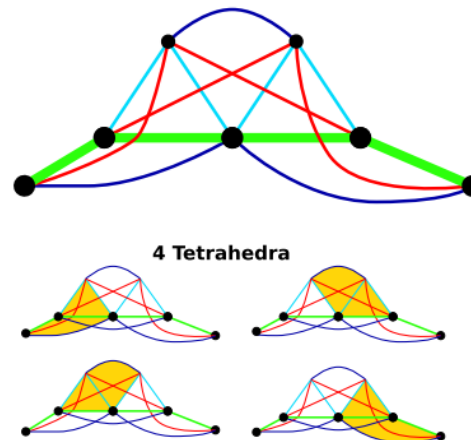
(a) Curly Hair Springs



(b) Straight Hair Springs



- Edge Springs (desired hair curve)
- Extra Edge Springs (form triangles)
- Bending Springs (prevent bend)
- Torsion Springs (prevent twist)
- Tetrahedral Altitude Springs (prevent collapse)



A. Selle, M. Lentine, R. Fedkiw. "A Mass-spring Model for Hair Simulation" Siggraph 2008

# MASS SPRING SYSTEMS

## Advantages:

- Simplicity – e.g. compared to FEM
- Nice extension of particle systems

## Disadvantages:

- Volume preservation + Degenerate cases e.g. inverted tetrahedra
  - some solutions but can be expensive
- Not an accurate representation of complex solids: fine details incorrect
  - Solved with supplementary springs e.g. bending, torsional springs
  - But finding parameter values that fit real-world behaviour is difficult
  - Design of the mass-spring network can be impractical for complex structures



# REQUIRED READING\*

\*questions in Assignment 7 may be based on Required Readings

**Seminal paper on easy spring-mass cloth simulation (N.B. not the first cloth paper):**

- Xavier Provot: "Deformation Constraints in a Mass-Spring Model to Describe Rigid Cloth Behaviour"
  - <http://graphics.stanford.edu/courses/cs468-02-winter/Papers/Rigidcloth.pdf>

**Matthias Mueller – Realtime Physics. Siggraph 2008 Course Notes**

- Chapter 3 Mass-spring Systems: Section 3.1 – 3.6
- <http://www.matthiasmueller.info/realtimephysics/>



# OTHER REFERENCES

D. Baraff. "Implicit Methods for Differential Equations" – Siggraph 2001 Course Notes on Physically Based Modelling. Lecture D.

- <http://www.pixar.com/companyinfo/research/pbm2001/pdf/notesd.pdf>

Ben Kenwright "Position-based Dynamics (e.g. Verlet)" Practical Tutorial, Edinburgh Napier University

- [http://games.soc.napier.ac.uk/study/pba\\_practicals/Practical%2003%20-%20Position%20Based%20Dynamics.pdf](http://games.soc.napier.ac.uk/study/pba_practicals/Practical%2003%20-%20Position%20Based%20Dynamics.pdf)

John. T. Foster. "Brief Explanation of Integration Schemes",

- <http://engineering.utsa.edu/~foster/me4603/files/integration.pdf>

M. Adil Yalçın, Cansin Yıldız "Techniques for animating Cloth" unpublished survey, Bilkent University. 2009.

- <http://www.cs.bilkent.edu.tr/~cansin/projects/cs567-animation/cloth/cloth-paper.pdf>

M. Kauppila. "Implementing the implicit Euler method for mass-spring systems"

- available at: <http://hugi.scene.org/online/hugi28/>

Michael Hauth: "Numerical Techniques for Cloth Simulation" Siggraph 2003 Course Notes (The math required for cloth)

- <http://www.gris.uni-tuebingen.de/people/staff/mhauth/tutorials/Vis03/SIG2003Tut29INumerics.pdf>

# ASSIGNMENT 6 MEETINGS NEXT WEEK

## Monday 16/03/2015

14:00	Xinwei Xiong
14:15	Brendan O'Connor
14:30	Hao Guan
14:45	Tony Cullen
15:00	Yafei Qu
15:15	Fan Li
15:30	Saloni Sharma
15:45	Sarah Noonan

## Thursday 19/03/2015

10:00	Jeremiah Dunne
10:15	Giovanni Campo
10:30	Huangxiang Wang
10:45	Patrick O'Halloran

# TO DO

Check Baraff Notes PBM for integration

Check “Implicit Euler Method for Mass-springs” and see if we can make a slide on this

<http://hugi.scene.org/online/hugi28/hugi%2028%20-%20coding%20corner%20uttumuttu%20implementing%20the%20implicit%20euler%20method%20for%20mass-spring%20systems.htm>

- Some equations in: [http://web.cse.ohio-state.edu/~whmin/courses/cse788-2011-fall/results/KoChih\\_Wang/finalReport.htm](http://web.cse.ohio-state.edu/~whmin/courses/cse788-2011-fall/results/KoChih_Wang/finalReport.htm)

Abstract Slide 22 – see if there are other examples?

Decide on Required Reading