

CS 283

Advanced Computer Graphics

Simulation Basics

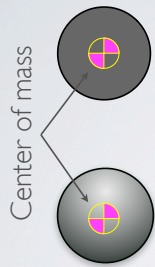
James F. O'Brien

Associate Professor
U.C. Berkeley

A Rigid Body

- A solid object that does not deform
 - Consists of infinite number of infinitesimal mass points...
 - ...that share a single RB transformation
 - Rotation + Translation (no shear or scale)
$$\mathbf{x}^W = \mathbf{R} \cdot \mathbf{x}^L + \mathbf{t}$$
 - Rotation and translation vary over time
 - Limit of deformable object as $k_s \rightarrow \infty$

A Rigid Body



In 2D:
Translation 2 “directions”
Rotation 1 “direction”
3 DOF Total

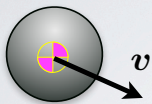
In 3D:
Translation 3 “directions”
Rotation 3 “direction”
6 DOF Total

Translation and rotation are *decoupled*

2D is boring... we'll stick to 3D from now on...

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Translational Motion



Just like a point mass:

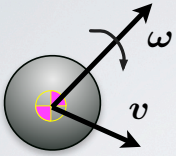
$$\dot{\mathbf{p}} = \mathbf{v}$$

$$\dot{\mathbf{v}} = \mathbf{a} = \mathbf{f}/m$$

Note: Recall discussion on integration...

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Rotational Motion



Rotation gets a bit odd, as well see...

Rotational “position” \mathbf{R}

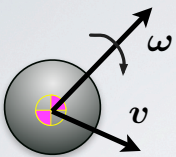
Rotation matrix
Exponential map
Quaternions

Rotational velocity $\boldsymbol{\omega}$

Stored as a vector
(Also called angular velocity...)
Measured in radians / second

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Rotational Motion



Kinetic energy due to rotation:

“Sum energy (from rotation) over all points in the object”

$$E = \int_{\Omega} \frac{1}{2} \rho \dot{\mathbf{x}} \cdot \dot{\mathbf{x}} \, du$$

$$E = \int_{\Omega} \frac{1}{2} \rho ([\boldsymbol{\omega} \times] \mathbf{x}) \cdot ([\boldsymbol{\omega} \times] \mathbf{x}) \, du$$

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Rotational Motion

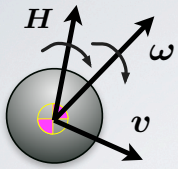


Figure is a lie if this
really is a sphere...

Angular momentum
Similar to linear momentum
Can be derived from rotational energy

$$\mathbf{H} = \partial \mathbf{E} / \partial \boldsymbol{\omega}$$

$$\mathbf{H} = \int_{\Omega} \rho \mathbf{x} \times \dot{\mathbf{x}} \, du$$

$$\mathbf{H} = \int_{\Omega} \rho \mathbf{x} \times (\boldsymbol{\omega} \times \mathbf{x}) \, du$$

$$\mathbf{H} = \left(\int_{\Omega} \dots \, du \right) \boldsymbol{\omega}$$

“Inertia Tensor” not
identity matrix...

$$\mathbf{H} = \mathbf{I} \boldsymbol{\omega}$$

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Inertia Tensor

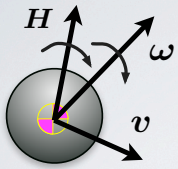
$$\mathbf{I} = \int_{\Omega} \rho \begin{bmatrix} y^2 + z^2 & -xy & -xz \\ -xy & z^2 + x^2 & -yz \\ -xz & -yz & x^2 + y^2 \end{bmatrix} du$$

See example for simple shapes at
<http://scienceworld.wolfram.com/physics/MomentofInertia.html>

Can also be computed from polygon models by transforming
volume integral to a surface one.
See paper/code by Brian Mirtich.

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Rotational Motion



Conservation of momentum:

$$\mathbf{H}^W = \mathbf{I}^W \boldsymbol{\omega}^W$$

$$\mathbf{H}^W = \mathbf{R} \mathbf{I}^L \mathbf{R}^T \boldsymbol{\omega}^W$$

Figure is a lie if this really is a sphere...

$$\dot{\mathbf{H}}^W = \dot{\mathbf{R}} \mathbf{I}^L \mathbf{R}^T \boldsymbol{\omega}^W + \mathbf{R} \mathbf{I}^L \dot{\boldsymbol{\omega}}^W + \mathbf{R} \mathbf{I}^L \mathbf{R}^T \boldsymbol{\alpha}^W$$

$$\dot{\mathbf{H}}^W = 0$$

$$\dot{\mathbf{R}} = \boldsymbol{\omega} \times \mathbf{R} \quad \boldsymbol{\alpha}^W = (\mathbf{R} \mathbf{I}^L \mathbf{R}^T)^{-1} (-\boldsymbol{\omega}^W \times \mathbf{H}^W)$$

In other words, things wobble when they rotate.

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Rotational Motion

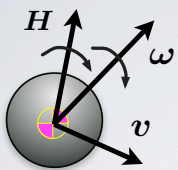


Figure is a lie if this really is a sphere...

$$\dot{\mathbf{R}} = [\boldsymbol{\omega} \times] \mathbf{R}$$

$$\dot{\boldsymbol{\omega}} = \boldsymbol{\alpha}$$

$$\boldsymbol{\alpha}^W = (\mathbf{R} \mathbf{I}^L \mathbf{R}^T)^{-1} ((-\boldsymbol{\omega}^W \times \mathbf{H}^W) + \boldsymbol{\tau})$$

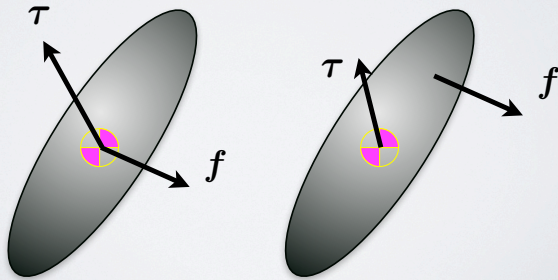
$$\boldsymbol{\tau} = \mathbf{f} \times \mathbf{x}$$

Take care when integrating rotations, they need to stay rotations.

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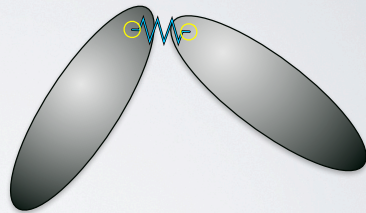
Couples

- A force / torque pair is a couple
 - Also a wrench (I think)
- Many couples are equivalent



Constraints

- Simplest method is to use spring attachments
 - Basically a penalty method



- Spring strength required to get good results may be unreasonably high
 - There are ways to cheat in some contexts...

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Constraints

- Articulation constraints
 - Spring trick is an example of a full coordinate method
 - Better constraint methods exist
 - Reduced coordinate methods use DOFs in kinematic skeleton for simulation
 - Much more complex to explain
- Collisions
 - Penalty methods can also be used for collisions
 - Again, better constraint methods exist

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A Simple Spring

- Ideal **zero**-length spring



The diagram shows two grey circular points connected by a zigzag line representing a spring. The left point is labeled 'a' and the right point is labeled 'b'.

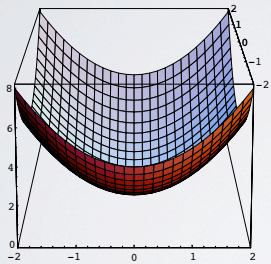
$$\mathbf{f}_{a \rightarrow b} = k_s(\mathbf{b} - \mathbf{a})$$
$$\mathbf{f}_{b \rightarrow a} = -\mathbf{f}_{a \rightarrow b}$$

- Force pulls points together
- Strength proportional to distance

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A Simple Spring

- Energy potential



$$E = 1/2 k_S (\mathbf{b} - \mathbf{a}) \cdot (\mathbf{b} - \mathbf{a})$$

$$\mathbf{f}_{a \rightarrow b} = k_S (\mathbf{b} - \mathbf{a})$$

$$\mathbf{f}_{b \rightarrow a} = -\mathbf{f}_{a \rightarrow b}$$

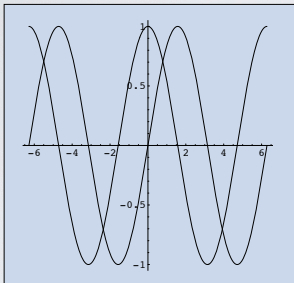
$$\mathbf{f}_a = -\nabla_a E = - \left[\frac{\partial E}{\partial a_x}, \frac{\partial E}{\partial a_y}, \frac{\partial E}{\partial a_z} \right]$$



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A Simple Spring

- Energy potential: kinetic vs elastic



$$E = 1/2 k_S (\mathbf{b} - \mathbf{a}) \cdot (\mathbf{b} - \mathbf{a})$$

$$E = 1/2 m (\dot{\mathbf{b}} - \dot{\mathbf{a}}) \cdot (\dot{\mathbf{b}} - \dot{\mathbf{a}})$$



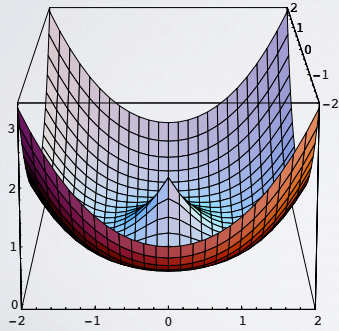
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Non-Zero Length Springs



$$\mathbf{f}_{\mathbf{a} \rightarrow \mathbf{b}} = k_S \frac{\mathbf{b} - \mathbf{a}}{\|\mathbf{b} - \mathbf{a}\|} (\|\mathbf{b} - \mathbf{a}\| - l)$$

Rest length



$$E = k_S (\|\mathbf{b} - \mathbf{a}\| - l)^2$$

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Comments on Springs

- Springs with zero rest length are linear
- Springs with non-zero rest length are nonlinear
 - Force *magnitude* linear w/ displacement (from rest length)
 - Force direction is non-linear
 - Singularity at $\|\mathbf{b} - \mathbf{a}\| = 0$

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Damping

- “Mass proportional” damping



$$\mathbf{f} = -k_d \dot{\mathbf{a}}$$

- Behaves like viscous drag on all motion
- Consider a pair of masses connected by a spring
 - How to model rusty vs oiled spring
 - Should internal damping slow group motion of the pair?
- Can help stability... up to a point

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Damping

- “Stiffness proportional” damping


$$\mathbf{f}_a = -k_d \frac{\mathbf{b} - \mathbf{a}}{\|\mathbf{b} - \mathbf{a}\|^2} (\mathbf{b} - \mathbf{a}) \cdot (\dot{\mathbf{b}} - \dot{\mathbf{a}})$$

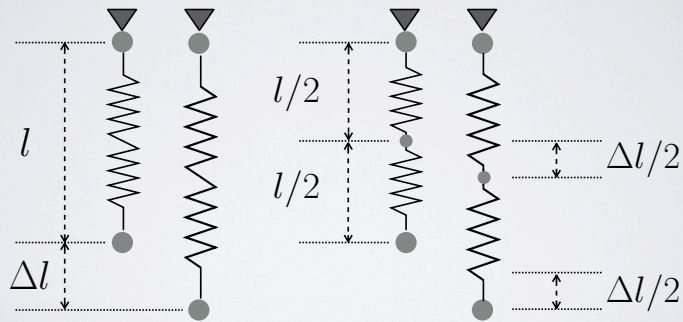
- Behaves viscous drag on change in spring length
- Consider a pair of masses connected by a spring
 - How to model rusty vs oiled spring
 - Should internal damping slow group motion of the pair?

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Spring Constants

- Two ways to model a single spring



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Spring Constants

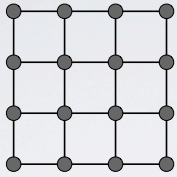
- Constant k_S gives inconsistent results with different discretizations
- Change in length is not what we want to measure
- Strain: change in length as fraction of original length

$$\epsilon = \frac{\Delta l}{l_0} \quad \text{Nice and simple for 1D...}$$

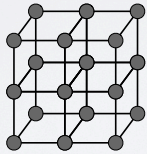
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Structures from Springs

- Sheets



- Blocks

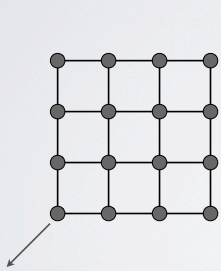


- Others

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Structures from Springs

- They behave like what they are (obviously!)



This structure will not resist shearing

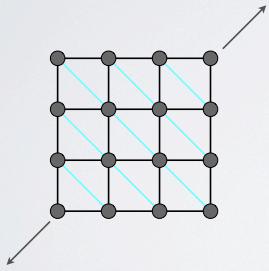
This structure will not resist out-of-plane bending either...

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Structures from Springs

- They behave like what they are (obviously!)



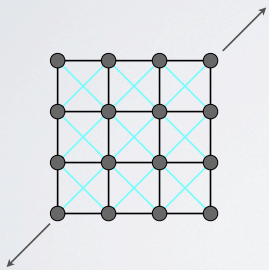
This structure will resist shearing
but has anisotropic bias

This structure still will not resist
out-of-plane bending

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Structures from Springs

- They behave like what they are (obviously!)



This structure will resist shearing
Less bias

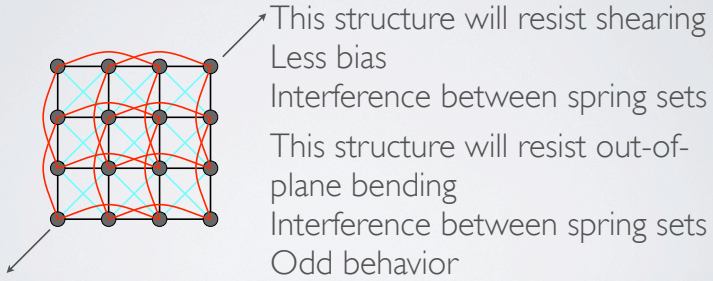
Interference between spring sets

This structure still will not resist
out-of-plane bending

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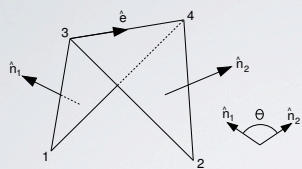
Structures from Springs

- They behave like what they are (obviously!)



How do we set spring constants? 27

Edge Springs



$$u_1 = |E| \frac{N_1}{|N_1|^2} \quad u_2 = |E| \frac{N_2}{|N_2|^2}$$

$$u_3 = \frac{(x_1 - x_4) \cdot E}{|E|} \frac{N_1}{|N_1|^2} + \frac{(x_2 - x_4) \cdot E}{|E|} \frac{N_2}{|N_2|^2}$$

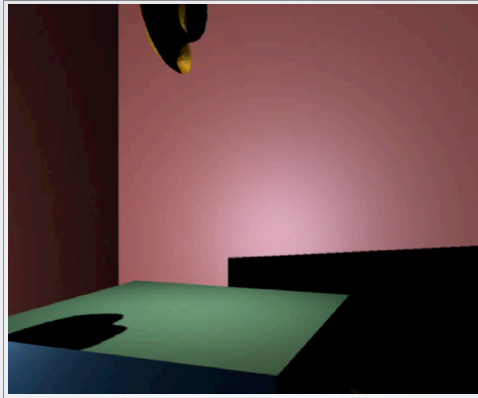
$$u_4 = -\frac{(x_1 - x_3) \cdot E}{|E|} \frac{N_1}{|N_1|^2} - \frac{(x_2 - x_3) \cdot E}{|E|} \frac{N_2}{|N_2|^2}$$

$$F_i^e = k^e \frac{|E|^2}{|N_1| + |N_2|} \sin(\theta/2) u_i$$

From Bridson *et al.*, 2003, also see Grinspun *et al.*, 2003

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Example: Thin Material



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FEM Problem Setup

- Lagrangian Formulation
 - Where in space did this material move to?
 - Commonly used for solid materials
- Eulerian Formulation
 - What material is at this location in space?
 - Commonly used for fluids

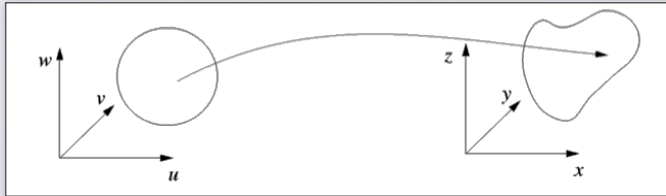
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Problem Setup

- Lagrangian Formulation
 - Where in space did this material move to?
 - Commonly used for solid materials

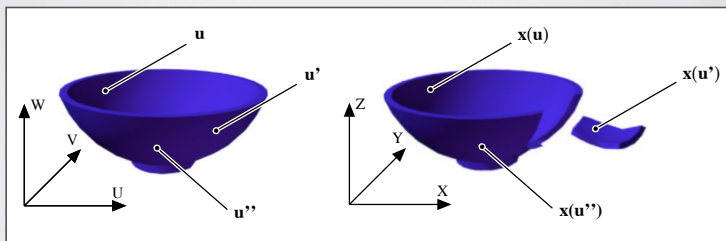
$$\mathbf{x} = \mathbf{x}(\mathbf{u})$$



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Lagrangian Formulation

- Deformation described by mapping from material (local) to world coordinates



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Example



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Another Example



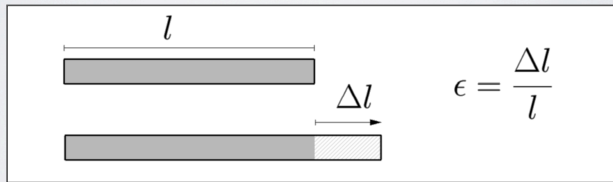
Video footage © LucasArts, used with permission.

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Strain

- Strain measures deformation
- Purely geometric
- Example: simple strain in a bar



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Strain

- Green's strain tensor

$$\epsilon_{ij} = \left(\frac{\partial \mathbf{x}}{\partial u_i} \cdot \frac{\partial \mathbf{x}}{\partial u_j} \right) - \delta_{ij}$$

- Vanishes when not deformed
- Only measures deformation
- Does not depend on the coordinate system

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Strain

- Green's strain tensor

$$\epsilon_{ij} = \left(\frac{\partial \mathbf{x}}{\partial u_i} \cdot \frac{\partial \mathbf{x}}{\partial u_j} \right) - \delta_{ij}$$

$$l_x^2 - l_u^2 = \mathbf{d} \cdot \boldsymbol{\epsilon} \cdot \mathbf{d}$$

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Strain

- Cauchy's strain tensor

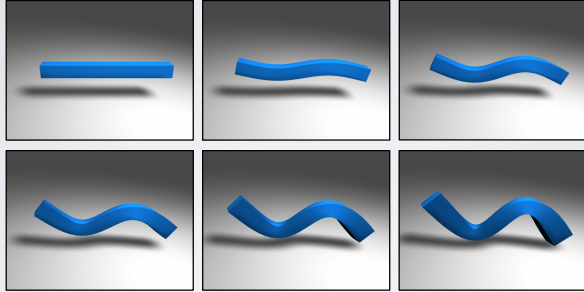
$$\epsilon_{ij} = \frac{1}{2} \left(\frac{\partial x_i}{\partial u_j} + \frac{\partial x_j}{\partial u_i} \right) - \delta_{ij}$$

- Linearization of Green's strain tensor
- Vanishes when not deformed
- *Not invariant w.r.t rotations*

$$l_x - l_u \approx \mathbf{d} \cdot \boldsymbol{\epsilon} \cdot \mathbf{d}$$

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Linearization Errors



We'll fix this problem later..

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Strain Rate

- Time derivative of Green's strain tensor
- Measures rate of deformation
- Used for internal damping

$$\dot{\epsilon}_{ij} = \left(\frac{\partial \dot{\mathbf{x}}}{\partial u_i} \cdot \frac{\partial \dot{\mathbf{x}}}{\partial u_j} \right) + \left(\frac{\partial \dot{\mathbf{x}}}{\partial u_i} \cdot \frac{\partial \mathbf{x}}{\partial u_j} \right)$$

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Strain Rate

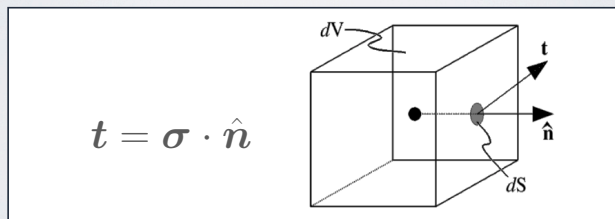
- Time derivative of Cauchy's strain tensor
- Measures rate of deformation
- Used for internal damping

$$\dot{\epsilon}_{ij} = \frac{1}{2} \left(\frac{\partial \dot{x}_i}{\partial u_j} + \frac{\partial \dot{x}_j}{\partial u_i} \right)$$

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Stress

- Stress determines internal forces
- Measures how much material "wants" to return to original shape



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Stress due to Strain

$$\sigma_{ij}^{(\epsilon)} = \sum_{k=1}^3 \lambda \epsilon_{kk} \delta_{ij} + 2\mu \epsilon_{ij}$$

Elastic (Lamé) Constants

(in)compressibility

rigidity

Generalization of
 $f = kd$

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Stress due to Rate

$$\sigma_{ij}^{(\nu)} = \sum_{k=1}^3 \psi \dot{\epsilon}_{kk} \delta_{ij} + 2\psi \dot{\epsilon}_{ij}$$

Damping Constants

ϕ

ψ

Generalization of
 $f = cv$

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Energy Potentials

Elastic Energy Density

$$\eta = \frac{1}{2} \sum_{i=1}^3 \sum_{j=1}^3 \sigma_{ij}^{(\epsilon)} \epsilon_{ij}$$

Generalization of

$$E = \frac{1}{2} k d^2$$

Kinetic Energy Density

$$\kappa = \frac{1}{2} \sum_{i=1}^3 \sum_{j=1}^3 \sigma_{ij}^{(\nu)} \epsilon_{ij}$$

Generalization of

$$E = \frac{1}{2} m v^2$$

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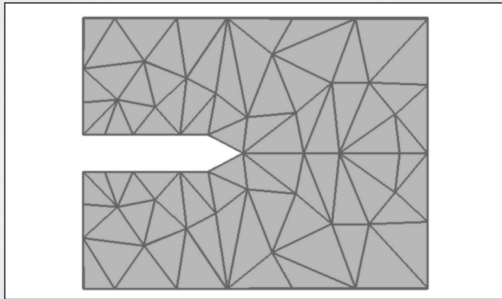
Discretization

- Transition from continuous model to something we can compute with...

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Finite Element Method

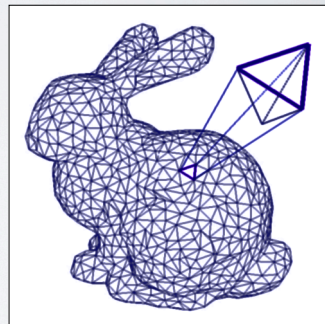
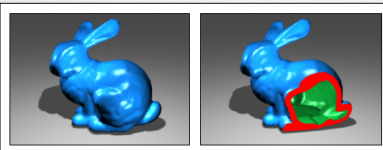
- Disjoint elements tile material domain
- Derivatives from shape functions
- Nodes shared by adjacent elements



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Finite Element Method

- Disjoint elements tile material domain
- Derivatives from shape functions
- Nodes shared by adjacent elements

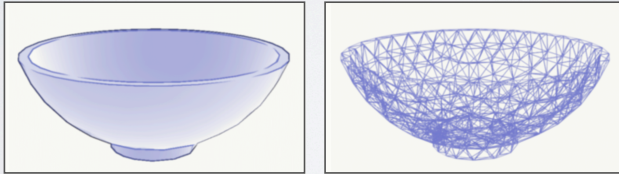


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FEM Discretization

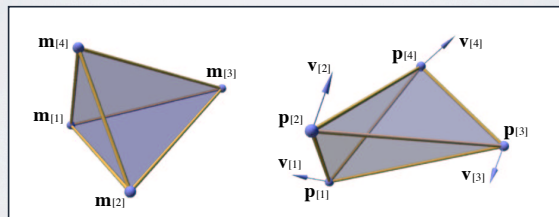
- Solid volumes
- Tetrahedral elements
- Linear shape functions



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FEM Discretization

- Each element defined by four nodes
- \mathbf{m} - location in material (local) coordinates
- \mathbf{p} - position in world coordinates
- \mathbf{v} - velocity in world coordinates



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Element Shape Functions

Barycentric coordinates

$$\begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix} = \begin{bmatrix} m_{[1]} & m_{[2]} & m_{[3]} & m_{[4]} \\ 1 & 1 & 1 & 1 \end{bmatrix} \mathbf{b}$$

Invert to obtain basis matrix

$$\mathbf{b} = \boldsymbol{\beta} \begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix}$$

where

$$\boldsymbol{\beta} = \begin{bmatrix} m_{[1]} & m_{[2]} & m_{[3]} & m_{[4]} \\ 1 & 1 & 1 & 1 \end{bmatrix}^{-1}$$

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Material Derivatives

World pos. as function of material coordinates

$$\mathbf{x}(\mathbf{u}) = \mathbf{P} \boldsymbol{\beta} \begin{bmatrix} \mathbf{u} \\ 1 \end{bmatrix}$$

where

$$\mathbf{P} = [\mathbf{p}_{[1]} \ \mathbf{p}_{[2]} \ \mathbf{p}_{[3]} \ \mathbf{p}_{[4]}]$$

Derivative w.r.t. material coordinates

$$\frac{\partial \mathbf{x}}{\partial u_i} = \mathbf{P} \boldsymbol{\beta}_{\text{col}_i}$$

$$\epsilon_{ij} = \frac{1}{2} \left(\frac{\partial x_i}{\partial u_j} + \frac{\partial x_j}{\partial u_i} \right) - \delta_{ij}$$

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Recall

$$\epsilon_{ij} = \frac{1}{2} \left(\frac{\partial x_i}{\partial u_j} + \frac{\partial x_j}{\partial u_i} \right) - \delta_{ij}$$

$$\sigma_{ij}^{(\epsilon)} = \sum_{k=1}^3 \lambda \epsilon_{kk} \delta_{ij} + 2\mu \epsilon_{ij}$$

$$\eta = \frac{1}{2} \sum_{i=1}^3 \sum_{j=1}^3 \sigma_{ij}^{(\epsilon)} \epsilon_{ij}$$

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Node Forces

- Combine derivative formula w/ equations for elastic energy
- Integrate over volume of element
- Take derivative w.r.t. node positions

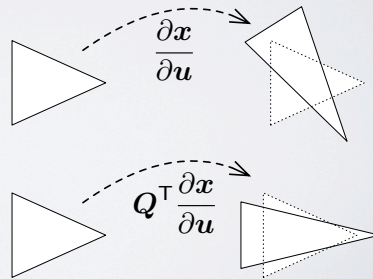
$$\mathbf{f}_{[i]}^{(\epsilon)} = -\frac{\text{vol}}{2} \sum_{j=1}^4 \mathbf{p}_{[j]} \sum_{k=1}^3 \sum_{l=1}^3 \beta_{jl} \beta_{ik} \sigma_{kl}^{(\epsilon)}$$

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Corotational Method

- Factor out rotation using polar decomposition
 - Cauchy strain without errors due to rotations

$$\frac{\partial \mathbf{x}}{\partial \mathbf{u}} \rightarrow \mathbf{Q}\mathbf{F}$$



See paper by Müller & Gross, 2004

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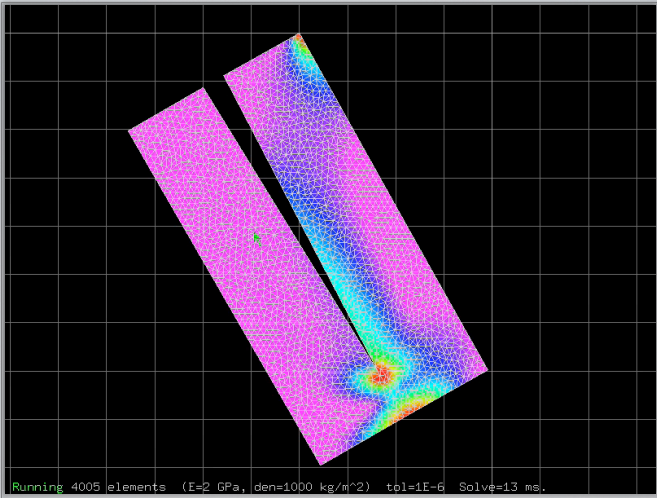
Node Forces and Jacobian

- Combine derivative formula w/ equations for elastic energy
- Integrate over volume of element
- Take derivative w.r.t. node positions
- Jacobian core is constant
 - 12 x 12 made from little 3 x 3 blocks $\mathbf{J}_{[i][j]}$

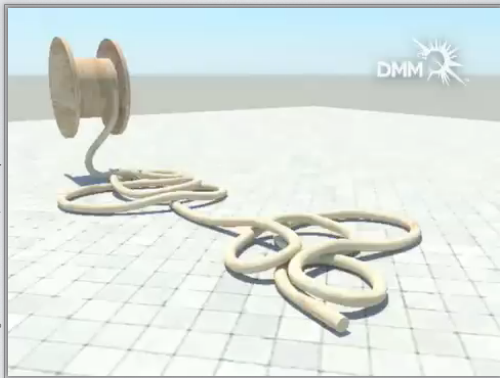
$$\mathbf{f}_{[i]} = \mathbf{Q}\boldsymbol{\sigma}\mathbf{n}_{[i]}$$

$$\mathbf{J}_{[i][j]} = -\mathbf{Q}(\lambda\mathbf{n}_{[i]}\mathbf{n}_{[j]}^T + \mu(\mathbf{n}_{[i]} \cdot \mathbf{n}_{[j]})\mathbf{I} + \mu\mathbf{n}_{[j]}\mathbf{n}_{[i]}^T)\mathbf{Q}^T$$

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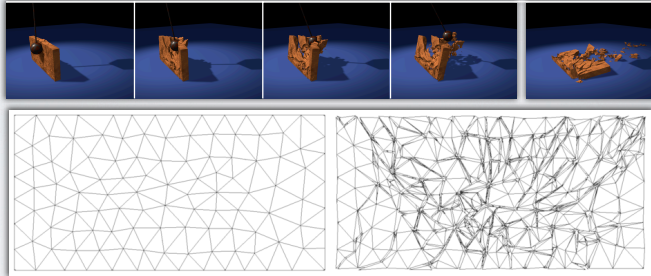


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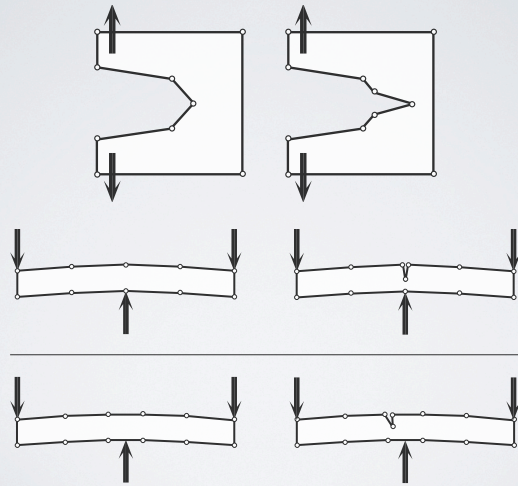
Fracture

- Fracture changes the mesh



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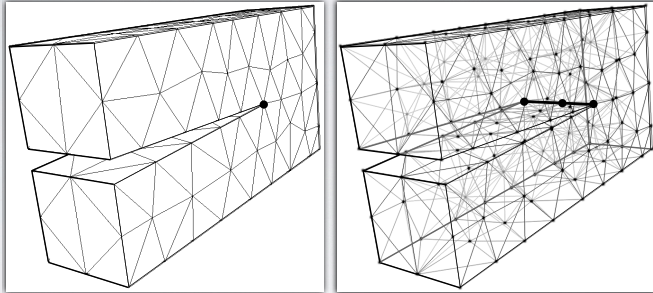
Fracture



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Fracture



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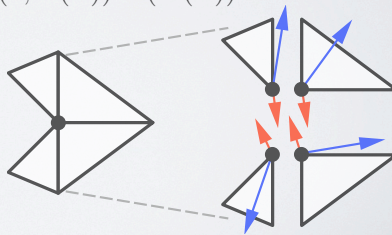
Force Decomposition

- Separate tensile / compressive forces

$$\sigma^+ = \sum_{i=1}^3 \max(0, v^i(\sigma)) \mathbf{m}(\hat{\mathbf{n}}^i(\sigma))$$

$$\sigma^- = \sum_{i=1}^3 \min(0, v^i(\sigma)) \mathbf{m}(\hat{\mathbf{n}}^i(\sigma))$$

$$\mathbf{m}(a) = \begin{cases} a a^T / |a| & : a \neq 0 \\ 0 & : a = 0 \end{cases}$$



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Separation

- Build psuedo-stress at each vertex

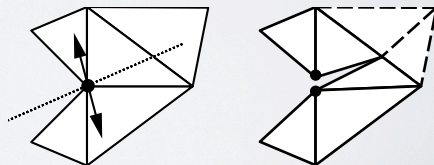
$$\boldsymbol{\varsigma} = \frac{1}{2} \left(-\mathbf{m}(f^+) + \sum_{f \in \{f^+\}} \mathbf{m}(f) + \mathbf{m}(f^-) - \sum_{f \in \{f^-\}} \mathbf{m}(f) \right).$$

- Eigen decomposition describes how material is being “pulled apart” at each vertex.
- If positive eigenvector over threshold \rightarrow fracture

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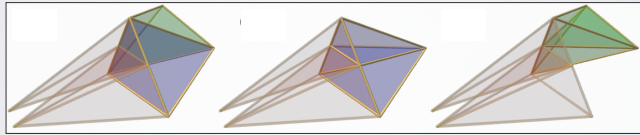
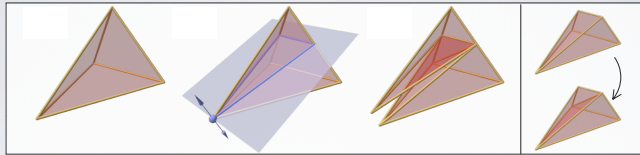
Remeshing

- Remeshing:
 - Fracture plane is normal to max eigenvector
 - Duplicate vertex
 - Split surrounding tetrahedra
(Easily implemented as edge-splits)



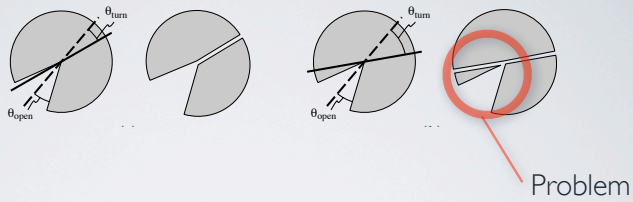
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Remeshing



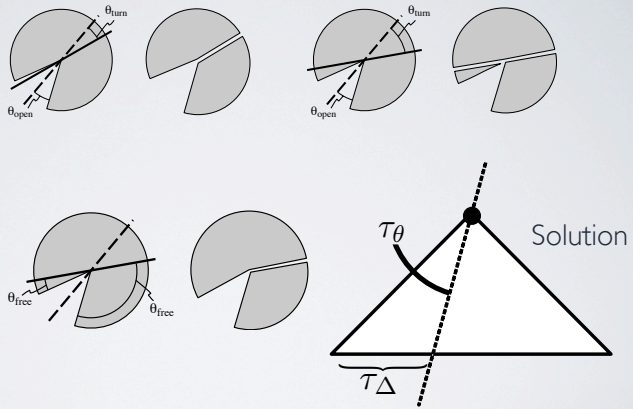
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Some Tricks: Back-Cracks



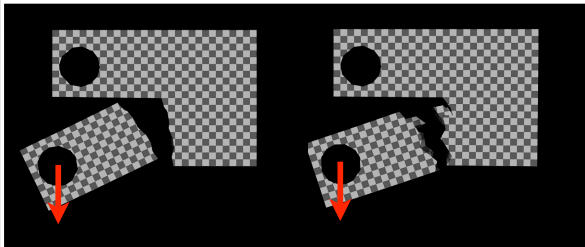
66

Some Tricks: Back-Cracks

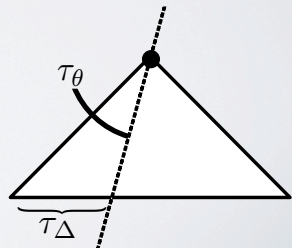


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Without Splitting

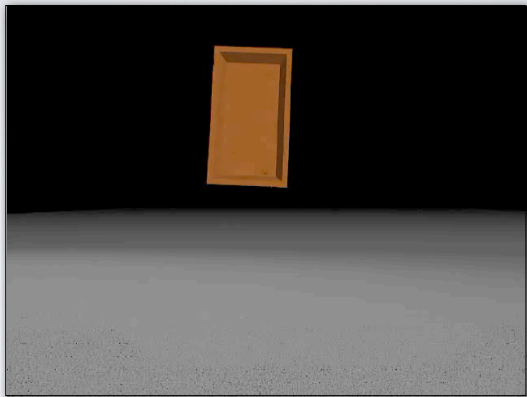


Set thresholds infinite to suppress splitting



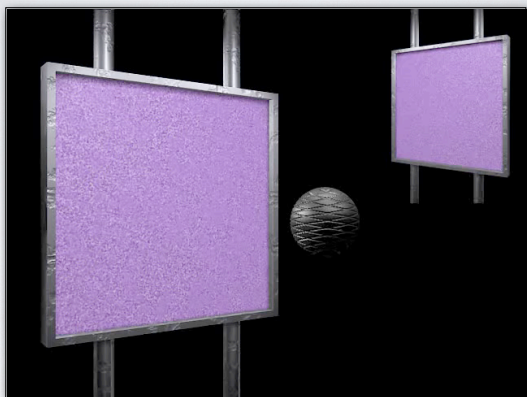
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Example



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Example



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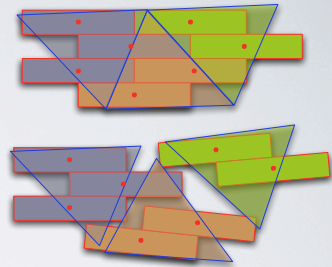
Remeshing

- Remeshing:
 - Fracture plane is normal to max eigenvector
 - Duplicate vertex
 - Split surrounding tetrahedra
(Easily implemented as edge splits)

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Splinters

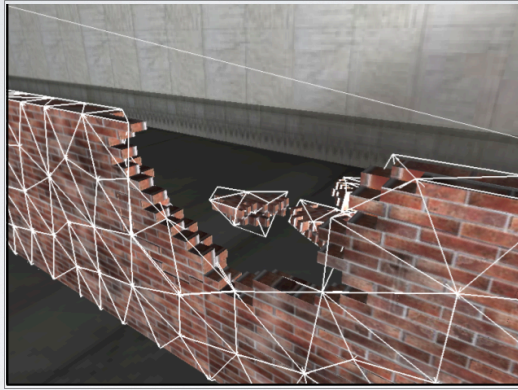
- Splinters are small pieces of geometry attached to a parent element
- The splinter may stick outside the element
- Splinters that cross a face are turned on when the face fractures
- Edge masking, not pre-scoring
- Artistic control



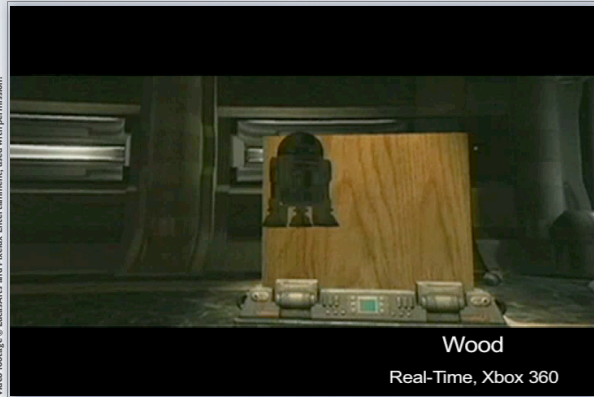
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Splinters



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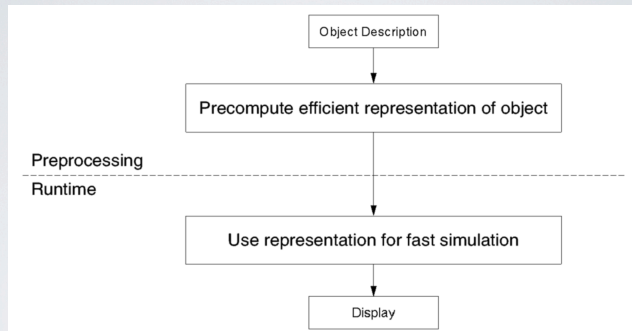


Video footage © LucasArts and Pixar Entertainment, used with permission.

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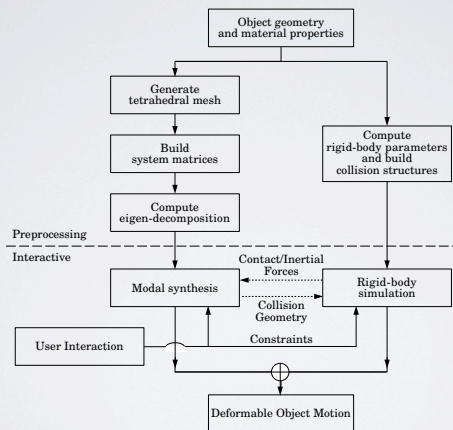
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Modal Analysis



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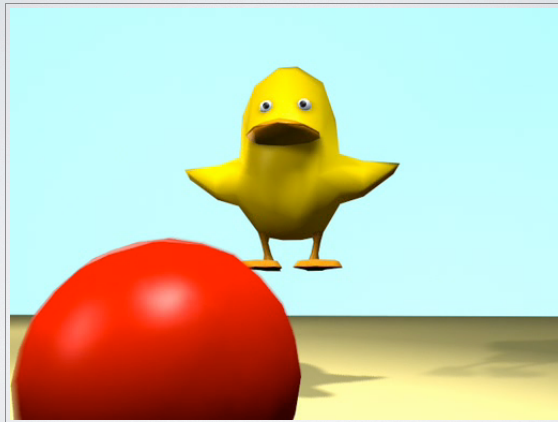
Deformation



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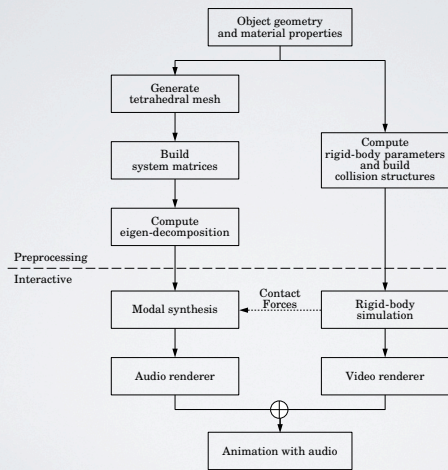
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Example



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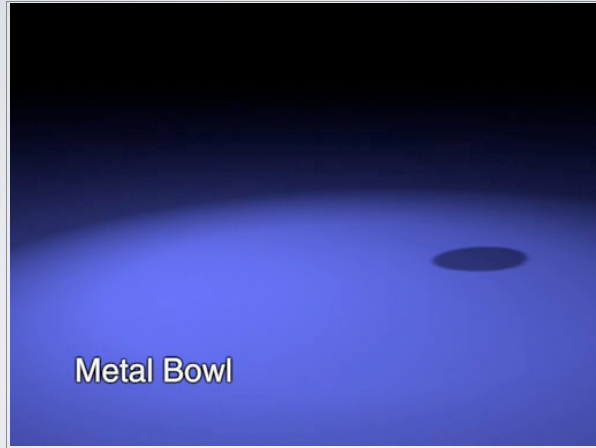
Sound



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Sound Example



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Modal Decomposition

- Linearize non-linear system

$$\mathcal{K}(\mathbf{d}) + \mathcal{C}(\mathbf{d}, \dot{\mathbf{d}}) + \mathcal{M}(\ddot{\mathbf{d}}) = \mathbf{f}$$

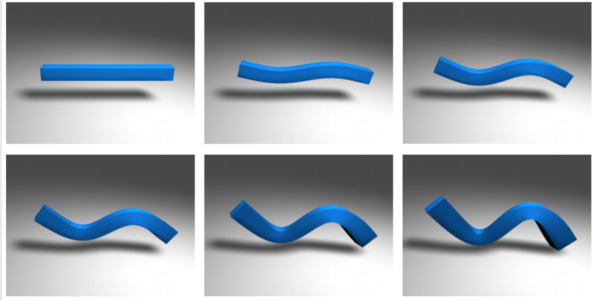


$$\mathbf{K}\mathbf{d} + \mathbf{C}\dot{\mathbf{d}} + \mathbf{M}\ddot{\mathbf{d}} = \mathbf{f}$$

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Modal Decomposition

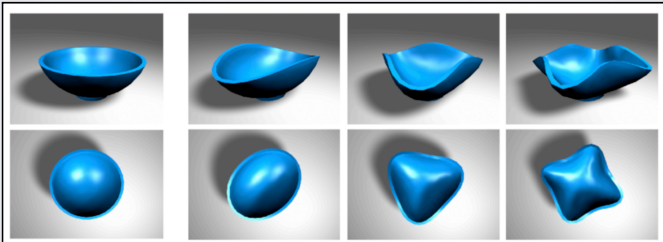
- Consequences of linearization
 - No local rotations



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Modal Decomposition

$$\Lambda \mathbf{z} + (\alpha_1 \Lambda + \alpha_2 \mathbf{I}) \dot{\mathbf{z}} + \ddot{\mathbf{z}} = \mathbf{g}$$



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Linearization

$$\mathcal{K}(d) + \mathcal{C}(\dot{d}) + \mathcal{M}(\ddot{d}) = f$$

$$Kd + C\dot{d} + M\ddot{d} = f$$

$$K(d + \alpha_1\dot{d}) + M(\alpha_2\dot{d} + \ddot{d}) = f$$

$$C = \alpha_1 K + \alpha_2 M$$

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Normalize for Mass

- Normalize for mass by change of coordinates

- Cholesky decomposition $M = LL^T$

- Change coordinates $y = L^T d$

$$K(d + \alpha_1\dot{d}) + M(\alpha_2\dot{d} + \ddot{d}) = f$$



$$L^{-1}KL^{-T}(y + \alpha_1\dot{y}) + (\alpha_2\dot{y} + \ddot{y}) = L^{-1}f$$

Diagonalize

- Diagonalize with second change of coordinates

– Eigen decomposition $L^{-1}KL^{-T} = V\Lambda V^T$
– Change coordinates $z = V^T y$

$$L^{-1}KL^{-T}(y + \alpha_1 \dot{y}) + (\alpha_2 \dot{y} + \ddot{y}) = L^{-1}f$$

$$\Lambda(z + \alpha_1 \dot{z}) + (\alpha_2 \dot{z} + \ddot{z}) = V^T L^{-1}f$$

$$\Lambda z + (\alpha_1 \Lambda + \alpha_2 I)\dot{z} + \ddot{z} = g$$

Diagonalize

$$K(d + \alpha_1 \dot{d}) + M(\alpha_2 \dot{d} + \ddot{d}) = f$$

Generalized eigenproblem:

$$K \cdot w = \lambda M \cdot w$$

$$W = L^{-T}V$$

$$z = W^{-1} \cdot d \quad g = W^T \cdot f$$

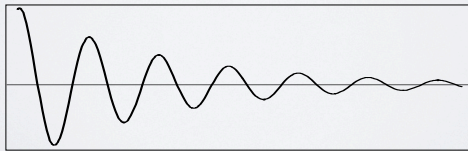
$$\Lambda(z + \alpha_1 \dot{z}) + (\alpha_2 \dot{z} + \ddot{z}) = g$$

Individual Modes

$$\lambda_i z_i + (\alpha_1 \lambda_i + \alpha_2) \dot{z}_i + \ddot{z}_i = g_i$$

$$z_i = c_1 e^{t\omega_i^+} + c_2 e^{t\omega_i^-}$$

$$\omega_i^\pm = \frac{-(\alpha_1 \lambda_i + \alpha_2) \pm \sqrt{(\alpha_1 \lambda_i + \alpha_2)^2 - 4\lambda_i}}{2}$$



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Fast Computation

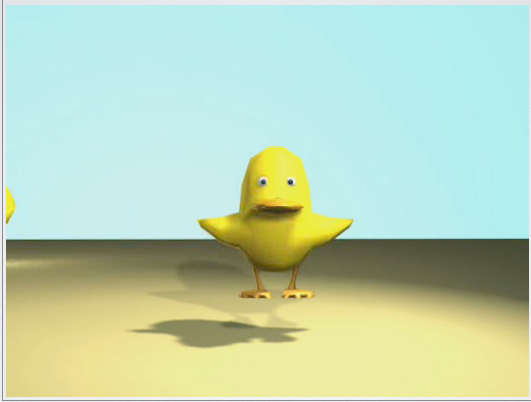
- Only a pair of complex multiplies per time step

$$e^{\omega(t+\Delta t)} = e^{\omega(t)} e^{\omega(\Delta t)}$$

- No stability limit on step size
- Jump to arbitrary point in time
- Only keep **useful** modes

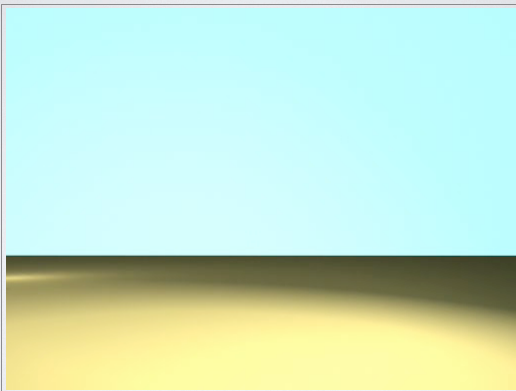
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Examples



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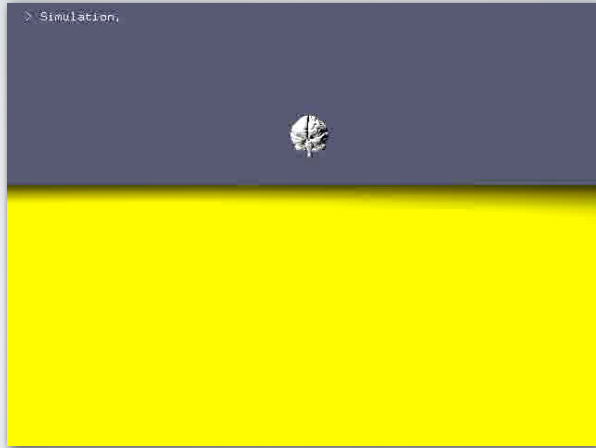
Examples



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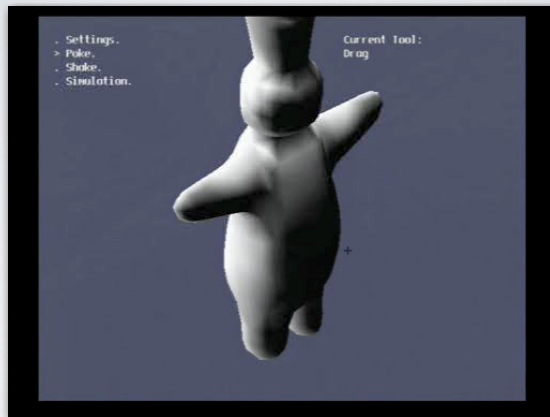
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PS2 Example



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PS2 Example



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Sound Examples

Synthesizing Sounds from Rigid-Body Simulation

*James F. O'Brien
Chen Shen
Christine M. Gatchalian*

University of California, Berkeley

ACM SIGGRAPH Symposium on Computer Animation 2002