


# Robot Algorithms for Medical Simulation & Virtual Prototyping


*Ming C. Lin*  
 Department of Computer Science  
 University of North Carolina at Chapel Hill  
<http://www.cs.unc.edu/~lin>  
<http://gamma.cs.unc.edu/>



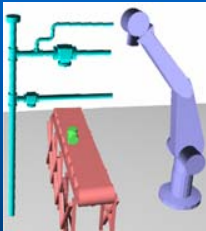
## Motion

- Ubiquitous in physical world and virtual environments
- Arising from dynamical systems: biological entities or man-made structures or mechanisms


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## Robotics & Automation



Assembly Planning (UNC)




Robot/Computer Assisted Surgery (JHU)




Dream Robot (Sony)

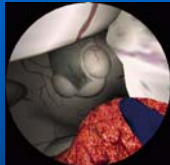
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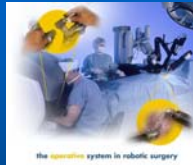
## Medical Applications



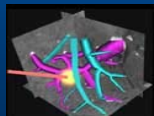
AR for Surgery  
(UNC/Ultrasound)




Third Ventriculostomy  
(HT/Immersion Medical)



da Vinci Surgical System  
(Intuitive Surgery, Inc.)



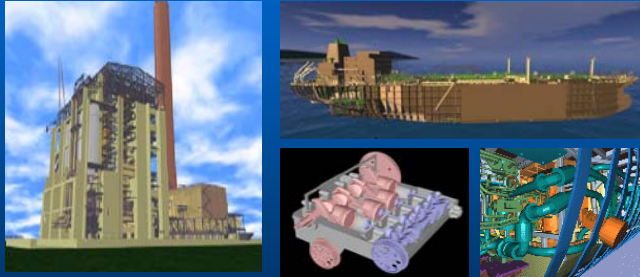
Imaging (UNC/MIDAG)



Human Simulation (BDI)

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## Engineering Design

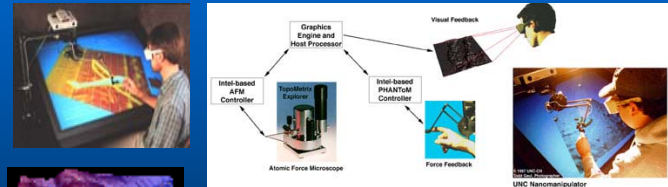


Interactive Prototyping of Massive Structures  
Walkthrough Research Group (UNC)

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## Scientific Visualization



Interactive Visualization & Manipulation of nanoStructures  
nanoManipulator Research Group (UNC)



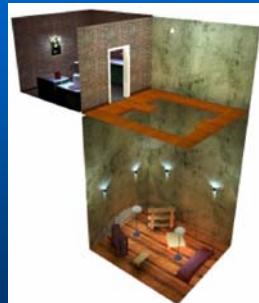
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## Virtual Environments



Interactive Agents and  
Avatars (UPENN/HMS)

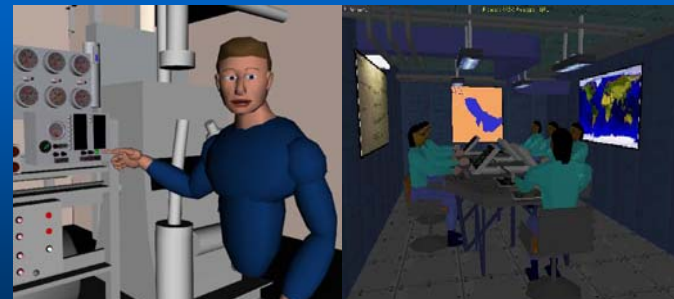


Walking Experiment & the Pit  
EVE Research Group (UNC)

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## Training & Education



VET (ISI/USC)

Team Training (NRL)

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## Games & Entertainment

Medal of Honor™  
(Pacific Assault)



Monster Inc. (Pixar Animation Studio)

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## Robot Algorithms

- Sensing and vision
- Motion control
- Dynamics and kinematics
- Motion planning
- Manipulation
- Others....

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## Organization

- Articulated Bodies
- Deformable Models

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## Organization

- Articulated Bodies
- Deformable Models

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## Algorithms for Articulated Bodies



- Continuous Collision Detection for Articulated Models
- Adaptive Forward Dynamics (AD)
- Planning of Highly Articulated Body Using AD + Contact Handling

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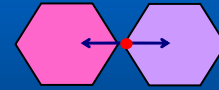
## Collision & Proximity Queries



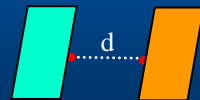
*Geometric reasoning of spatial relationships among objects (in a dynamic environment)*



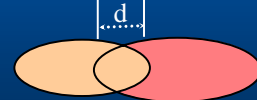
Collision Detection



Contact Points &amp; Normals



Closest Points &amp; Separation Distance



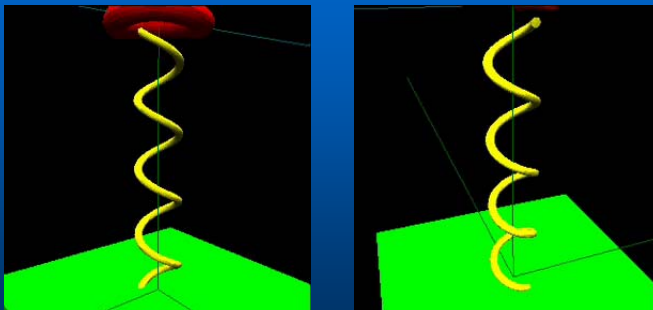
Penetration Depth

⇒ Can take a high fraction of the running time in simulations

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## SWIFT++: Distance & Collision Queries

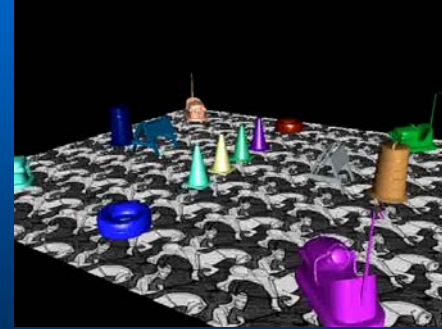


Use of Multi-resolution Reps. & Coherence  
[Ehmann & Lin, EG 2001]

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## PIVOT: Proximity Computations

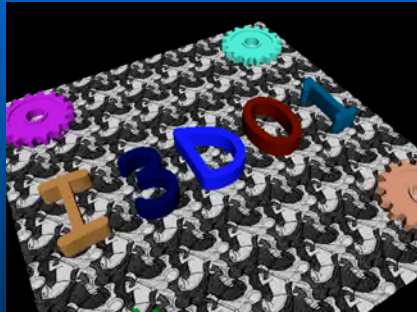


Proximity Queries Using Graphics Hardware Acceleration  
[Hoff, et al, I3D 2001]

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## Real-Time Simulation of Complex Objects Using PIVOT on GPU

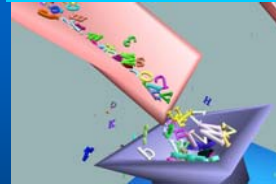


<http://gamma.cs.unc.edu/PIVOT>

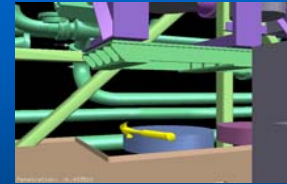
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## Penetration Depth Computation

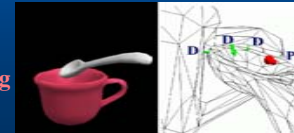


Dynamic Simulation



Virtual Prototyping

Haptic Rendering



DEEP: [Kim et al, ICRA 2002; HS 2002]

PD: [Kim et al, SCA 2002]

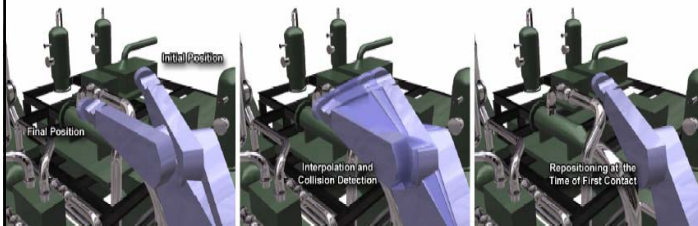
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## Continuous Collision Detection for Articulated Models Using GPUs



Motivation: Prior discrete algorithms only check for collision at each time instance, not in between steps. Collisions can be missed for fast moving and/or thin objects, such as an avatar rapidly moving around in a VE.

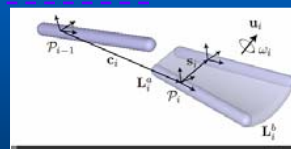


<http://gamma.cs.unc.edu/Articulate>  
[Redon, Kim, Lin, Manocha; SM 2004]

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## Overview

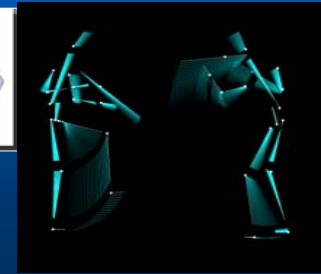


$$M_i^{-1}(t) = \begin{pmatrix} P_i^{-1}(t) & T_i^{-1}(t) \\ (0, 0, 0) & 1 \end{pmatrix}$$

$$T_i^{-1}(t) = c_i + ts_i$$

$$P_i^{-1}(t) = \cos(\omega_i t) \cdot A_i + \sin(\omega_i t) \cdot B_i + C_i$$


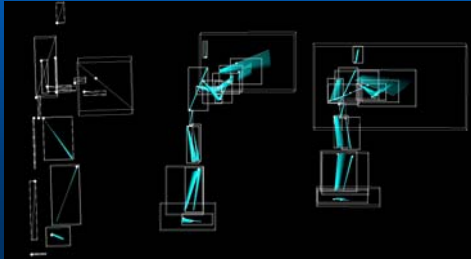
$$M_i^0(t) = M_1^0(t) \cdot M_2^0(t) \dots M_i^{-1}(t)$$



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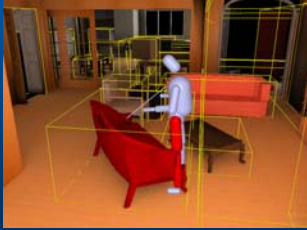
## Overview

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## Overview


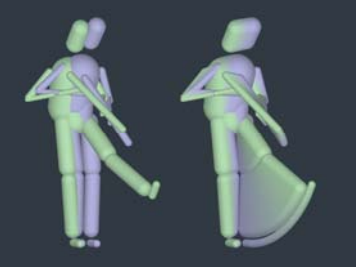



We use the dynamic AABBs to cull away the links far from the environment

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## Overview

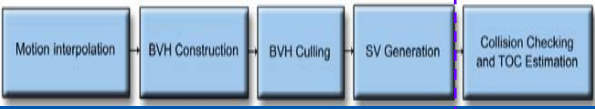




We use a line-swept sphere volume to represent each link and compute its swept volume for all links of the avatar, as shown on the right (blue/green indicating initial/final position).

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## Overview

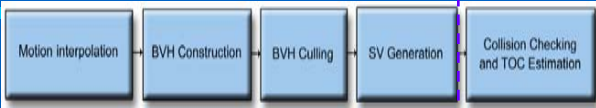




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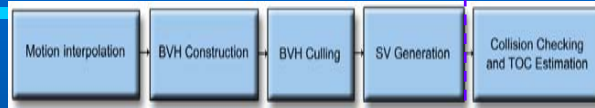

## Overview

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## Overview

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## Mobile Interaction in VE



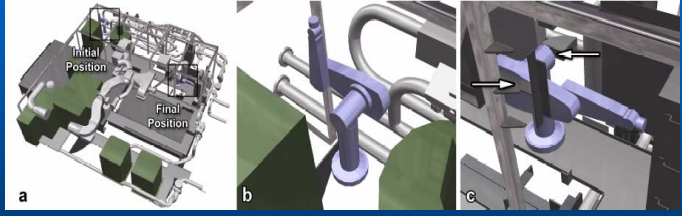
An avatar moving around rapidly in a living room; Real-time continuous collision detection is used to check for possible interference with the furniture.

[IEEE VR 2004]

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## Local Planning in Contact Space



Planning the motion of a Puma Robot (800 triangles, 7 dofs) in a partial Auxiliary Machine Room model (117,000 triangles)

**Two orders of magnitude performance improvement**

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## Adaptive Forward Dynamics



- Adaptive computation of dynamic (or quasi-static) simulations of complex linkages or articulated bodies:
  - Error-bounded Approximation
    - Introducing “total acceleration equations” to approximate Linkage Acceleration*
  - Progressive Refinement
    - Using hierarchical reference frames to lazily update the linkage states*
  - Efficiency
    - Avoiding linear-time update of all linkages*

[Redon et al, SIGGRAPH 2005]

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## Main Results



- **Hybrid bodies**
  - Novel articulated-body representation
  - To reduce the no. of degrees of freedom (DOFs)
- **Adaptive joint selection**
  - Novel customizable motion metrics
  - To determine the most important DOFs
- **Adaptive update mechanisms**

[Redon, Galoppo, Lin; SIGGRAPH 2005]

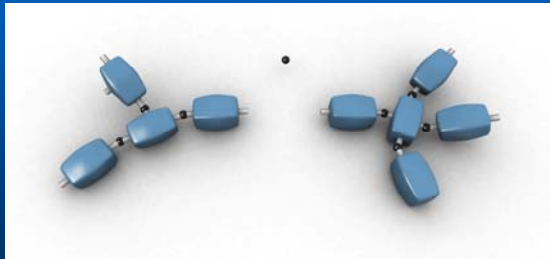
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## Hybrid bodies Featherstone's DCA [1999]



- Recursive definition



An articulated body is formed by assembling two articulated bodies

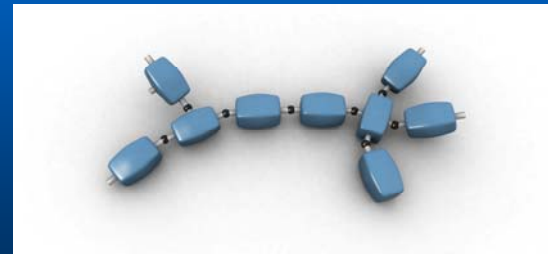
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## Hybrid bodies Featherstone's DCA



- Recursive definition



An articulated body is formed by assembling two articulated bodies

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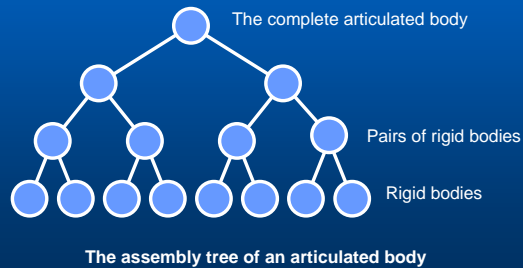


## Hybrid bodies

### Featherstone's DCA



- Recursive definition



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## Hybrid bodies

### Featherstone's DCA



- Recursive definition
- Articulated-body equation

$$\begin{bmatrix} \mathbf{a}_1 \\ \mathbf{a}_2 \\ \vdots \\ \mathbf{a}_m \end{bmatrix} = \begin{bmatrix} \Phi_1 & \Phi_{12} & \cdots & \Phi_{1m} \\ \Phi_{21} & \Phi_2 & \cdots & \Phi_{2m} \\ \vdots & \vdots & \ddots & \vdots \\ \Phi_{m1} & \Phi_{m2} & \cdots & \Phi_m \end{bmatrix} \begin{bmatrix} \mathbf{f}_1 \\ \mathbf{f}_2 \\ \vdots \\ \mathbf{f}_m \end{bmatrix} + \begin{bmatrix} \mathbf{b}_1 \\ \mathbf{b}_2 \\ \vdots \\ \mathbf{b}_m \end{bmatrix}$$

Body Accelerations      Inverse inertias and cross-inertias      Applied Forces      Bias accelerations

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## Hybrid bodies

### Featherstone's DCA



- Recursive definition
- Articulated-body equation

$$\begin{bmatrix} \mathbf{a}_1 \\ \mathbf{a}_2 \\ \vdots \\ \mathbf{a}_m \end{bmatrix} = \begin{bmatrix} \Phi_1 & \Phi_{12} & \cdots & \Phi_{1m} \\ \Phi_{21} & \Phi_2 & \cdots & \Phi_{2m} \\ \vdots & \vdots & \ddots & \vdots \\ \Phi_{m1} & \Phi_{m2} & \cdots & \Phi_m \end{bmatrix} \begin{bmatrix} \mathbf{f}_1 \\ \mathbf{f}_2 \\ \vdots \\ \mathbf{f}_m \end{bmatrix} + \begin{bmatrix} \mathbf{b}_1 \\ \mathbf{b}_2 \\ \vdots \\ \mathbf{b}_m \end{bmatrix}$$

The cross-coupling inverse inertia  $\Phi_{12}$  describes the effect of a force  $\mathbf{f}_2$  applied to body 2, on the acceleration  $\mathbf{a}_1$  of body 1

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## Hybrid bodies

### Featherstone's DCA



- Recursive definition
- Articulated-body equation

$$\begin{bmatrix} \mathbf{a}_1 \\ \mathbf{a}_2 \\ \vdots \\ \mathbf{a}_m \end{bmatrix} = \begin{bmatrix} \Phi_1 & \Phi_{12} & \cdots & \Phi_{1m} \\ \Phi_{21} & \Phi_2 & \cdots & \Phi_{2m} \\ \vdots & \vdots & \ddots & \vdots \\ \Phi_{m1} & \Phi_{m2} & \cdots & \Phi_m \end{bmatrix} \begin{bmatrix} \mathbf{f}_1 \\ \mathbf{f}_2 \\ \vdots \\ \mathbf{f}_m \end{bmatrix} + \begin{bmatrix} \mathbf{b}_1 \\ \mathbf{b}_2 \\ \vdots \\ \mathbf{b}_m \end{bmatrix}$$

The bias acceleration  $\mathbf{b}_1$  is the acceleration of body 1 when no forces are applied

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## Hybrid bodies

### Featherstone's DCA

- Recursive definition
- Articulated-body equation
- Two main steps
  - Compute the articulated-body coefficients (↑)

Inverse inertias

$$\Phi_1^C = \Phi_1^A - \Phi_{12}^A W \Phi_{21}^A$$

$$\Phi_2^C = \Phi_2^B - \Phi_{21}^B W \Phi_{12}^B$$

$$\Phi_{21}^C = \Phi_{21}^B W \Phi_{21}^A = (\Phi_{12}^C)^T$$

Bias accelerations

$$\mathbf{b}_1^C = \mathbf{b}_1^A - \Phi_{12}^A \gamma$$

$$\mathbf{b}_2^C = \mathbf{b}_2^B + \Phi_{21}^B \gamma$$

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## Hybrid bodies

### Featherstone's DCA

- Recursive definition
- Articulated-body equation
- Two main steps
  - Compute the joint accelerations and forces (↓)

Joint acceleration

$$\ddot{\mathbf{q}} = (\mathbf{S}^T \mathbf{V} \mathbf{S})^{-1} (\mathbf{Q} - \mathbf{S}^T \mathbf{V} (\Phi_{21}^A \mathbf{f}_1^A - \Phi_{12}^B \mathbf{f}_2^B + \beta))$$

Kinematic constraint forces

$$\mathbf{f}_1^B = \mathbf{W} \Phi_{21}^A \mathbf{f}_1^A - \mathbf{W} \Phi_{12}^B \mathbf{f}_2^B + \gamma$$

$$\mathbf{f}_2^A = -\mathbf{f}_1^B$$

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## Hybrid bodies

### Definitions

- Active region

● active region   ● rigid front   ● rigid region

The active region contains the mobile joints

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## Hybrid bodies

### Definitions

- Active region
- Hybrid-body coefficients

$$\Phi_1^C = \Phi_1^A - \Phi_{12}^A W \Phi_{21}^A$$

$$\Phi_2^C = \Phi_2^B - \Phi_{21}^B W \Phi_{12}^B$$

$$\Phi_{21}^C = \Phi_{21}^B W \Phi_{21}^A = (\Phi_{12}^C)^T$$

$$\mathbf{b}_1^C = \mathbf{b}_1^A - \Phi_{12}^A \gamma$$

$$\mathbf{b}_2^C = \mathbf{b}_2^B + \Phi_{21}^B \gamma$$

Articulated-body coefficients

↓ Rigidify joint

$$\Phi^C = \Phi^C = \Phi_{ij}^C = \Phi^B (\Phi^A + \Phi^B)^{-1} \Phi^A$$

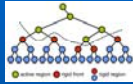
$$\mathbf{b}^C = \mathbf{b}^C = \mathbf{b}^A - \Phi^A (\Phi^A + \Phi^B)^{-1} (\mathbf{b}^A - \mathbf{b}^B)$$

Hybrid-body coefficients

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## Hybrid bodies

### Definitions



- Active region
- Hybrid-body coefficients
- Hybrid-body simulation
  - Same steps as articulated-body simulation
  - Computations restricted to a sub-tree (cf. paper)

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## Adaptive joint selection

### Motion metrics

- Acceleration metric

$$\mathcal{A}(C) = \sum_{i \in C} \ddot{\mathbf{q}}_i^T \mathbf{A}_i \ddot{\mathbf{q}}_i$$

- Velocity metric

$$\mathcal{V}(C) = \sum_{i \in C} \dot{\mathbf{q}}_i^T \mathbf{V}_i \dot{\mathbf{q}}_i$$

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## Adaptive joint selection

### Motion metrics

#### Theorem

The acceleration metric value of an articulated body can be computed before computing its joint accelerations:

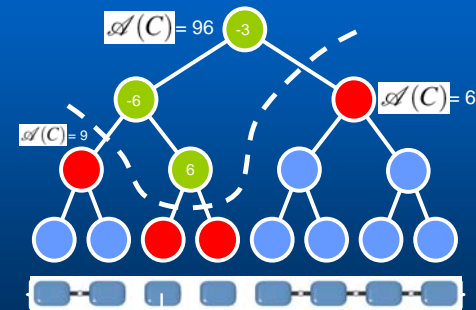
$$\mathcal{A}(C) = \begin{bmatrix} \mathbf{f}_1^A \\ \mathbf{f}_2^B \end{bmatrix}^T \begin{bmatrix} \Psi_1^C & \Psi_{12}^C \\ \Psi_{21}^C & \Psi_2^C \end{bmatrix} \begin{bmatrix} \mathbf{f}_1^A \\ \mathbf{f}_2^B \end{bmatrix} + \begin{bmatrix} \mathbf{f}_1^A \\ \mathbf{f}_2^B \end{bmatrix}^T \begin{bmatrix} \mathbf{p}_1^C \\ \mathbf{p}_2^C \end{bmatrix} + \eta^C$$

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## Adaptive joint selection

### Acceleration simplification



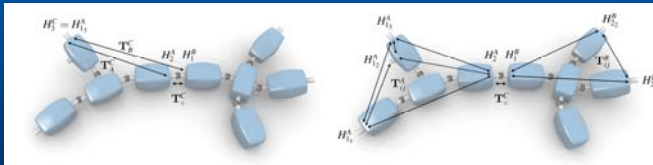
Four subassemblies with joint accelerations implicitly set to zero

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## Adaptive update mechanisms

- Position-dependent coefficients
- Hierarchical state representation



[Redon and Lin; SPM 2005]

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## Adaptive update mechanisms

- Velocity-dependent coefficients
- Linear coefficients tensors

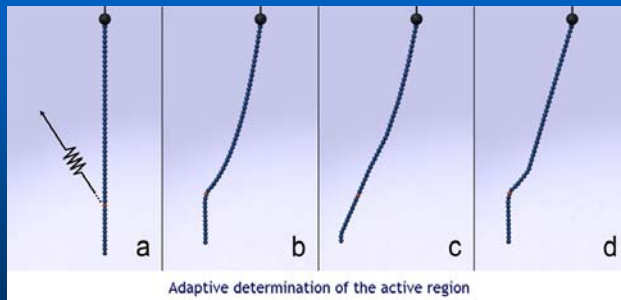
$$\begin{aligned} (\mathbf{b}_1^C)_a &= (\mathbf{B}_1^C)_{abc} (\mathbf{v}_1^C)_b (\mathbf{v}_1^C)_c & (\mathbf{p}_1^C)_a &= (\mathbf{P}_1^C)_{abc} (\mathbf{v}_1^C)_b (\mathbf{v}_1^C)_c \\ (\mathbf{b}_2^C)_a &= (\mathbf{B}_2^C)_{abc} (\mathbf{v}_2^C)_b (\mathbf{v}_2^C)_c & (\mathbf{p}_2^C)_a &= (\mathbf{P}_2^C)_{abc} (\mathbf{v}_2^C)_b (\mathbf{v}_2^C)_c \\ \eta^C &= (\mathbf{E}^C)_{abcd} (\mathbf{v}^C)_a (\mathbf{v}^C)_b (\mathbf{v}^C)_c (\mathbf{v}^C)_d \end{aligned}$$

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## Results

### Adaptive joint selection



Achieved 10x speed-up

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## Results

### Progressive dynamics

$N$  = Number of active joints  
Average cost per time step




Progressive dynamics of a 300-link pendulum

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## Design of Mechanical Chains



**a**

Precision: 0.5

**c**

Precision:  $10^{-1}$

**d**

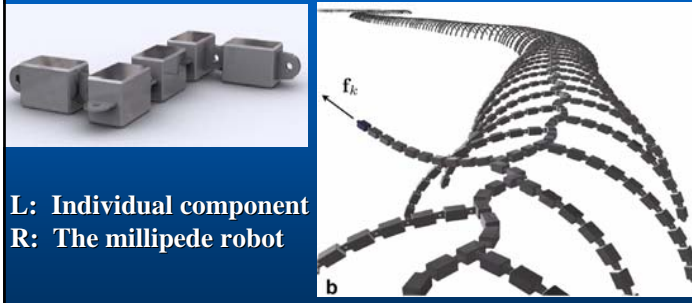
Precision:  $10^{-6}$

**e**

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## Simulation of Articulated Robots

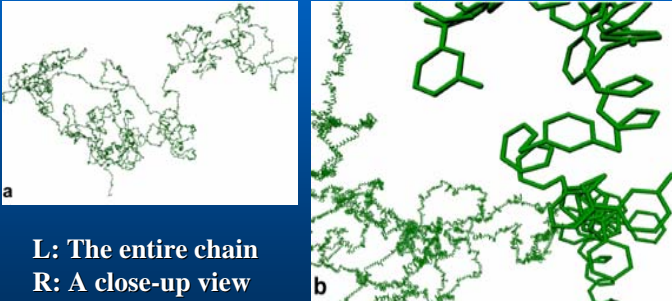


**L: Individual component**  
**R: The millipede robot**

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## Interactive Manipulation of Molecular Chains



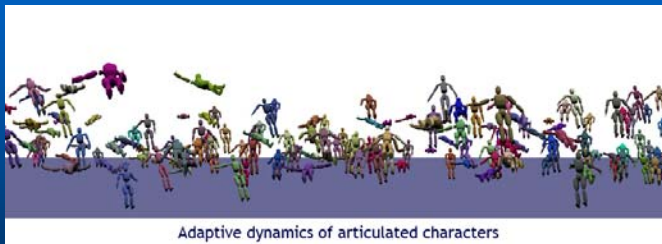
**L: The entire chain**  
**R: A close-up view**

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## Results

### Test application



Adaptive dynamics of articulated characters

Achieved **two orders of magnitude** performance gain  
For 200 avatars with 17,800 rigid bodies and 19,000 dofs

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## Adaptive Dynamics (AD) with Contact Handling

- Use impulse-based dynamics
- Solve  $p$  analytical constraints:

$$h(\ddot{\mathbf{q}}^f) - h(\ddot{\mathbf{q}}^o) = \mathbf{k}f_t \quad \Rightarrow \quad \mathbf{h} - \mathbf{h}^o = \mathbf{K}\mathbf{f}$$

- Derive a new hybrid-body Jacobian:

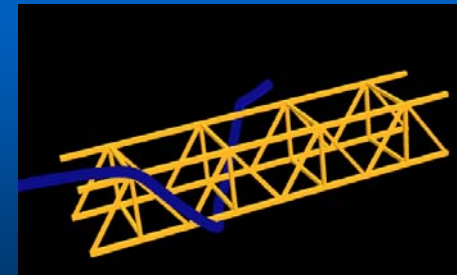
$$J_P(q(t)) = \begin{pmatrix} \frac{\delta x}{\delta q_1} & \cdots & \frac{\delta x}{\delta q_{d_n}} \\ \frac{\delta y}{\delta q_1} & \cdots & \frac{\delta y}{\delta q_{d_n}} \\ \frac{\delta z}{\delta q_1} & \cdots & \frac{\delta z}{\delta q_{d_n}} \end{pmatrix}$$

[Gayle et al; RSS 2006]

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## Cable Routing on Bridge

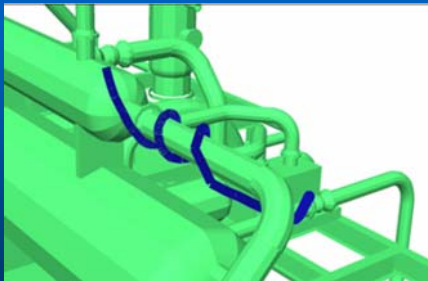


A snake robot of 500 links and 500 DOFs with only 70 DOFs used in this bridge scene

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## Pipe Inspection

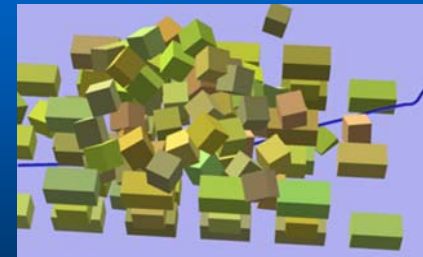


A snake robot of 2000 links with only 200 DOFs used

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## Search & Rescue in Debris



A snake robot of 2000 links with only 200 DOFs used

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## Catheterization Procedures



- In medical and surgical procedures, flexible catheters are often inserted in human vessels to
  - Obtain diagnostic information (blood pressure or flow)
  - Enhance imaging with the injection of contrast agents
  - Provide a mechanism to deliver treatment to a specific area

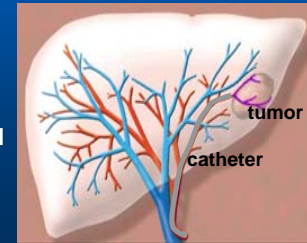
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## Liver Chemoembolization



- Catheter is used to inject chemotherapy drugs directly to the blood vessel supplying a liver tumor
- Catheter is inserted into the femoral artery (near the groin) and advanced into the selected liver artery
  - A fluoroscopic display and the resistance felt from the catheter are used to determine how it should be advanced, withdrawn, or rotated
- Chemotherapy drugs followed by embolizing agents are injected through the catheter into the liver tumor



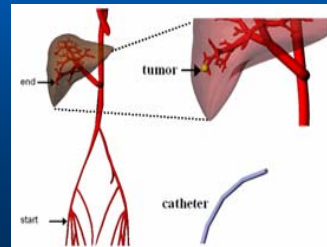
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## Motion Planning Application



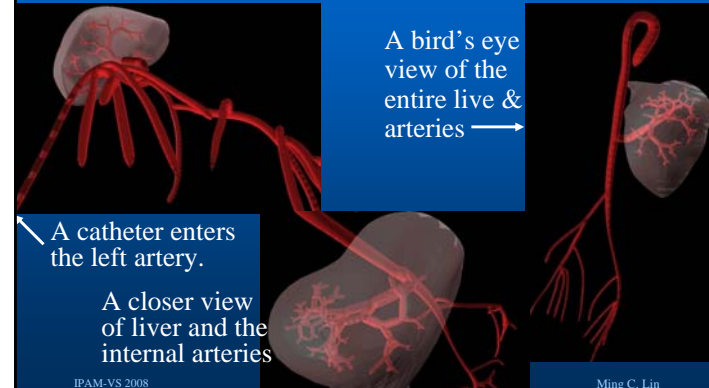
- Application to plan the path of a flexible catheter, inserted at the femoral artery, to a specific liver artery supplying a tumor
  - Environment: 3D models of the liver and blood vessels obtained from the 4D NCAT phantom, a realistic computer model of the human body
  - Catheter was modeled as a snake robot with 2,500 joints with only 10% of joints simulated to achieve 10x speed up.



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## Benchmark: Liver (Courtesy of JHU)



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## Catheter Insertion



### System Demonstration

[Gayle et al; ICRA 2007]

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## Organization



- Articulated Bodies
- Deformable Models

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## Algorithms for Deformable Models



- Collision Detection for Deformable Models using Chromatic Decomposition
- Constraint-based Planning of Deformable Robots
- Modeling of Soft Articulated Bodies in Contact Using Dynamic Deformation Textures

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## Collision Detection for Deformable Models using Chromatic Decomposition



- General collision detection algorithm
  - Robust and efficient
  - Continuous self-collision detection
  - Works on all triangulated meshes with fixed mesh connectivity
- Up to an order of magnitude speedup over prior algorithms

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## Hierarchical Approaches

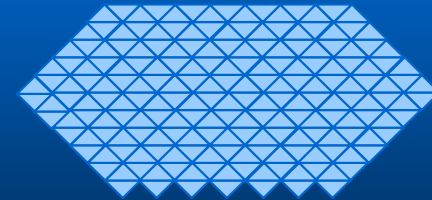


- Spatial partitioning or bounding volume hierarchies
  - AABBs [Bridson et al. 02, Baraff et al. 03, DeRose et al. 98], OBBs, k-DOPs [Mezger et al. 02, Volino and Thalmann 00]
- Issues
  - Trade-off between speed and culling efficiency
  - Overlap tests are conservative, resulting in many false positives

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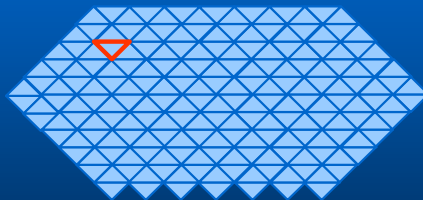
## Self-Collision Detection: Complexity



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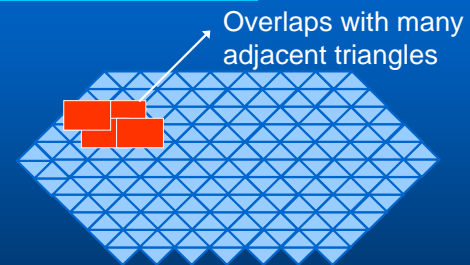
## Self-Collision Detection: Complexity



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## Self-Collision Detection: Complexity



Overlaps using AABBs  
(Axis Aligned Bounding Box)

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## GPU-based Algorithms



- Use rasterization and involve no pre-processing
  - Applicable to deformable models  
[Baciu and Wong 2002, Hiedelberger et al. 04, Govindaraju et al. 05, Rossignac et al. 92, Vassilev et al. 01]
- Issues
  - Self-collision computations at image resolution

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## Algorithm Overview

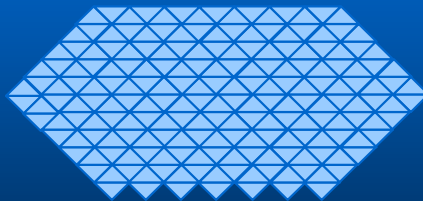


- Problem decomposition
  - Non-adjacent collision detection (NACD)
  - Adjacent collision detection (ACD)

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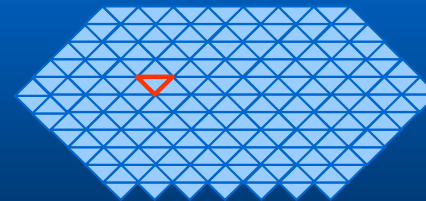
## Problem Decomposition



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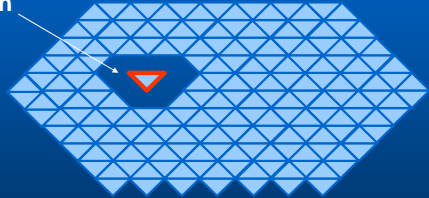
## Problem Decomposition: NACD



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## Problem Decomposition: NACD



Separation

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## Problem Decomposition: ACD



Based on mesh connectivity

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## Problem Decomposition

Decomposition into NACD and ACD

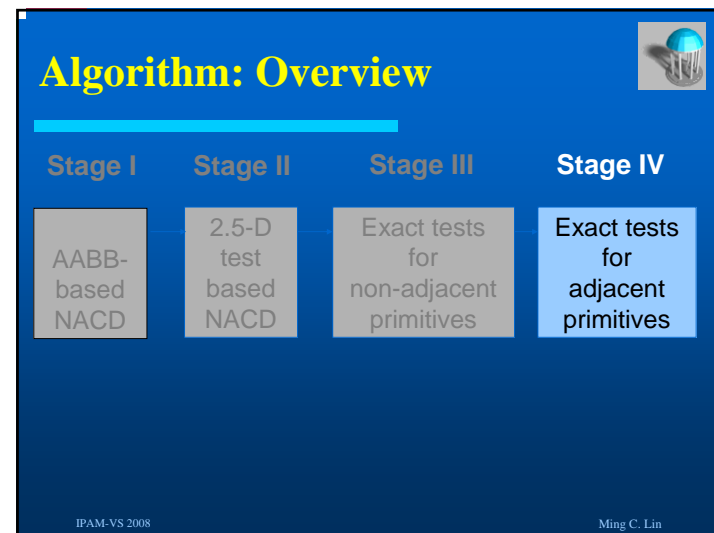
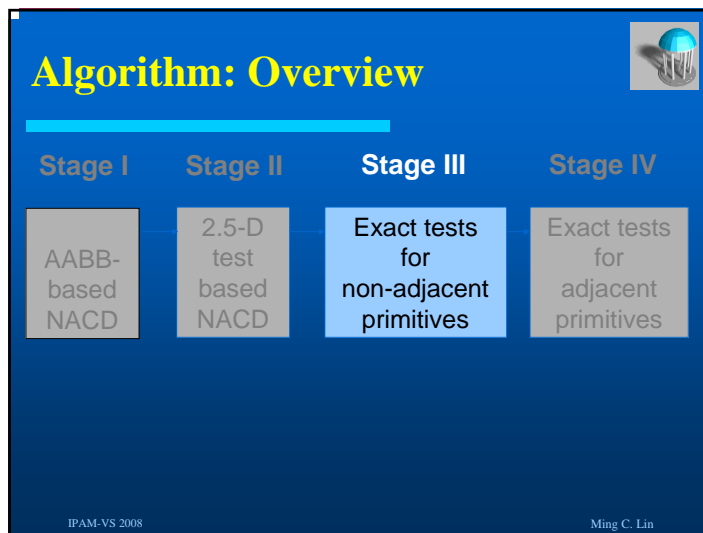
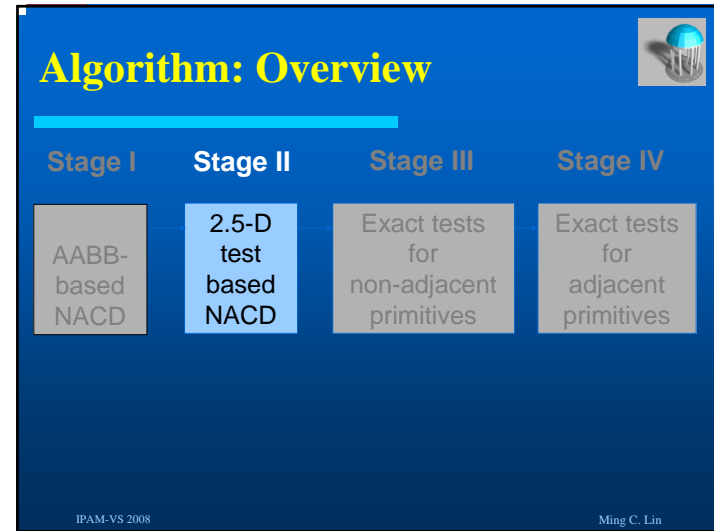
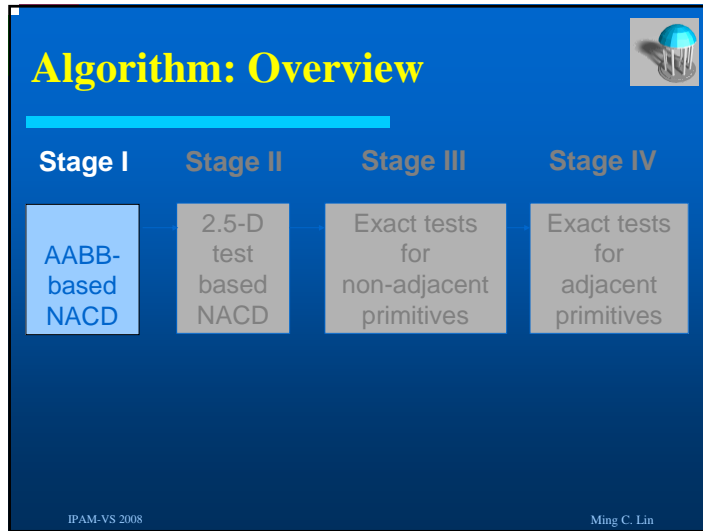
- Significant collision culling
- Fewer false positives

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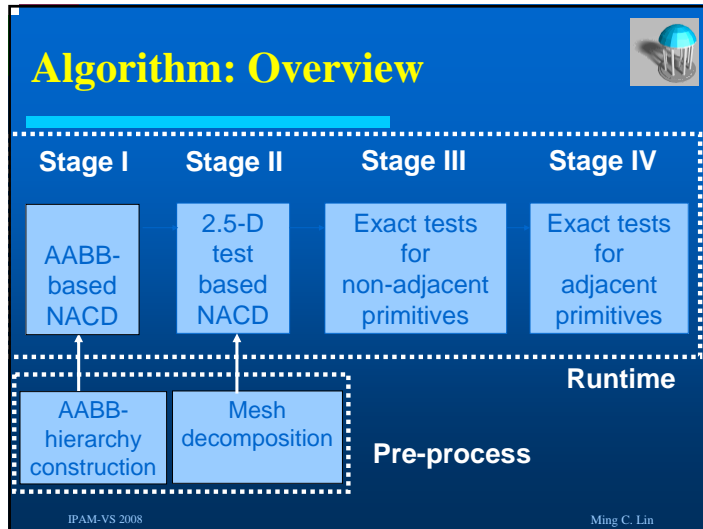
## Algorithm: Overview

Stage I	Stage II	Stage III	Stage IV
AABB-based NACD	2.5-D test based NACD	Exact tests for non-adjacent primitives	Exact tests for adjacent primitives
Broad Phase		Narrow Phase	


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
## Mesh Decomposition



- Mesh decomposition is similar to **vertex coloring**
- Vertex Coloring:** Color vertices such that adjacent vertices have different colors

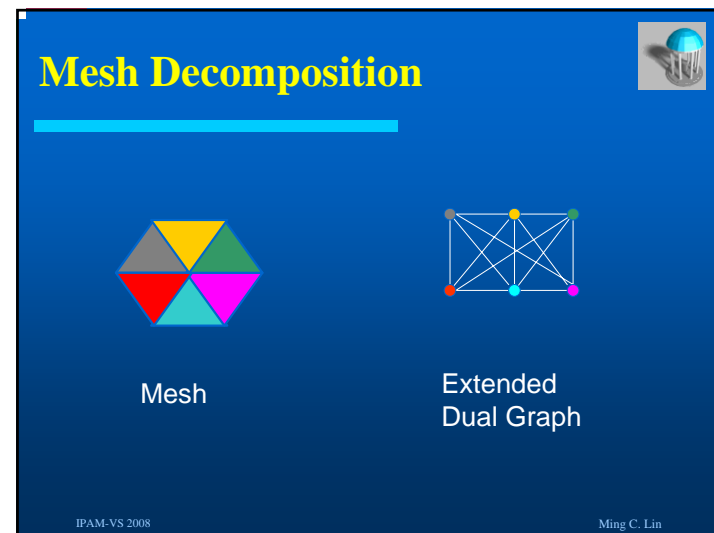
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## Mesh Decomposition vs. Coloring

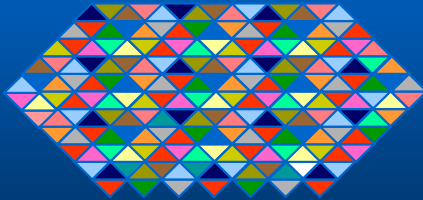


	Mesh Decomposition	Vertex Coloring
Partitions	Triangles	Vertices
Sets are	disjoint	disjoint
Partitioned Sets have	Non-adjacent triangles	Non-adjacent vertices

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## Mesh Decomposition



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## Vertex Coloring

- Minimum vertex coloring is NP-complete
- Use greedy heuristic algorithms based on vertex degree (DSATUR)
  - Typically around 10-20 sets

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## Stage I : AABB-based NACD

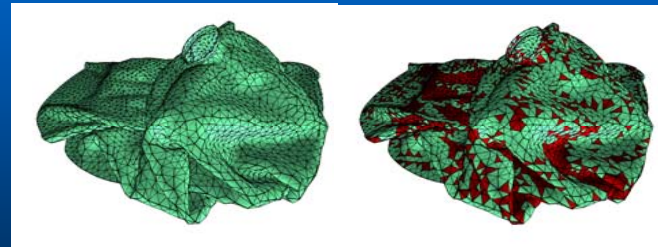
- Update AABB hierarchy
- Check AABB hierarchy against itself
  - Only check for NACD

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## Culling Efficiency of Stage I

▲ Potentially overlapping



With Stage I AABBs:  
20K elementary tests

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## Stage II : 2.5-D based NACD

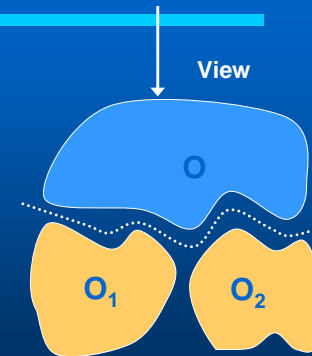


- Uses 2.5-D visibility tests on GPUs [Govindaraju et al. 2003]
- 2.5-D tests: Objects are tested for full visibility against a set of objects
- Used for set-based collision culling

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## 2.5-D Tests: Geometric Interpretation



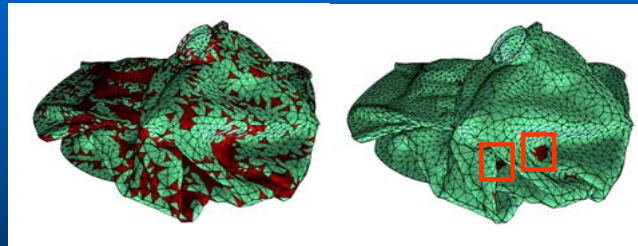
Checks for existence of separating surface

Performed on GPU  
Sufficiently *fatten* to account for precision errors [Govindaraju et al; VRST 04]

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## Culling Efficiency after Stage II



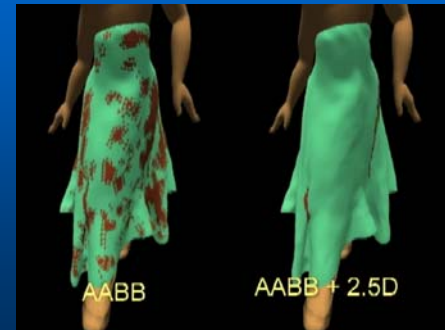
After Stage I:  
20K elementary tests

After Stage II:  
1K elementary tests

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## Improved Culling: 2.5D tests



AABB

AABB + 2.5D

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## Dancing Girl: Cloth Simulation



- **Skirt** – 12.5 K triangles
- **0.55 sec** self-collision detection time

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## Walking Girl: Cloth Simulation

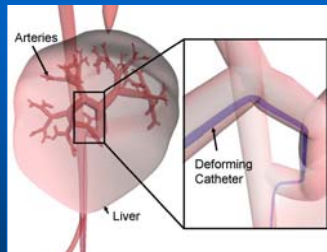


- **Skirt** – 12.5 K triangles
- **0.55 sec** self-collision detection time

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## Application: Surgical Simulation

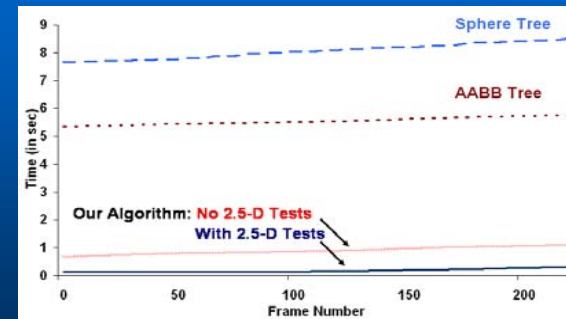


- Path planning for a deformable catheter
- Liver – 83K triangles : Catheter – 10K triangles
- 60-90 msec collision detection time between catheter and arteries

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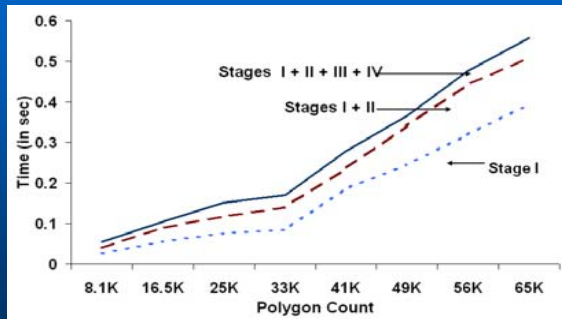
## Speed Improvement



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## Speed Scales Linearly with Polygon Count



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## Multiresolution Collision Handling

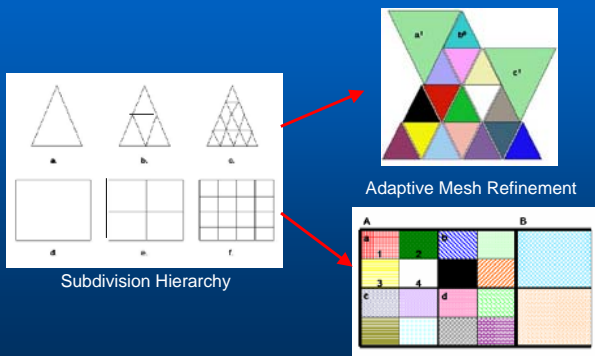
- Precompute multiresolution meshes
  - Subdivision Hierarchy
  - Chromatic Decomposition
  - Use of Graphics Processor Units (GPUs)
- Adaptively select appropriate CLODs
- Refine simulation on the fly
- Accelerate overall computation by 7x

[Jain et al; CASA 2005]

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## Multiresolution Hierarchy



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## Benchmarks

Folding curtains (33 K tris total)



Squatting human with a pair of pants (10K tris)

Cloth (33 K triss) draping over a bunny

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## Planning of Deformable Robots



### Motivations

- Surgical planning
- Layout for mechanical/electrical systems in complex structures
- Planning of reconfigurable robots
- Character animation

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## Motion Planning to Aid Catheterization Procedure



- Accurate motion planning studies with deformable models can provide a vital tool to aid in the catheterization procedure
- Preoperatively, they may be used as part of surgical planning techniques to help choose the size and properties of the catheter used
- During the actual procedure, they can be used to compute the optimal path of the catheter to the targeted area, ensuring the best possible outcome for the patient

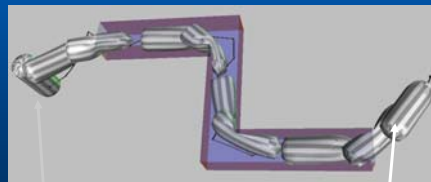
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## Problem Description



- Extend the classical motion planning problem by allowing the robot to deform in order to follow a path while maintaining physical constraints



Starting position

Final position

An example planning solution. Note that the robot must deform in order to successfully navigate the turns in the tunnel.

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## Constraint-based Planning for Deformable Robots



- Formulate motion planning as a *constrained dynamical system*
  - Constraints are transformed to virtual forces acting on the simulated system
  - Solve the problem as a constrained minimization
- Introduce both *hard* and *soft* constraints
  - Goal seeking
  - Collision avoidance
  - Volume preservation
  - Non-penetration constraint (hard)

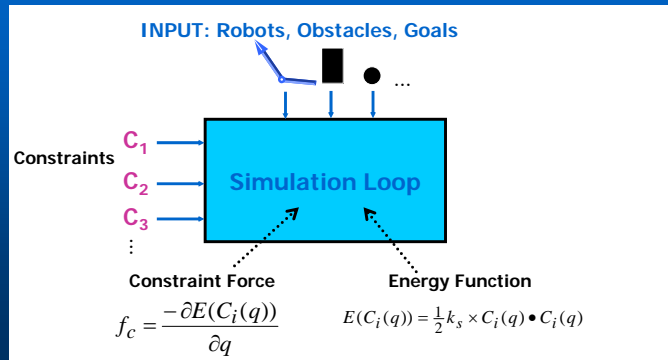
[Gayle, Lin, Manocha; ICRA 2005]

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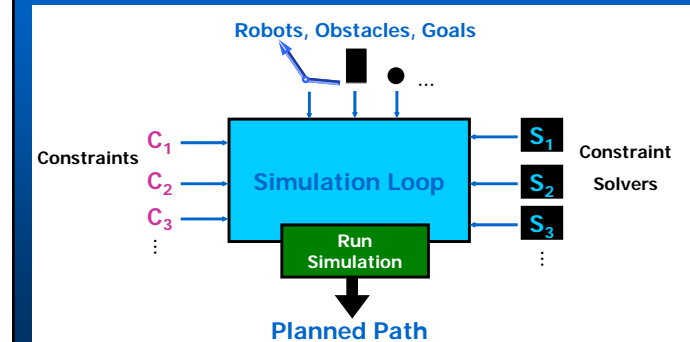
## General Framework



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## General Framework



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## Algorithm Overview

- Roadmap Generation
- Path Estimation
- Path Query
  - Advance simulation while satisfy constraints

$$\min E(x) \text{ subject to } \nabla V(x) \leq \epsilon$$

$$E_s(X) = \sum_j \frac{k}{2} (\|d_j\| - L_j)^2$$

- Non-penetration
- Volume Preservation

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## Benchmark

The Serial Walls benchmark. Note that the robot is slightly larger than the holes through which it must pass

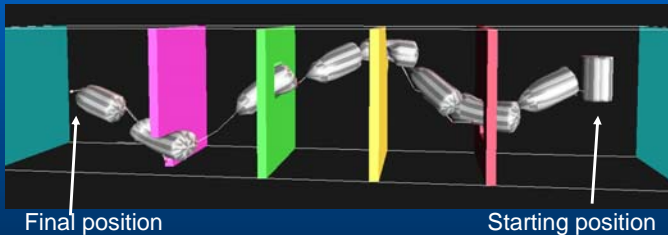


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## Benchmark

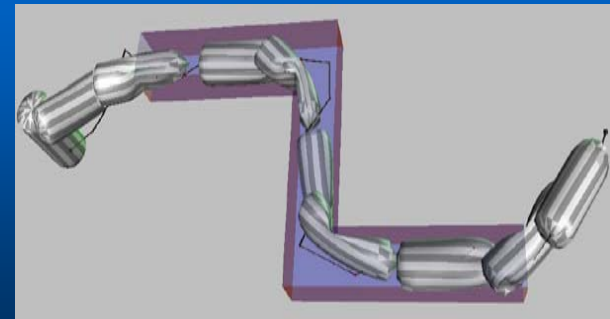
Steps along the planned path. We capture the robot at various stages during path traversal.



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## Benchmark



The Tunnel

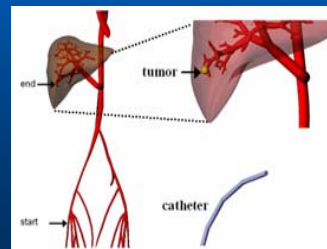
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## Motion Planning Application

- Application to plan the path of a flexible catheter, inserted at the femoral artery, to a specific liver artery supplying a tumor

- Environment: 3D models of the liver and blood vessels obtained from the 4D NCAT phantom, a realistic computer model of the human body
- Deformable robot: Catheter was modeled as a cylinder with a length of 100 cm and a diameter of 1.35 mm



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## System Demonstration

[Gayle et al.; ICRA 2005]

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## Modeling of Soft Articulated Bodies in Contact Using Dynamic Deformation Textures

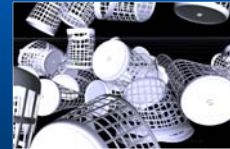


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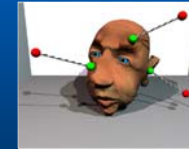
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## Motivation

Global deformations ↔ Detailed deformations



*Barbič & James '05*



*Müller et al. '05*



*Ours*

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## Motivation

- Dynamic simulation of deformable solids
- Highly detailed surface geometry
- Large contact area: objects bounce, roll, slide,...



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## Layered Models Motivation

- Detailed, small-scale deformations
- Global (skeletal) deformations
- Dynamic interplay between skeletal motion and surface deformation during contact



## Layered Models



- Overview
  - Dynamic Deformation Textures
- Fast Coupled Layered Dynamics
- Fast Condensed Skeleton Dynamics

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## Layered Models

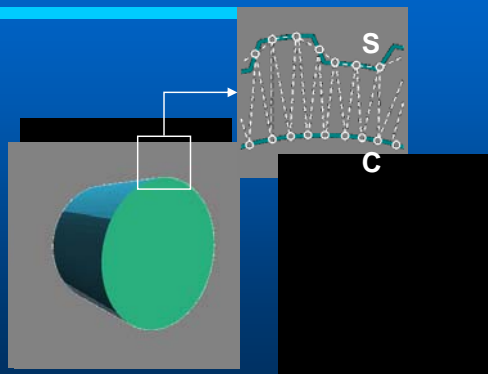


- Overview
  - Dynamic Deformation Textures
- Fast Coupled Layered Dynamics
- Fast Condensed Skeleton Dynamics

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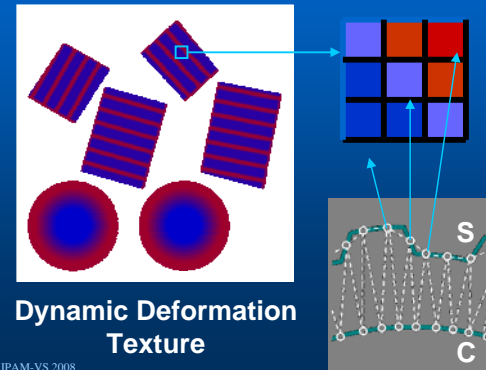
## Layered Models



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## Layered Models Dynamic Deformation Textures




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# Layered Models


- Overview
  - Dynamic Deformation Textures
- Fast Coupled Layered Dynamics
- Fast Condensed Skeleton Dynamics



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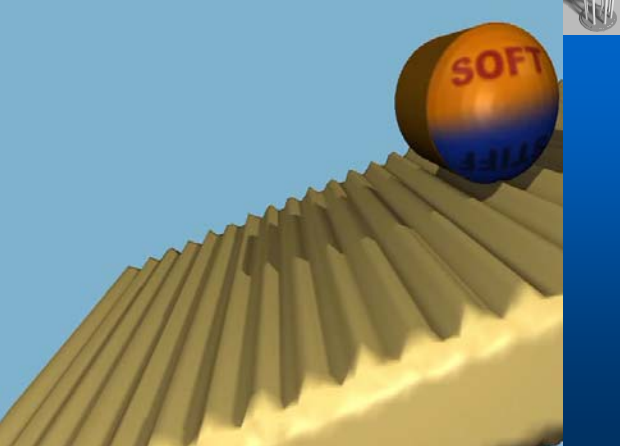
# Fast Coupled Layered Dynamics

- Generalized Lagrangian framework
- Linear elasticity in moving frame of reference [Terzopoulos&Witkin'88]
- FEM discretization
- Implicit integration
- Physically based approximations




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## Motion interaction Heterogeneous material



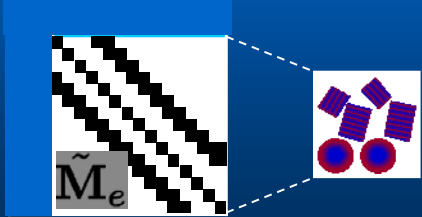
Cylinder: 161K tetrahedra




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# Dynamic Formulation

$$\tilde{\mathbf{M}} \begin{bmatrix} \Delta \mathbf{v}_c \\ \Delta \mathbf{v}_e \end{bmatrix}$$

$\tilde{\mathbf{M}} =$  

- Exploit matrix structure + parallelize



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## Dynamic Formulation Decoupled Solution



1. Project surface forces to update core velocity
2. Distribute core velocity to update surface velocities

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## Fast & Responsive Contact



- Hierarchical Collision Queries
  - Texture-based Collision Detection
- Responsive Contact Handling
- Fast Coupled Contact Response
  - Skeleton Response Anticipation

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## Fast & Responsive Contact

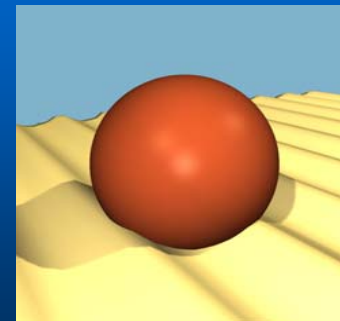


- Hierarchical Collision Queries
  - Texture-based Collision Detection
- Responsive Contact Handling
- Fast Coupled Contact Response
  - Skeleton Response Anticipation

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## Texture-based Collision Detection



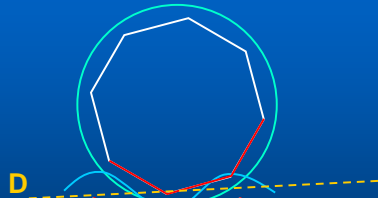
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## Texture-based Collision Detection

### Stage 1: Low-resolution



- Fast proximity tests between proxies
- Contact plane D per contact region

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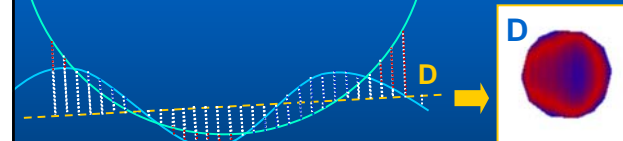
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## Texture-based Collision Detection

### Stage 2: Detailed Surface Interference



GPU-based



- Surface projection onto contact plane D
- Identify contacts in D from separation distances

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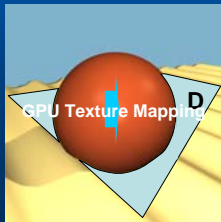
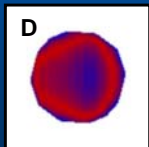
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## Texture-based Collision Detection

### Collision Information Transfer



- Contact response in dynamic deformation texture
- Transfer collision information



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## Hierarchical Pruning



- Exploit skeletal nature of deformation
  - Locality



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## Fast & Responsive Contact



- Hierarchical Collision Queries
  - Texture-based Collision Detection
- Responsive Contact Handling
- Fast Coupled Contact Response
  - Skeleton Response Anticipation

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## Contact Response



$$\underbrace{\mathbf{J}\tilde{\mathbf{M}}^{-1}\mathbf{J}^T}_{\text{Dense!}}\lambda = -\mathbf{J}\mathbf{v}^-$$

Dense!

- Implicit matrices, hard to parallelize
- Decoupled solution

Responsiveness!

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## Fast & Responsive Contact



- Hierarchical Collision Queries
  - Texture-based Collision Detection
- Responsive Contact Handling
- Fast Coupled Contact Response
  - Skeleton Response Anticipation

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## Articulated Contact Response



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Snake: 3,102 surface points

16 bones

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## Articulated Contact Response



- Joint constraint complications

$$\begin{pmatrix} \tilde{\mathbf{M}}_b & \tilde{\mathbf{M}}_{bs} & -\mathbf{J}_j^T & -\mathbf{J}_b^T \\ \tilde{\mathbf{M}}_{bs}^T & \tilde{\mathbf{M}}_s & 0 & -\mathbf{J}_s^T \\ -\mathbf{J}_j & 0 & 0 & 0 \\ -\mathbf{J}_b & -\mathbf{J}_s & 0 & 0 \end{pmatrix} \begin{pmatrix} \delta \mathbf{v}_b \\ \delta \mathbf{v}_s \\ \mu \\ \lambda \end{pmatrix} = \begin{pmatrix} 0 \\ 0 \\ \mathbf{b}_\mu^- \\ \mathbf{b}_\lambda \end{pmatrix},$$

Complexity:  $O(mnk)$

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## Articulated Contact Response



- Contact-consistent Articulated Dynamics

$$\begin{pmatrix} \mathbf{M}_b^* & -\mathbf{J}_j^T \\ -\mathbf{J}_j & \mathbf{0} \end{pmatrix} \begin{pmatrix} \delta \mathbf{v}_b \\ \mu \end{pmatrix} = \begin{pmatrix} \mathbf{b}_b^* \\ \mathbf{b}_\mu^- \end{pmatrix},$$

with  $\mathbf{M}_b^* = \hat{\mathbf{M}}_{\text{cond}} + \mathbf{J}_{\text{cond}}^T \mathbf{M}_\lambda^{-1} \mathbf{J}_{\text{cond}}$

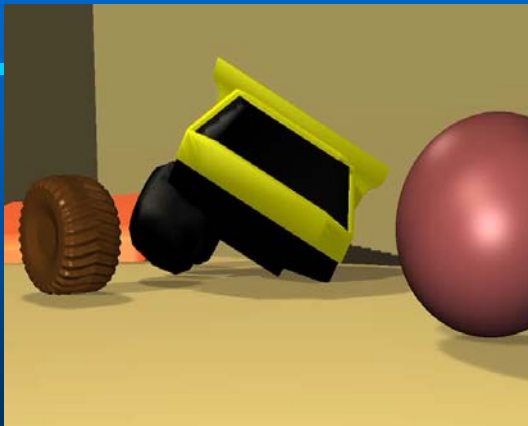
$$\mathbf{b}_b^* = -\mathbf{J}_{\text{cond}}^T \mathbf{M}_\lambda^{-1} \mathbf{b}_\lambda$$

Complexity:  $O(m + n + k)$

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Rubbing, rolling, sliding

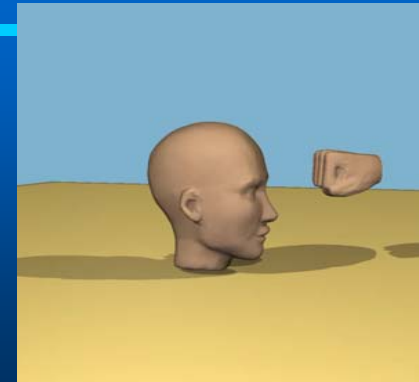


Tire: 162K tetrahedra

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Highly detailed, dynamic deformations



Head: 240K tetrahedra    40K vertices

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## Exploiting Parallelism



- All surface-related computations on GPU
- Communication between core and surface computations minimized
- Dynamic deformation textures for immediate rendering

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## Fast Contact Modeling for Soft Characters



Running deer

IPAM-VS 2008 Deer: 2,755 surface points, 34 bones @ 10 FPS Ming C. Lin

## Future Research Directions



- Multi-scale Dynamics Simulator for Virtual Prototyping and Design Automation
- Modeling and Simulation of Nano-structures and Nano-systems
- Functional Endoscopic Sinus Surgical Training System with Haptic Interfaces
- Planning and Control of Multiple Intelligent Agents using GPU Accelerated Computations
- Enabling Real-Time Interaction between Avatars and Complex Virtual Environments

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## Collaborators



- Dinesh Manocha
- Russell Gayle
- Nico Galoppo
- Naga Govindaraju
- Markus Gross
- Nitin Jain
- Kenneth Hoff
- Young Kim
- David Knotts
- Miguel Otaduy
- Stephane Redon

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- National Science Foundation
- Office of Naval Research
- RDECOM
- UNC Chapel Hill

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