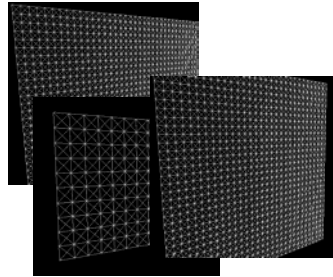


## Modeling Dynamic Deformation with Mass Points and Springs



Matthias Teschner  
Seminar – Wintersemester 02/03

## Outline

### Motivation

#### Model Components

- Mass Points
- Springs
- Forces

#### Computation of the Dynamic Behavior

- Explicit Numerical Integration
- Implicit Numerical Integration
- Higher-Order Numerical Integration

#### Stability and Performance Aspects

- Performance
- Time and Space Adaptive Sampling
- Damping
- Force-Deformation Relationship
- Model Topology

## Deformable Objects

1. Discretization of an object into **mass points**
2. Representation of forces between mass points with **springs**
3. Computation of the dynamics

➔ deformable mass-spring system

Teschner

## Virtual Clothing

- Simulation of cloth based on deformable surfaces (polygonal mesh)
- Realistic simulation of cloth with different fabrics such as wool, cotton or silk for garment design



Baraff



Strasser



Thalmann

## Virtual Clothing



Animation #3

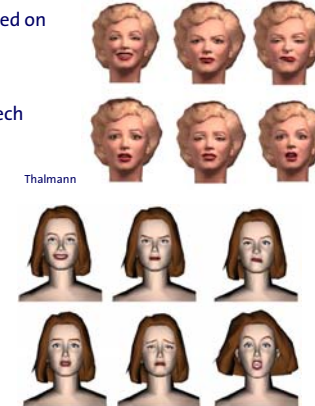
Choi  
Seoul National University

## Facial Animation

- Simulation of facial expressions based on
  - deformable surfaces
  - deformable volumes
  - muscles
- Animation of face models from speech and mimic parameters



Terzopoulos

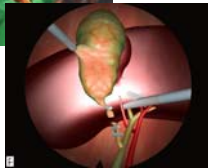


## Medical Simulation

- Simulation of deformable soft tissue
- Surgical planning
- Medical training
- Swiss NCCR Co-Me [www.co-me.ch](http://www.co-me.ch)



Virtual endoscopy



Kuehnappel



Prediction of the surgical outcome in craniofacial surgery

Teschner



Laparoscopic (endoscopic) simulation

Szekely

## Artificial Life

- Simulation of systems consisting of
  - sensors for perception
  - behavioral rules
  - physically-based representation of motor functions



Terzopoulos

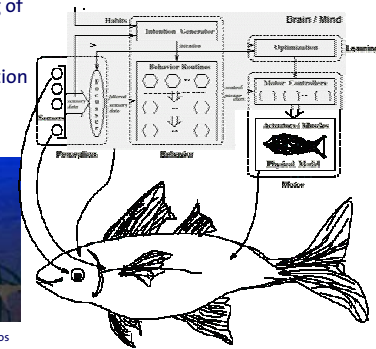
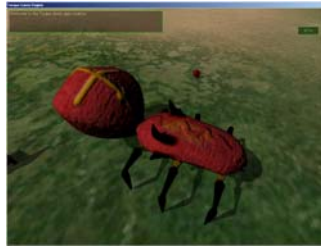


Figure 1: Control and information flow in artificial life.

- Deformable structures are challenging for computer games



Niederberger  
Gross



Mueller  
Novodex

## Motivation

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### Computation of the Dynamic Behavior

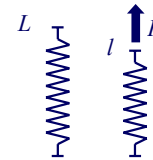
- Explicit Numerical Integration
- Implicit Numerical Integration
- Higher-Order Numerical Integration

### Stability and Performance Aspects

- Performance
- Time and Space Adaptive Sampling
- Damping
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- Model Topology

```
class POINT
{
  public:
    float mass;
    float position[3];
    ...
}
```

Spring stiffness is characterized by  $k$   
Initial spring length  $L$   
Current spring length  $l$



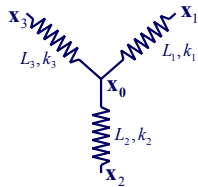
Deformation linear proportional to force:

$$F = k(L - l) \quad \text{Hooke's law}$$

**Elasticity:** Ability of a spring to return to its initial form when the deforming force is removed.

## Forces at Mass Points

### Internal forces $\mathbf{F}^{\text{int}}$



$$\mathbf{F}_0^{\text{int}} = \sum_{i \in \{1,2,3\}} k_i \left( |\mathbf{x}_i - \mathbf{x}_0| - L_i \right) \frac{\mathbf{x}_i - \mathbf{x}_0}{|\mathbf{x}_i - \mathbf{x}_0|}$$

### External forces $\mathbf{F}^{\text{ext}}$

- Gravity
- All forces, which are not caused by springs

### Resulting force at point $i$

$$\mathbf{F}_i = \mathbf{F}_i^{\text{int}} + \mathbf{F}_i^{\text{ext}}$$

## Model - Summary

- **Discretization** of an object into mass points
- Definition of the **connectivity** (topology, adjacencies of mass points)
- **Model parameters:**
  - **Points:** mass, initial position, velocity
  - **Springs:** stiffness, initial length
  - Definition of **external forces** (gravity)

## Outline

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#### Stability and Performance Aspects

- Time and Space Adaptive Sampling
- Damping
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- Model Topology

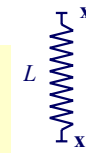
## Static Equilibrium

System of mass points  $\mathbf{X} = (\mathbf{x}_0, \mathbf{x}_1)^T$

$$\mathbf{F}_0^{\text{int}} = k \frac{(|\mathbf{x}_1 - \mathbf{x}_0| - L)}{|\mathbf{x}_1 - \mathbf{x}_0|} (\mathbf{x}_1 - \mathbf{x}_0)$$

$$-\mathbf{KX} = - \begin{pmatrix} k \frac{(|\mathbf{x}_1 - \mathbf{x}_0| - L)}{|\mathbf{x}_1 - \mathbf{x}_0|} & -k \frac{(|\mathbf{x}_1 - \mathbf{x}_0| - L)}{|\mathbf{x}_1 - \mathbf{x}_0|} \\ -k \frac{(|\mathbf{x}_1 - \mathbf{x}_0| - L)}{|\mathbf{x}_1 - \mathbf{x}_0|} & k \frac{(|\mathbf{x}_1 - \mathbf{x}_0| - L)}{|\mathbf{x}_1 - \mathbf{x}_0|} \end{pmatrix} \begin{pmatrix} \mathbf{x}_0 \\ \mathbf{x}_1 \end{pmatrix}$$

Static Equilibrium:  $\mathbf{F}^{\text{int}} = -\mathbf{KX} = \mathbf{F}^{\text{ext}}$



## From Statics to Dynamics

Consideration of **dynamics**

$$-KX = F^{\text{ext}} \quad \longrightarrow \quad 0 = KX(t) + F^{\text{ext}}(t)$$

**Motion equation** for a system of mass points

$$M \frac{d^2 X(t)}{dt^2} = KX(t) + F^{\text{ext}}(t)$$

Incorporation of **damping**

$$M \frac{d^2 X(t)}{dt^2} + D \frac{dX(t)}{dt} = KX(t) + F^{\text{ext}}(t)$$

## Mass-Point Dynamics

**Motion equation** for mass point  $i$  at time point  $t$

$$m_i \frac{d^2 x_i(t)}{dt^2} + \gamma \frac{dx_i(t)}{dt} = F_i$$

mass →  $m_i$   
 position →  $x_i(t)$   
 damping coefficient →  $\gamma$   
 force at mass point →  $F_i$   
 acceleration force →  $\frac{d^2 x_i(t)}{dt^2}$   
 damping force linear proportional to velocity (Stokes friction) →  $\gamma \frac{dx_i(t)}{dt}$

- second-order differential equation
- Newton's equation or motion equation in Lagrange form
- force  $F$  is used for acceleration and damping
- simplified form  $m\mathbf{a} = F$  if damping is neglected

## Rewriting the Problem

Reduction of an second-order differential equation to two **coupled** first-order differential equations.

$$m_i \frac{d^2 x_i(t)}{dt^2} + \gamma \frac{dx_i(t)}{dt} = F_i$$



$$\frac{dx_i(t)}{dt} = v_i(t) \quad \frac{dv_i(t)}{dt} = \frac{F_i(t) - \gamma v_i(t)}{m_i}$$

velocity

acceleration

## Problem

*We have:* Initial position  $\mathbf{x}$   
 Initial velocity  $\mathbf{v}$   
 Derivative of position  $\mathbf{x}$  with respect to time.  
 Derivative of velocity  $\mathbf{v}$  with respect to time.

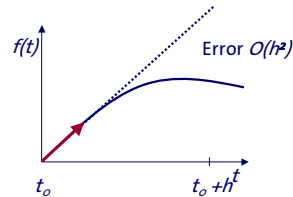
$$\frac{dx_i(t)}{dt} = v_i(t) \quad \frac{dv_i(t)}{dt} = \frac{F_i(t) - \gamma v_i(t)}{m_i}$$

*Goal:* Computation of position  $\mathbf{x}$  over time.

## Explicit Numerical Integration

### Euler Method

Leonard Euler:  
1707 (Basel) – 1783 (Petersburg)



- Initial value  $f(t_0)$
- Compute the derivative at  $t_0$
- Move from  $t_0$  to  $t_0 + h$  using the derivative at  $t_0$

## Euler Method

$$\mathbf{x}'(t) = \mathbf{v}(t) \quad \mathbf{v}'(t) = \frac{\mathbf{F}(t) - \gamma \mathbf{v}(t)}{m}$$

Start with initial values	$\mathbf{x}(t_0) = \mathbf{x}_0 \quad \mathbf{v}(t_0) = \mathbf{v}_0$
Compute	$\mathbf{v}'(t_0) \quad \mathbf{x}'(t_0)$
Assume	$\mathbf{v}'(t) = \mathbf{v}'(t_0) \quad \mathbf{x}'(t) = \mathbf{x}'(t_0) \quad t_0 \leq t \leq t_0 + h$
Compute	$\mathbf{x}(t_0 + h) = \mathbf{x}(t_0) + h\mathbf{x}'(t_0) = \mathbf{x}(t_0) + h\mathbf{v}(t_0)$
Compute	$\mathbf{v}(t_0 + h) = \mathbf{v}(t_0) + h\mathbf{v}'(t_0) = \mathbf{v}(t_0) + h \frac{\mathbf{F}(t_0) - \gamma \mathbf{v}(t_0)}{m}$

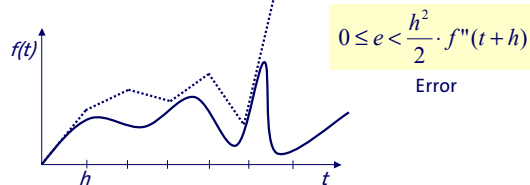
( $\mathbf{F}(t)$  is computed from  $\mathbf{x}(t)$  and external forces!)

## Problems

Numerical integration is **inaccurate**.

$$\underbrace{f(t+h)}_{\text{Euler step}} = \underbrace{f(t) + f'(t)h}_{\text{Error}} + O(h^2) \quad (\text{Taylor series})$$

Inaccuracy can cause **instability**.



## Avoiding Instability?

- No general solution to avoid instability for complex mass-spring systems.
- A smaller time step increases the chance for stability.
- A larger time step speeds up the simulation.
- Parameters and topology of the mass-spring system, and external forces influence the stability of a system.

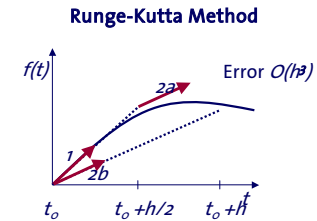
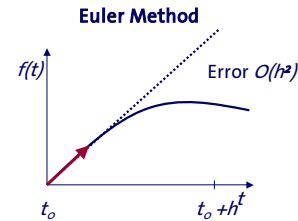
## Improving the Accuracy 1 – Leap-Frog



$$\begin{aligned} \mathbf{v}(t+h/2) &= \mathbf{v}(t-h/2) + h \cdot \mathbf{a}(t) && \text{Error } O(h^2) \\ \mathbf{x}(t+h) &= \mathbf{x}(t) + h \cdot \mathbf{v}(t+h/2) && \text{time step } h \text{ is significantly} \\ &&& \text{larger compared to expl. Euler} \end{aligned}$$

Euler	Leap-Frog
<pre>... addForces(); //F(t) positionEuler(h); //x=x(t+h)=x(t)+hv(t) velocityEuler(h); //v=v(t+h)=v(t)+ha(t) ...</pre>	<pre>initV() // v(o) = v(o) - h/2a(o) ... addForces(h); //F(t) velocityEuler(h); //v=v(t+h)=v(t)+ha(t) positionEuler(h); //x=x(t+h)=x(t)+hv(t+h) ...</pre>

## Improving the Accuracy 2



- Compute the derivative at  $t_0$
- Move to  $t_0 + h/2$
- Compute the derivative at  $t_0 + h/2$
- **Move from  $t_0$  to  $t_0 + h$  using the derivative at  $t_0$**
- **Move from  $t_0$  to  $t_0 + h$  using the derivative at  $t_0 + h/2$**

## Second-Order Runge-Kutta Method (Midpoint Method)



Carl Runge:  
 1856 (Bremen) – 1927 (Goettingen)  
 Wilhelm Kutta:  
 1867 (Pitschen) – 1944 (Fuerstenfeldbruck)

$$\mathbf{x}'(t) = \mathbf{v}(t) \quad \mathbf{a}(\mathbf{x}(t), \mathbf{v}(t)) = \frac{\mathbf{F}(t) - \gamma \mathbf{v}(t)}{m}$$

Compute $\mathbf{v}$ at $t$	$\mathbf{k}_1 = \mathbf{v}(t)$
Compute $\mathbf{a}$ at $t$	$\mathbf{l}_1 = \mathbf{a}(\mathbf{x}(t), \mathbf{v}(t))$
Compute $\mathbf{v}$ at $t+h/2$ (the midpoint)	$\mathbf{k}_2 = \mathbf{v}(t) + \mathbf{l}_1 \frac{h}{2}$
Compute $\mathbf{a}$ at $t+h/2$ with $\mathbf{x}$ and $\mathbf{v}$ at $t+h/2$	$\mathbf{l}_2 = \mathbf{a}\left(\mathbf{x}(t) + \mathbf{k}_1 \frac{h}{2}, \mathbf{k}_2\right)$
Compute $\mathbf{x}$ at $t+h$ with its velocity at $t+h/2$	$\mathbf{x}(t+h) = \mathbf{x}(t) + h\mathbf{k}_2$
Compute $\mathbf{v}$ at $t+h$ with the acceleration at $t+h/2$	$\mathbf{v}(t+h) = \mathbf{v}(t) + h\mathbf{l}_2$

## Comparison



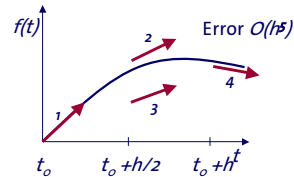
Euler Method	Runge-Kutta Method
<ul style="list-style-type: none"> <li>• <b>One</b> computation of the derivative per time step</li> <li>• Error <math>O(h^2)</math></li> </ul>	<ul style="list-style-type: none"> <li>• <b>Two</b> computations of the derivative per time step</li> <li>• Error <math>O(h^3)</math></li> <li>• Allows larger time steps</li> </ul>

$$0 \leq e < \frac{h^n}{n} \cdot f^{(n)}(x)$$

- Accuracy of Runge-Kutta per time step is higher.
- Computational complexity similar if time step for Runge-Kutta is twice the time step for Euler.
- Does Runge-Kutta really allow faster simulations of mass-spring systems?

## Fourth-Order Runge-Kutta Method

- Compute the derivative at  $t_o$  (1)
- Move from  $t_o$  to  $t_o + h/2$  using the derivative at  $t_o$  (1)
- Compute the derivative at  $t_o + h/2$  (2)
- Move from  $t_o$  to  $t_o + h/2$  using the derivative at  $t_o + h/2$  (2)
- Compute the derivative at  $t_o + h/2$  (3)
- Move from  $t_o$  to  $t_o + h$  using the derivative at  $t_o + h/2$  (3)
- Compute the derivative at  $t_o + h$  (4)
- Compute a weighted average of all derivatives (1) – (4) and use this value to move from  $t_o$  to  $t_o + h$



## Implementation

- Euler Method**
- **Straightforward**
  - Compute spring forces
  - Add external forces
  - Update positions
  - Update velocities

- Runge-Kutta Method**
- Compute spring forces
  - Add external forces
  - Compute **auxiliary** positions and velocities
    - requires additional copies of data
    - once for second-order
    - three times for fourth-order
  - Update positions
  - Update velocities

## Implicit Integration – Theta Scheme

$$\begin{aligned} \mathbf{x}(t+1) &= \mathbf{x}(t) + h((1-\theta) \cdot \mathbf{v}(t) + \theta \cdot \mathbf{v}(t+1)) \\ m \cdot \mathbf{v}(t+1) &= m \cdot \mathbf{v}(t) + h((1-\theta) \cdot \mathbf{F}(t) + \theta \cdot \mathbf{F}(t+1)) \end{aligned}$$

- $\theta = 0$ : *explicit Euler*
- $\theta = 1$ : *implicit Euler*
- $\theta = 0.5$ : *Crank Nicolson*

## Theta Scheme - Implementation

rewriting the problem

$$m \cdot \mathbf{v}(t+h) = m \cdot \mathbf{v}(t) + h \cdot \frac{\mathbf{F}(\mathbf{x}(t)) + \mathbf{F}(\mathbf{x}(t+h)) \cdot \frac{\mathbf{v}(t) + \mathbf{v}(t+h)}{2}}{2}$$

linearization of force

$$\mathbf{F}(\mathbf{x}(t+h) \cdot \frac{\mathbf{v}(t) + \mathbf{v}(t+h)}{2}) \approx \mathbf{F}(\mathbf{x}(t)) + \left. \frac{\partial \mathbf{F}(\mathbf{x})}{\partial \mathbf{x}} \right|_{\mathbf{x}=\mathbf{x}(t)} \cdot h \cdot \frac{\mathbf{v}(t) + \mathbf{v}(t+h)}{2}$$

explicit form for  $\mathbf{v}(t+h)$

$$\left[ m - \frac{h^2}{2} \left. \frac{\partial \mathbf{F}(\mathbf{x})}{\partial \mathbf{x}} \right|_{\mathbf{x}=\mathbf{x}(t)} \right] \cdot \mathbf{v}(t+h) = m \cdot \mathbf{v}(t) + h \cdot \mathbf{F}(\mathbf{x}(t)) + \frac{h^2}{2} \cdot \mathbf{v}(t) \cdot \left. \frac{\partial \mathbf{F}(\mathbf{x})}{\partial \mathbf{x}} \right|_{\mathbf{x}=\mathbf{x}(t)}$$



## Theta Scheme – Conjugate Gradient



- linear system:  $\mathbf{A} \cdot \mathbf{v} = \mathbf{b}$
- gradient of a function  $\nabla f(\mathbf{v}) = \mathbf{A} \cdot \mathbf{v} - \mathbf{b}$   
with  $\nabla f(\mathbf{v}) = 0$
- iterative solution for  $\mathbf{v}$  with initial value  $\mathbf{v}_0$   
Iteration:  $\mathbf{v}_{k+1} = \mathbf{v}_k + \alpha \cdot w(\nabla f(\mathbf{v}_k))$

## Higher-Order Numerical Integration



Integration methods for first-order ODE's	Integration methods for Newton's motion equation
Euler Heun Runge Kutta	Verlet Velocity Verlet Beeman
commonly used in Computer Graphics applications	commonly used in molecular dynamics

## Verlet Integration



$$\begin{aligned}
 \left. \begin{aligned}
 \mathbf{x}(t+h) &= \mathbf{x}(t) + h\mathbf{x}'(t) + \frac{h^2}{2}\mathbf{a}(t) + \frac{h^3}{6}\mathbf{x}'''(t) + O(h^4) \\
 \mathbf{x}(t-h) &= \mathbf{x}(t) - h\mathbf{x}'(t) + \frac{h^2}{2}\mathbf{a}(t) - \frac{h^3}{6}\mathbf{x}'''(t) + O(h^4)
 \end{aligned} \right\} + \\
 \hline
 \mathbf{x}(t+h) &= 2\mathbf{x}(t) + \mathbf{x}(t-h) + h^2\mathbf{a}(t) + O(h^4) \\
 \\
 \mathbf{v}(t) &= \frac{\mathbf{x}(t+h) - \mathbf{x}(t-h)}{2h} + O(h^2)
 \end{aligned}$$

## Other Integration Techniques



### Predictor-Corrector Methods

- Predicts a value from previous derivatives  

$$f(t_0+h) = f(t_0) + \frac{h}{a_1+a_2+a_3} (a_1 f'(t_0) + a_2 f'(t_0-h) + a_3 f'(t_0-2h))$$
- Corrects the value using the derivative from the predicted value (implicit)  

$$f(t_0+h) = f(t_0) + \frac{h}{b_1+b_2+b_3} (b_1 f'(t_0+h) + b_2 f'(t_0) + b_3 f'(t_0-h))$$

### Burlisch-Stoer Methods

- Polynomial function extrapolation based on midpoint method steps
- High accuracy with minimal computational effort
- Bad for non-smooth functions
- Not very promising, but has been used for mass-spring models

## Numerical Integration - Summary



### Motion equation for mass point

- second-order differential equation
- coupled system of first-order differential equation
- derivatives of velocity  $\mathbf{v}$  and position  $\mathbf{x}$  are described

### Numerical integration

- known initial values at a certain time  $t$  for  $\mathbf{v}$  and  $\mathbf{x}$
- approximative integration of  $\mathbf{v}$  and  $\mathbf{x}$  through time
- time step  $h$

### Integration techniques

- Euler, Leap-Frog
- Runge-Kutta
- Crank-Nicolson
- Verlet, velocity Verlet, Beeman
- predictor-corrector
- methods differ in accuracy and computational complexity
- size of time step  $h$  is trade-off between performance and robustness

## Outline



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- Explicit Numerical Integration
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- Performance
- Time and Space Adaptive Sampling
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## How to Measure Performance ?



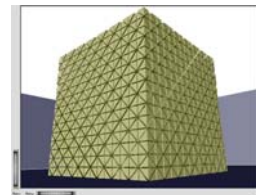
### *It is difficult !*

- Frames per second  
(System updates per real-life second)
  - Commonly used
  - How many mass points?
  - How many springs?
  - Computational expenses for external forces?
  - Other expenses like collision handling and rendering?
  - Which numerical integration technique?
  - What time step?
- Example: 0.1 – 1 s for 10,000 polygons per iteration using various integration techniques [Volino/Thalmann 2001] cloth simulation

## Comparison of Integration Methods



- Synthetic object under gravity
- 22320 springs (16875 tetras)



Method	time step [ms]	comp. time [ms]	ratio
expl. Euler	0.5	9.3	0.05
Heun	2.9	27.5	0.1
RK2	3.8	18.9	0.2
impl. Euler	49.0	172.0	0.28
RK4	17.0	50.0	0.34
Verlet	11.5	8.5	1.35

Intel Pentium 4, 2GHz

## Performance - Example



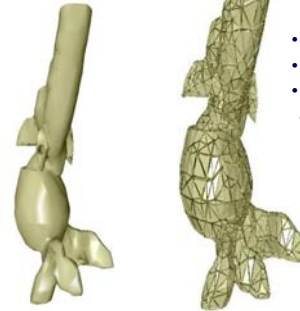
Uterus

1349 mass points  
6888 springs

- Numerical integration time step **5 ms**
- Computational time **1.8 ms**
- Performed tasks in a simulation environment per second
  - 450 integrations a 1.8 ms
  - 450 collision handlings a 0.2 ms
  - 23 visualizations a 1.7 ms

## Performance - Example

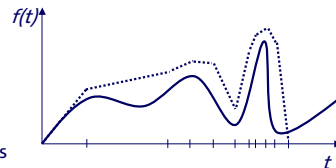
2949 mass points  
15713 springs



Vessel

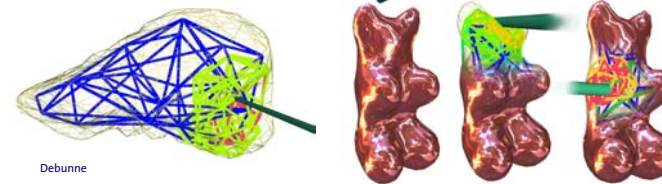
- Numerical integration time step **1.9 ms**
- Computational time **6.1 ms**
- Performed tasks in a simulation environment per second
  - 135 integrations a 6.1 ms
  - 135 collision handlings a 1.1 ms
  - 7 visualizations a 3.7 ms

## Adaptive Time Steps



- Minimizing computational expenses by adaptively choosing time steps
- Small time steps if forces at mass points change significantly
- Larger time steps if forces do not change much
- Computational overhead for tracking force changes
- Example:
  - Free falling sphere does not require small time steps.
  - Any collision would require smaller time steps.
  - Early detection of force changes necessary.

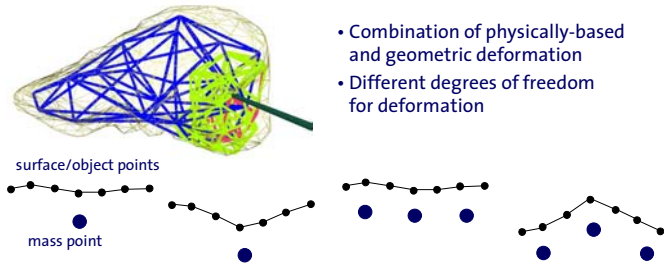
## Space Adaptive Sampling



Debunne

- Hierarchical model representation (coarse sampling to fine sampling)
- Different numbers of mass points for different modeling accuracies
- Allows to focus the computational load on interesting regions
- Problem: How to define regions of interest
- Problem: Relation between simulated mass points and object points

## Space Adaptive Sampling



- Combination of physically-based and geometric deformation
- Different degrees of freedom for deformation

- Definition of rules to switch between level of details in certain areas
- Update of the relation between mass points and surface points.

## Space Adaptive Sampling

### Dynamic Real-Time Deformations using Space-Time Adaptive Sampling

paper #235

Debunne  
Desbrun  
Coti  
Barr

## Damping

Damping is a force usually linear proportional to  $\mathbf{v}^n$  in opposite direction

- Coulomb  $\mathbf{F} \sim \mathbf{v}^0$  not applied for mass-spring systems
- Stokes  $\mathbf{F} \sim \mathbf{v}$  uniform damping, **preferred**
- Newton  $\mathbf{F} \sim \mathbf{v}^2$  non-uniform damping

- Models the real fact, that friction costs energy
- Smoothens variations in velocities and positions of mass points
- Reduces instability risk

It is not intended to bound velocities and positions!  
Not the magnitude, but variations influence the stability!

## Point Damping

- Force at a point is used for acceleration and damping

$$m_i \frac{d^2 \mathbf{x}_i(t)}{dt^2} + \gamma \frac{d \mathbf{x}_i(t)}{dt} = \mathbf{F}_i$$

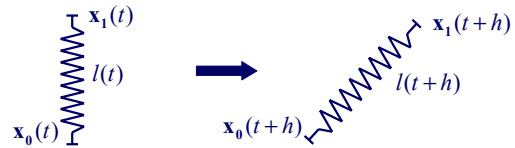
- Damping force is applied in opposite direction to the velocity of the point

$$\frac{d \mathbf{v}_i(t)}{dt} = \frac{\mathbf{F}_i(t) - \gamma \mathbf{v}_i(t)}{m_i}$$

damping force

- Example: Falling mass point has a maximum speed, when gravity and damping are in an equilibrium

## Spring Damping



- Damping force proportional to the velocity of the spring

$$F_1(t) = -\gamma \frac{l(t+h) - l(t)}{h} \frac{(x_1(t) - x_0(t))}{|x_1(t) - x_0(t)|}$$

- Damps relative movements of mass points
- Reduces internal oscillations of the mass-spring model
- Requires computation of auxiliary point positions
- Problem: Which force direction is correct?

## Force-Deformation Relationships

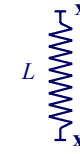
- Definition of forces which work against deformation
- No deformation -> no force

$$F_0^{\text{int}} = k \left( |x_1 - x_0| - L \right) \frac{x_1 - x_0}{|x_1 - x_0|}$$

$$F_0^{\text{int}} = k \left( |x_1 - x_0|^2 - L^2 \right) \frac{x_1 - x_0}{|x_1 - x_0|^2}$$

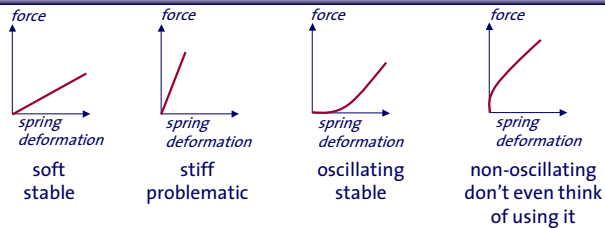
$$F_0^{\text{int}} = k \left( \frac{|x_1 - x_0| - L}{L} \right)^n \frac{x_1 - x_0}{|x_1 - x_0|}$$

*n* odd ! Why ?



- Various computational complexity
- Influence on the function, which is integrated

## Spring Properties and Stability



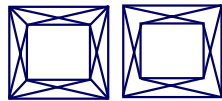
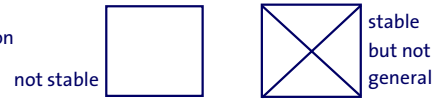
- Behavior of force-deformation relation strongly influences stability.
- It's difficult to simulate stiff structures.
- It's difficult to represent non-oscillating deformable structures.
- Human soft tissue
  - Large forces should be handled.
  - No oscillations

## Model Properties and Stability

- Two different sets of parameters (mass and stiffness) for the same topology
- Higher stiffness difficult to handle

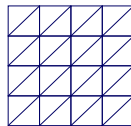
## Topology and Stability –2D



- Stable model topologies with respect to deformation



stable  
can be generated automatically by copying the surface to an inner layer and connecting both – **layered model**

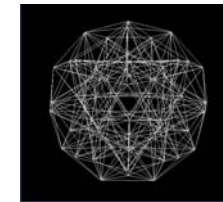
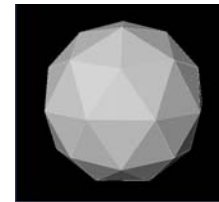
- Design problem



much more resistant in  direction than in  direction.

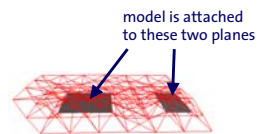
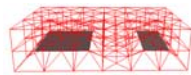
## Topology and Stability –3D

- Triangulated sphere surface
- Edges represented by springs
- Stable sphere model represented with two layers of springs
- Inner layer is a copy of the surface
- Both layers are connected by springs
- Stable, but many springs, many forces, computational expensive

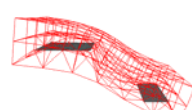
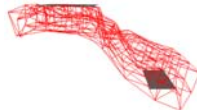
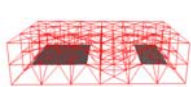


## Topology - Ambiguity Problem

- Unappropriate topology
- No force penalty for shearing
- Diagonal springs are missing



- Appropriate topology
- However, self-collision problem



original

equilibrium 1

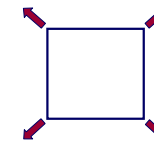
equilibrium 2

## Topology and Stability –2D

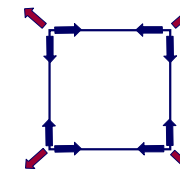
- Generating **pre-strained** models for stability



relaxed,  
not stable



additional  
forces



new stable?  
equilibrium

### Problems:

- New equilibrium does not represent given model geometry.
- Initiated forces are dependent on surface changes and object transformation.
- Initiated forces could be bound to surface normals.

## Volumetric Models

2949 mass points  
10257 tetras  
15713 springs



1349 mass points  
4562 tetras  
6888 springs



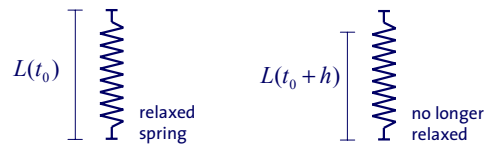
## Performance Aspects - Summary

- Performance is difficult to assess!
- Varying time steps
- Model hierarchies, coarse to fine point sampling
- Point and spring damping.
- Force-deformation relationship. Soft and oscillating models are robust.
- Topology. How to connect mass points in an appropriate way?  
Influence on the stability of the numerical integration
- Topology. How to avoid too many springs?  
Influence on the performance of the numerical integration

## Other Forces

- Induction of internal forces by falsifying the initial spring length

$$L(t) = \text{const} \rightarrow L(t) = f(t)$$



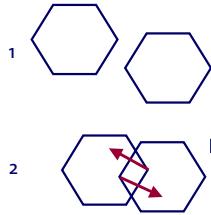
- Simulation of muscle contraction (or fishes)
- $L(t)$  has to be smooth for stability

## Penalty Forces

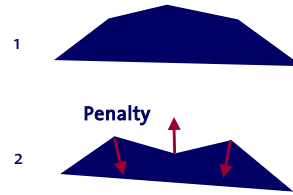
- Penalty forces are additional momentum conserving external forces at mass points.
- Penetration of a mass point into another object can cause a penalty force to resolve the collision.
- Volume variation of basic volumetric elements can cause forces to preserve volume.
- Surface changes can cause penalty forces at mass points to preserve certain characteristics of the surface.
- Proper relation of penalty, internal, and other external forces has to be considered.
- Penalty force functions should be appropriate for numerical integration.

## Penalty Forces

### Collision



### Surface changes



## Dynamic Deformation - Summary

- **Discretization** of an object into mass points
- Definition of the **connectivity** (topology, adjacencies of mass points, layers)
- **Model parameters:**
  - **Points:** masses, initial positions, initial velocities
  - **Springs:** force-deformation relationship and its parameters (stiffness)
  - **Damping:** points and/or springs (Stokes and/or Newton)
  - **External and penalty forces:** definition of these forces over time
  - **Restrictions:** fixed points, restricted movement

## Dynamic Deformation - Summary

- **Numerical integration technique:**
  - Euler, Leap-Frog
  - Runge Kutta
  - Crank-Nicolson
  - Verlet, Beeman
  - Predictor-corrector methods
- **Consider performance aspects!**
- **Find an appropriate time step to solve your specific problem !**

## Outline

### Motivation

#### Model Components

Mass Points  
Springs  
Forces

#### Computation of the Dynamic Behavior

Explicit Numerical Integration  
Implicit Numerical Integration  
Higher-Order Numerical Integration

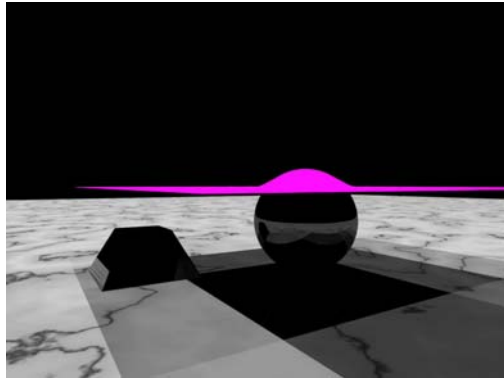
#### Stability and Performance Aspects

Performance  
Time and Space Adaptive Sampling  
Damping  
Force-Deformation Relationship  
Model Topology

#### Movies



## Cloth Simulation

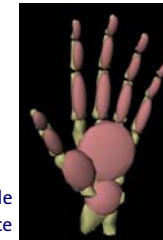


Fedkiw  
Stanford University

## Hand Simulation



Articulated  
bone  
structure



Deformable  
pulp space

Sibille / Teschner / Latombe



Generic skin model

## A few References

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