

# *Towards Surface Regularization via Medial Axis Transitions*

ICPR 2004, Cambridge, U.K.

Frederic F. Leymarie – London University

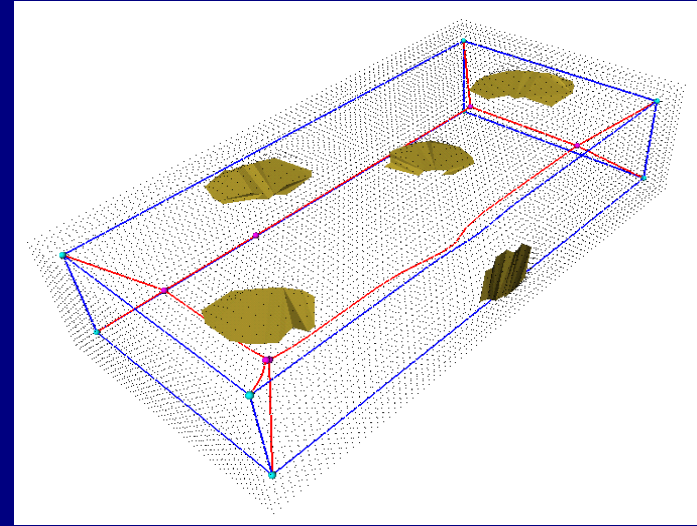
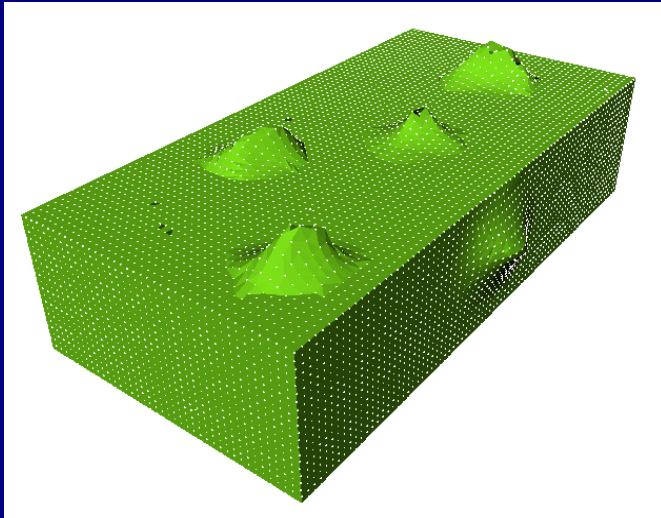
Benjamin B. Kimia – Brown University

Peter J. Giblin – Liverpool University

# Outline

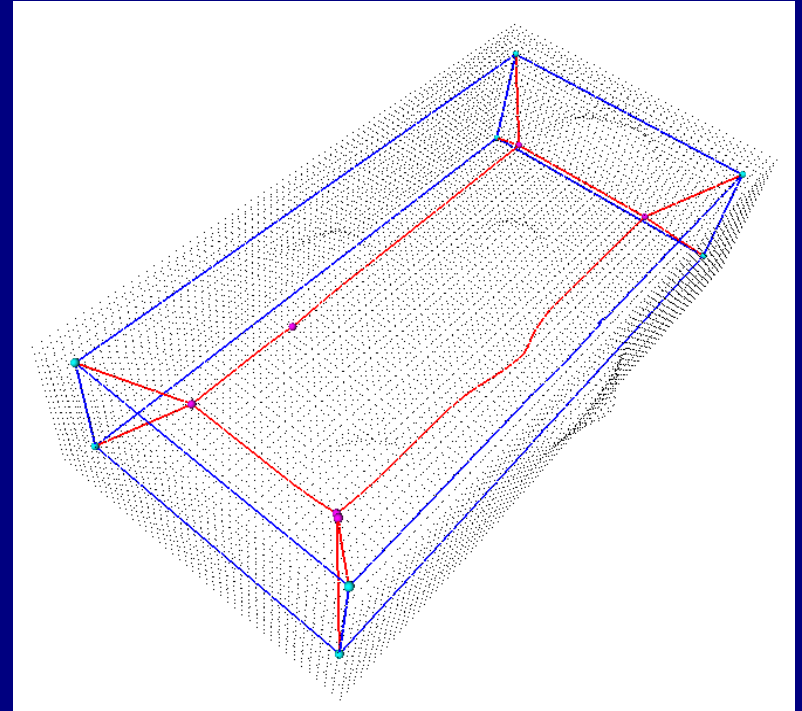
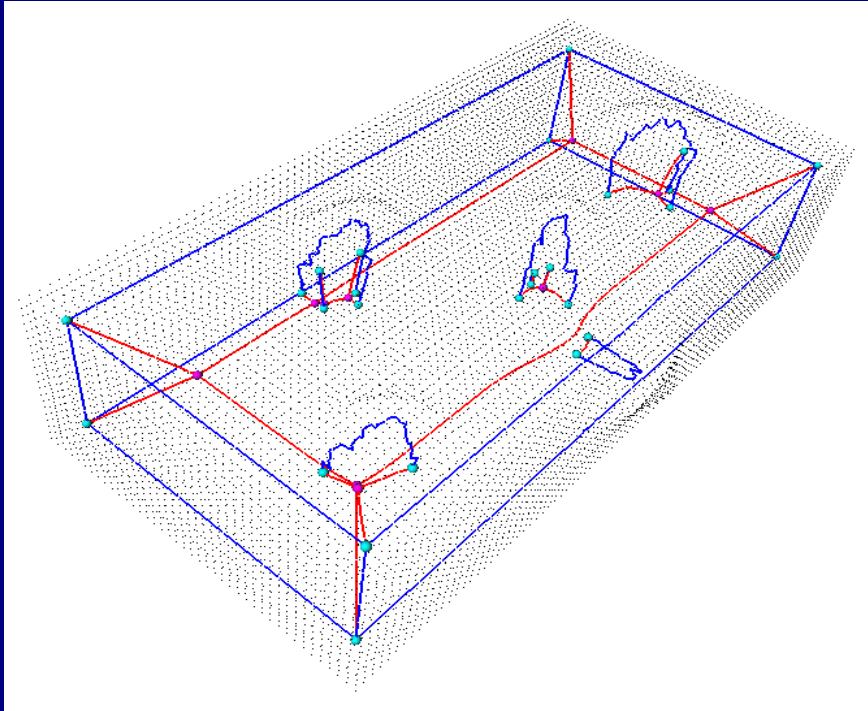
- Surface and object regularization – background
- Medial scaffold for 3D shape representation
- Transitions of the medial axis
- Algorithm
- Results
- Future work

# Surface and object regularization



- **Regularize shape**: smooth away less important features while preserving significant ones in the vicinity.
- **Classical smoothing** cannot distinguish between features and noise.
- Recent **anisotropic curvature smoothing** methods are parameter sensitive, require a careful treatment of surface boundaries, and well-defined surface meshes (and normal fields) [Tasdizen02, Hildebrandt04].

Our goal: develop a hierarchical shape representation to elicit (geometric) regularization

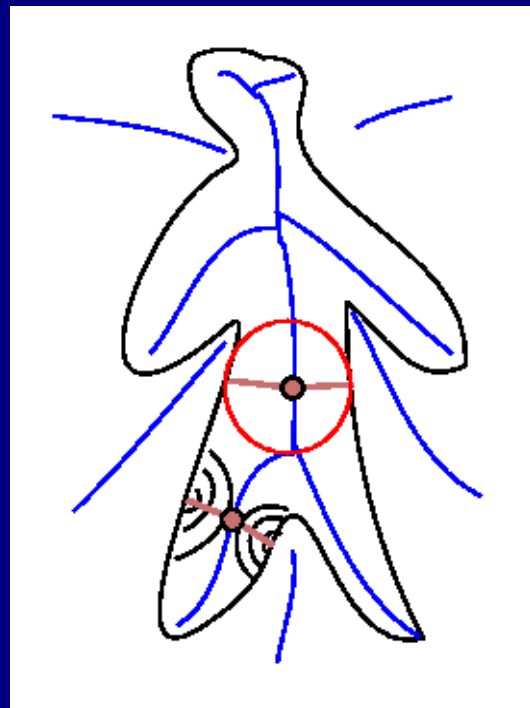
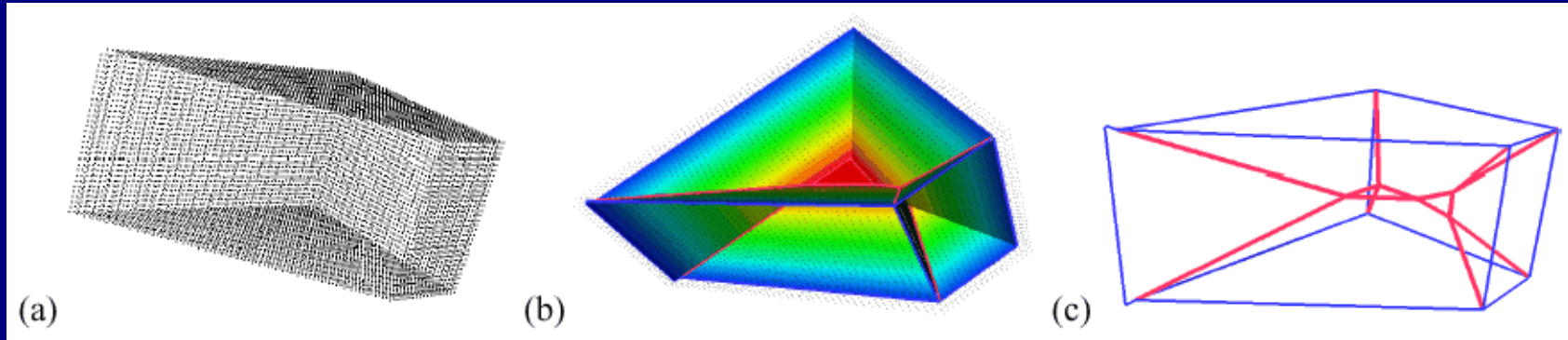


- Study the dynamics of the Medial Axis (MA) under perturbations.
- Requires a representation of the MA as a graph.

# Achievements

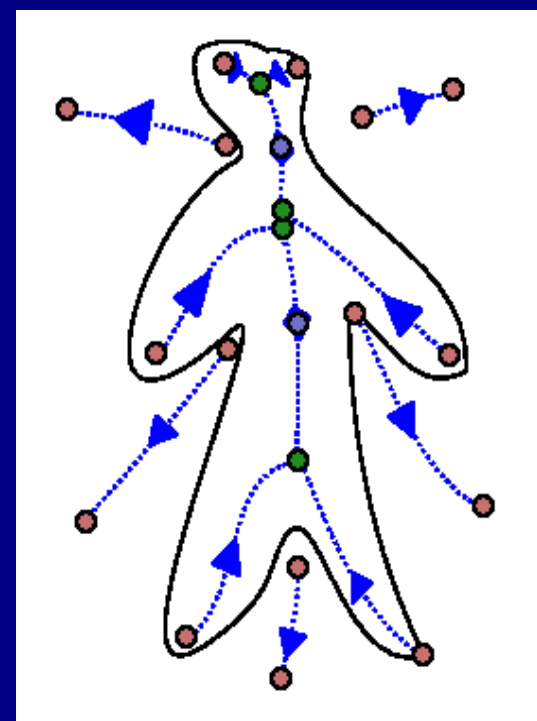
- Take input as unorganized point clouds or polygonal meshes.
- Can deal with objects under real scans, process partial surfaces.
- Robust under different resolutions, acquisition conditions.
- Do not require a closed surface mesh or voxelization, *i.e.*, no inside/outside, skeleton can be a graph with loops (not a tree).
- Do not over-simplified the extracted skeletal graph.
- Regularization: based on a comprehensive analysis of the the medial structure w.r.t. topological changes under shape perturbations.

# Shape representation: From the Medial Axis to the Medial Scaffold



Blum (1960's & 70's):  
Propagation vs.  
Contact with disks

2000+:  
Shock singularities  
Contact typology  
(Kimia, Giblin, *et al.*)

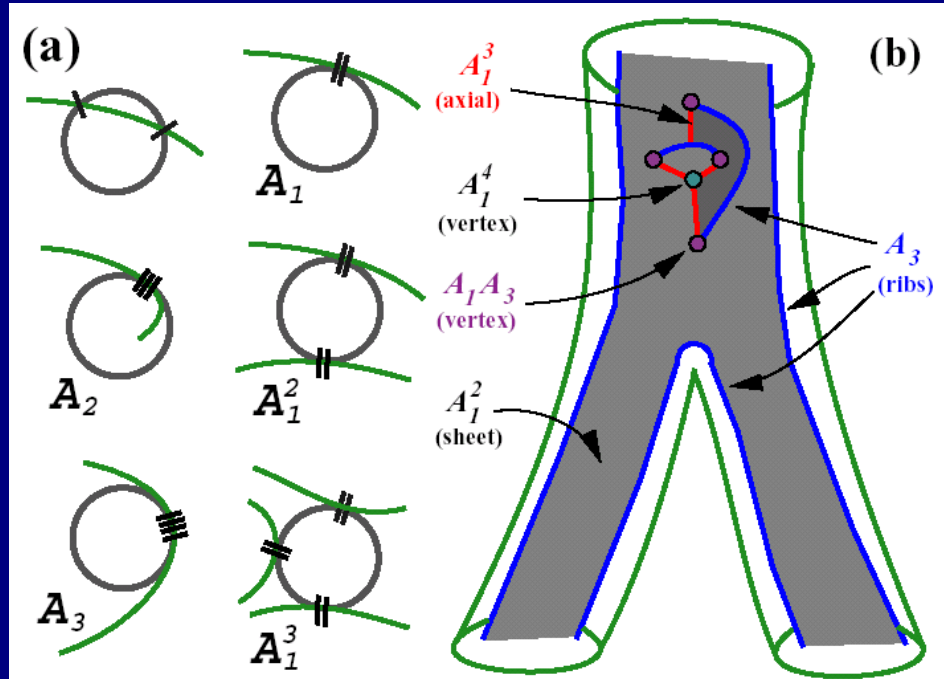


# Shape representation: From the Medial Axis to the Medial Scaffold

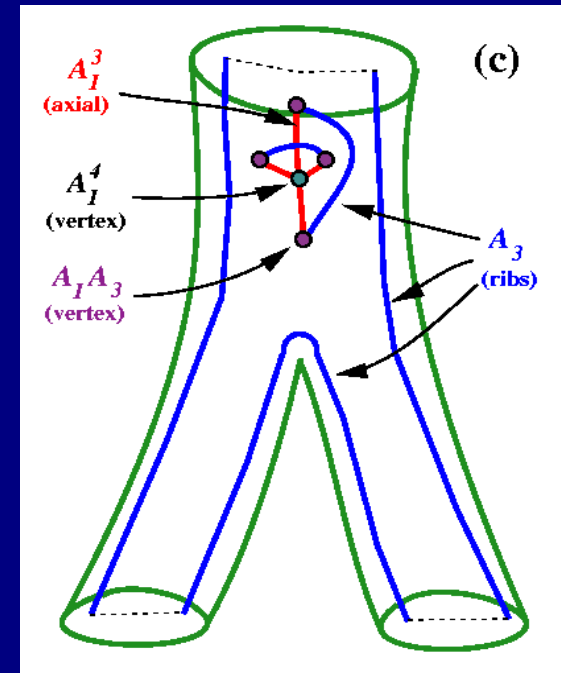
- 3D: Five types of points from **contact theory** [Giblin-Kimia PAMI04]:

$A_k^n$ : contact at  $n$  distinct points, each with  $k+1$  degree of contact

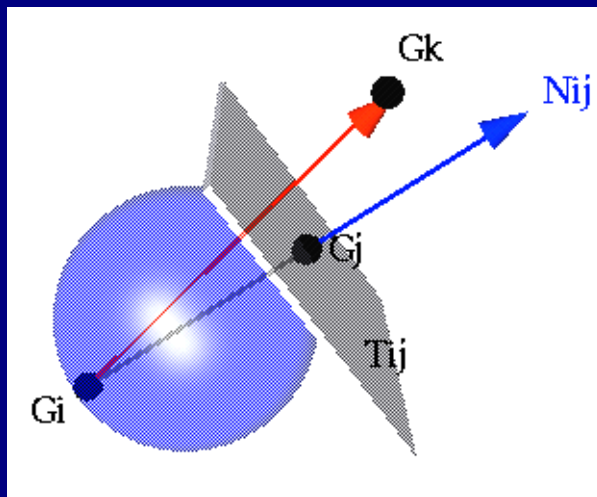
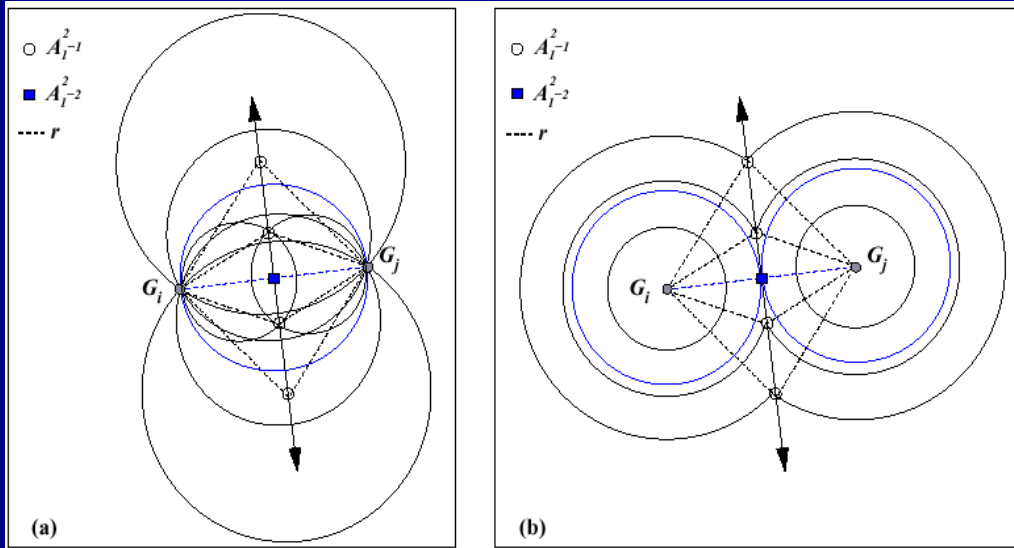
- **Sheet**:  $A_1^2$
- **Links**:  $A_1^3$  (**Axial**),  $A_3$  (**Rib**)
- **Nodes**:  $A_1^4$  (Voronoi vertices),  $A_1A_3$



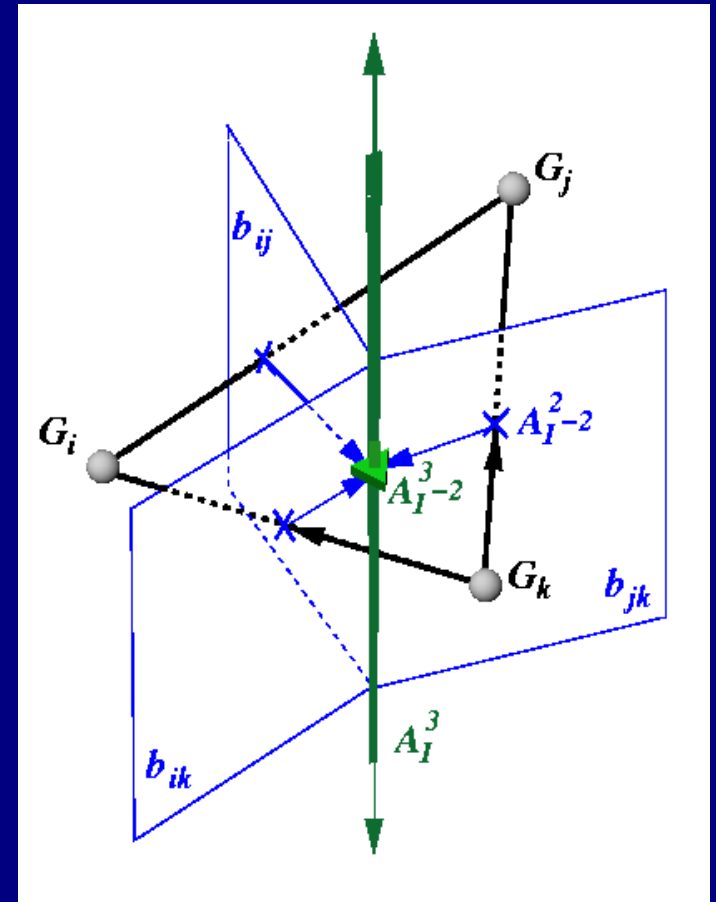
Leymarie-Kima '01: Keep only **singular points of the flow** (radius) to build a **graph**.



# Computing the Medial Scaffold



Leymarie-Kimia CVPR03:  
**Visibility constraints**  
 together with **clustering**  
 leads to efficiency in  
 computing the graph  
 (linear in practice in the number of input generators)



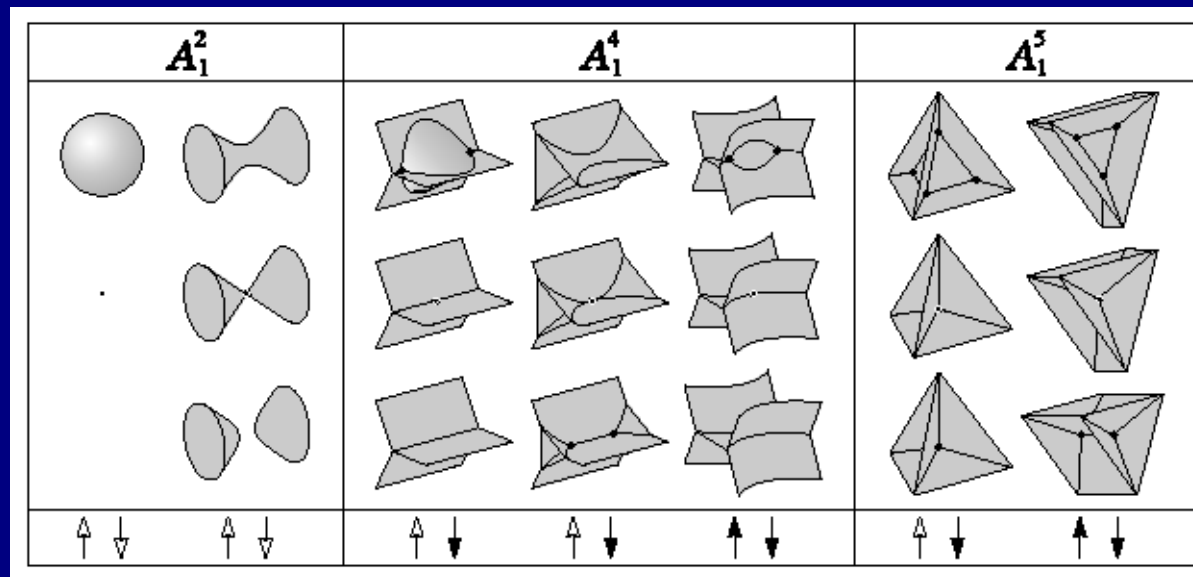


# Transitions of the MA

Study the topological events of the graph structure of the MA under **perturbations** and **shape deformations**.

**Singularity theory** (Arnold, Bogaevsky, since the 1990's):

- In 3D, 26 topologically different perestroikas of linear shock waves.



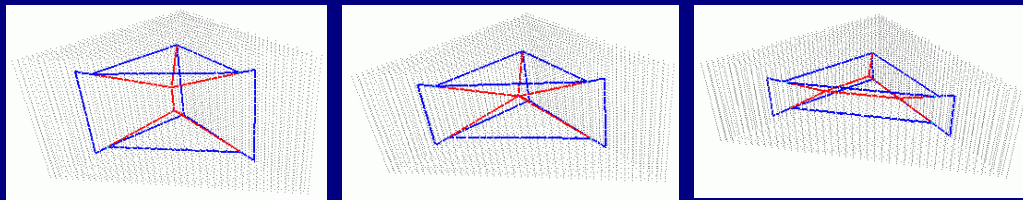
“Perestroikas of shocks and singularities of minimum functions,”  
I. Bogaevsky, 2002.

# Transitions of the Medial Axis (MA)

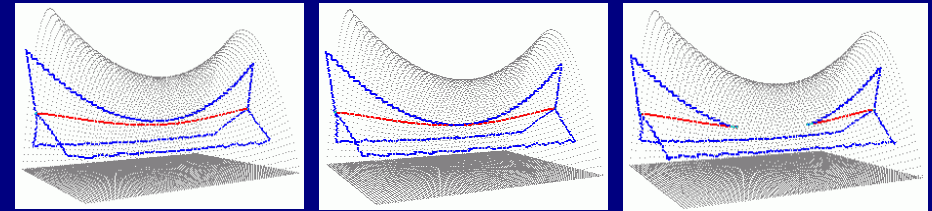
Study the topological events of the graph structure of the MA under **perturbations** and **shape deformations**.

Transitions of the MA (Giblin & Kimia, ECCV 2002):

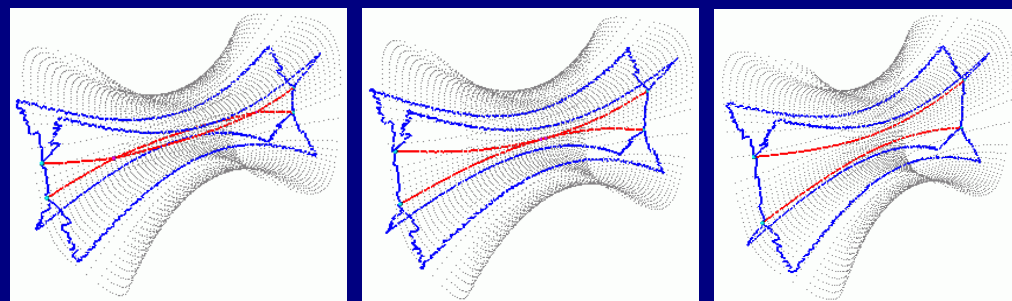
- Under a 1-parameter family of deformations, only **seven transitions** are relevant.



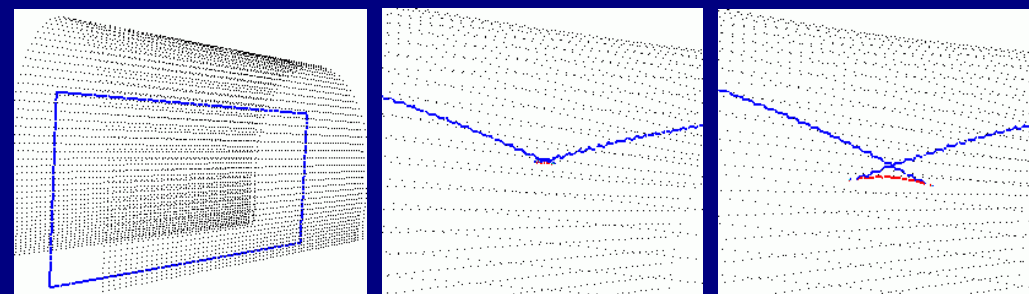
$A_1^5$  (compression-like)



$A_1A_3-II$  (pulling apart-like)



$A_1^4$  (compression-like)

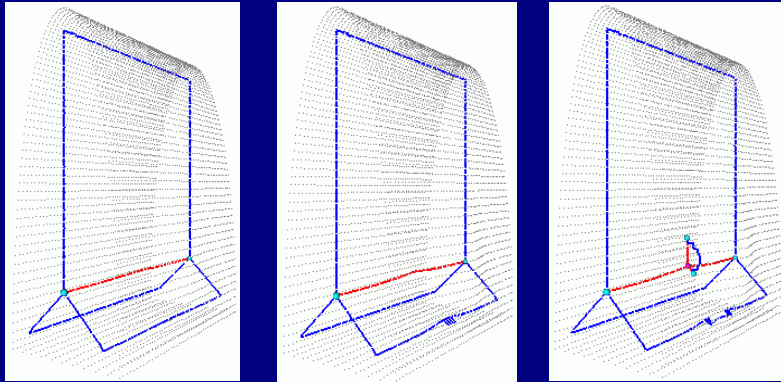
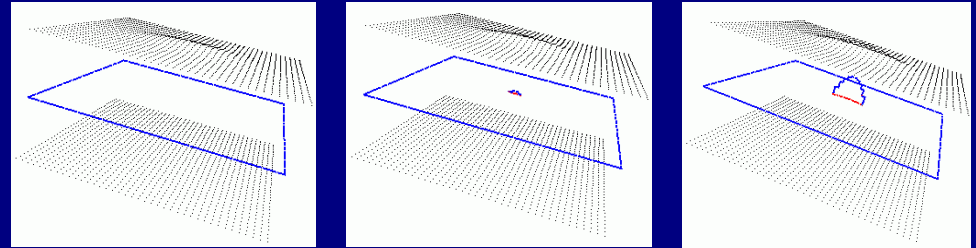


$A_5$  (ridge merging-like)

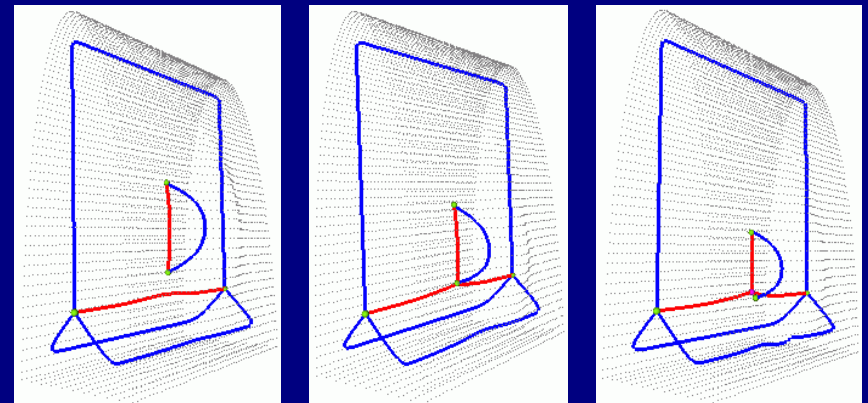
# Transitions of the Medial Axis (MA)

Study the topological events of the graph structure of the MA under perturbations and shape deformations.

$A_1 A_3$ -I (protrusion-like)



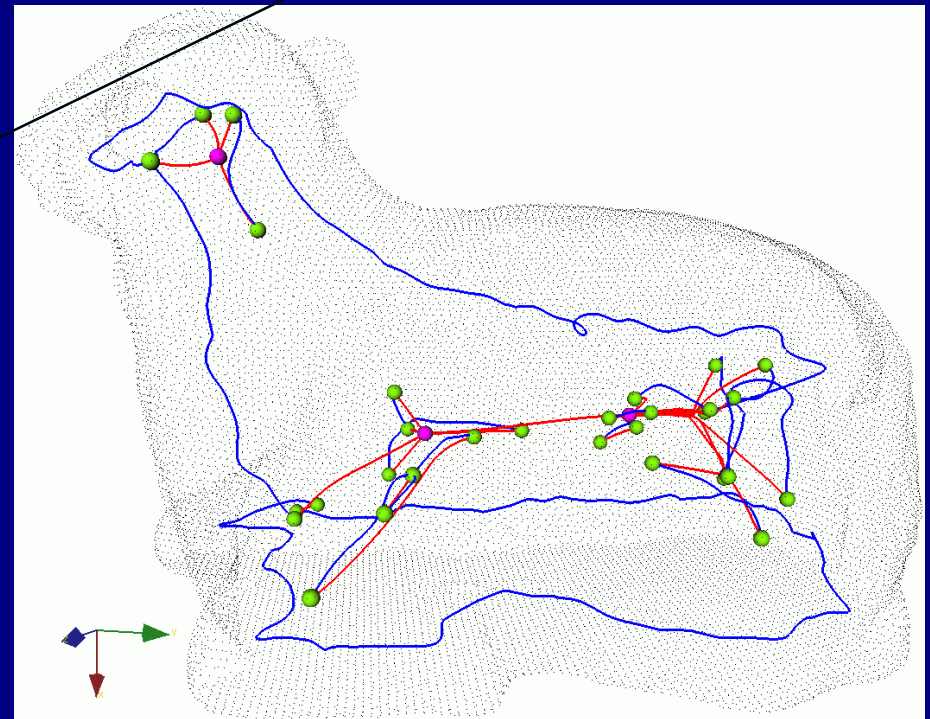
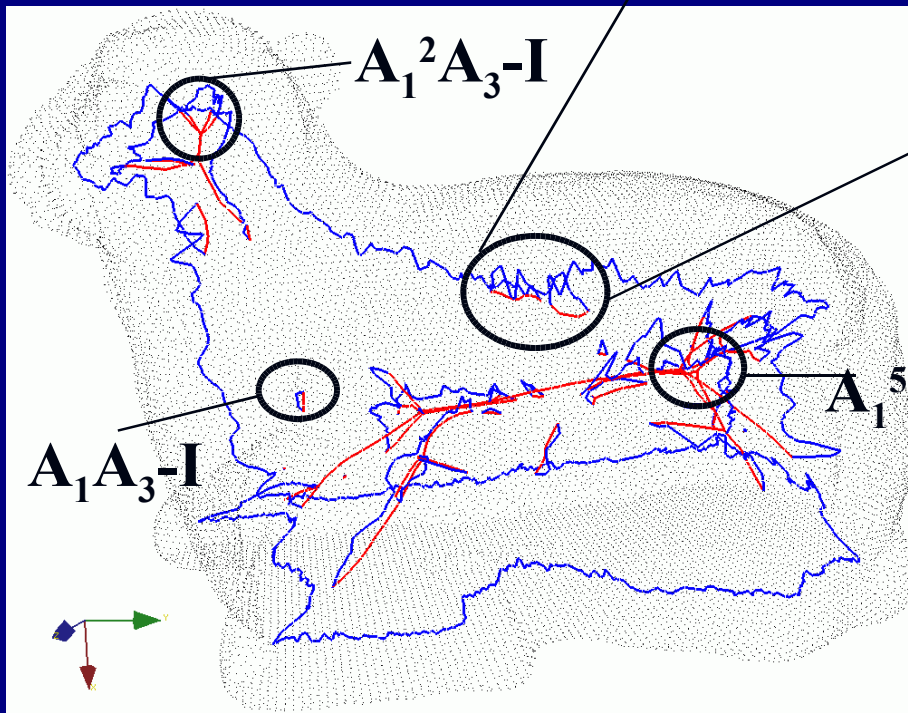
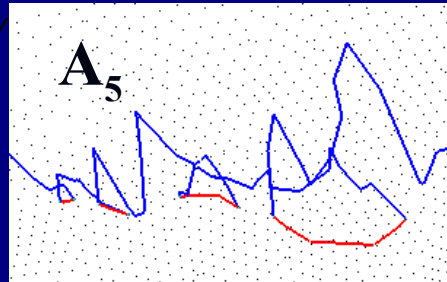
$A_1^2 A_3$ -I (protrusion on axial curve)



$A_1^2 A_3$ -II (protrusion moving thru an axial curve)

# Scaffold Regularization

- Transition removal, *i.e.*, remove **topological instability**
- Smoothing

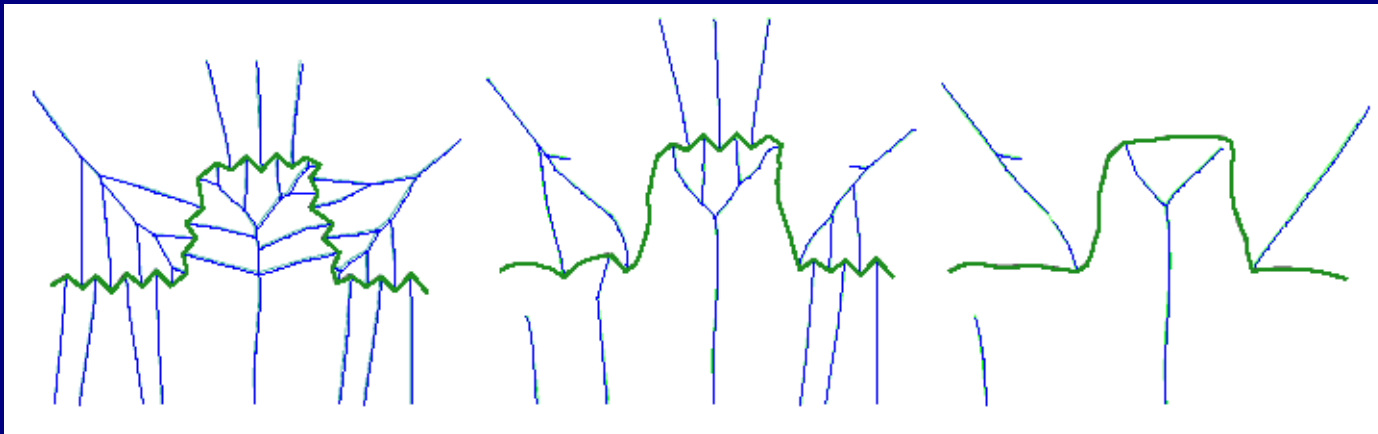


**Blue:**  $A_3$  links, **Red:**  $A_1^3$  links

**Green:**  $A_1 A_3$  nodes, **Pink:**  $A_1^4$  nodes

# 2D Scaffold Regularization

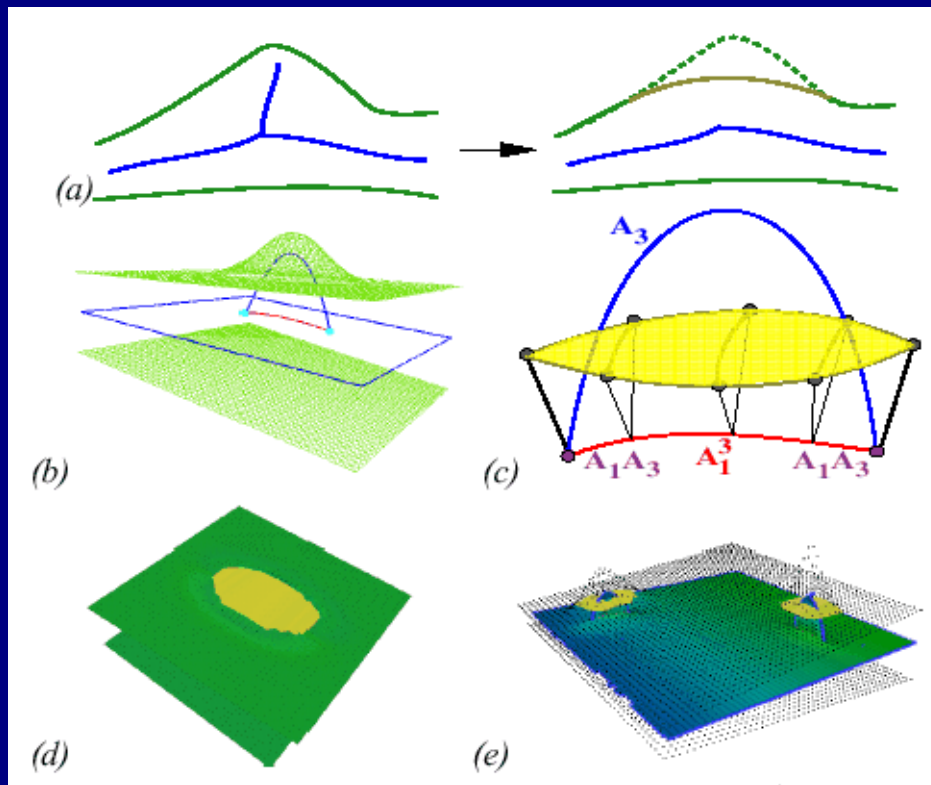
- Transition removal, *i.e.*, remove **topological instability**
- **2D Boundary Smoothing** ordered by “scale”  
(Tek & Kimia JMIV 2001).



Iterative removal of MA branches, ordered by boundary support (*i.e.*, how much of the contour is represented), coupled with local boundary model adjustment, results in corner enhancement and small perturbations' smoothing.

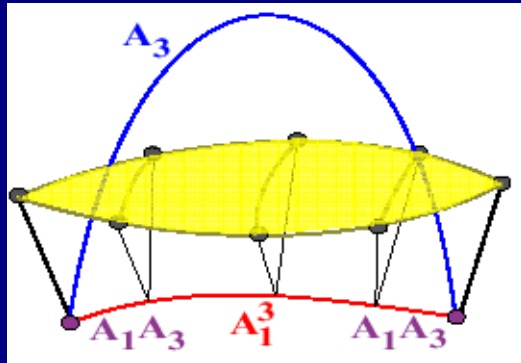
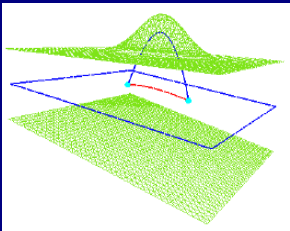
# 3D Scaffold Regularization

- Transition removal, *i.e.*, remove **topological instability**
- **3D Boundary Smoothing** ordered by “scale.”
- Only (3) transitions pertaining to “**protrusions**” are considered here.

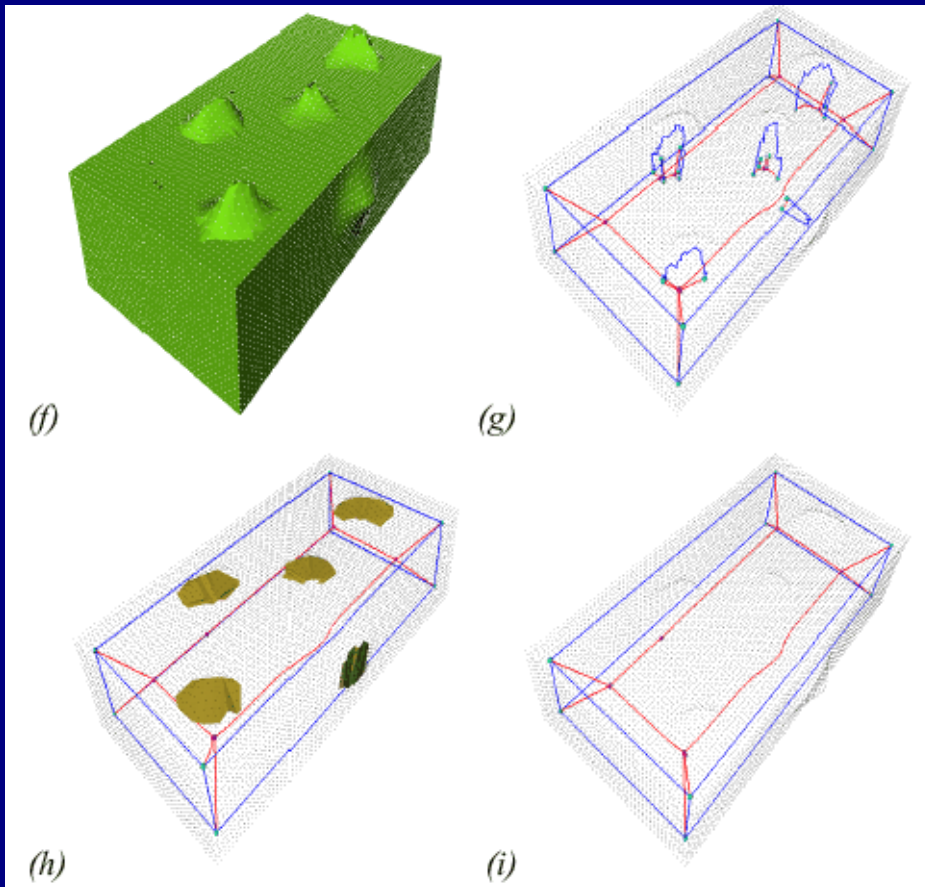


- (1) Detect **Axial-Rib** loops in the medial scaffold.
- (2) Support on the boundary is approximated as the volume subtended by V-shaped hinges which define a cap-like region in between the **axial** and **rib** curves delimiting a potential transition.

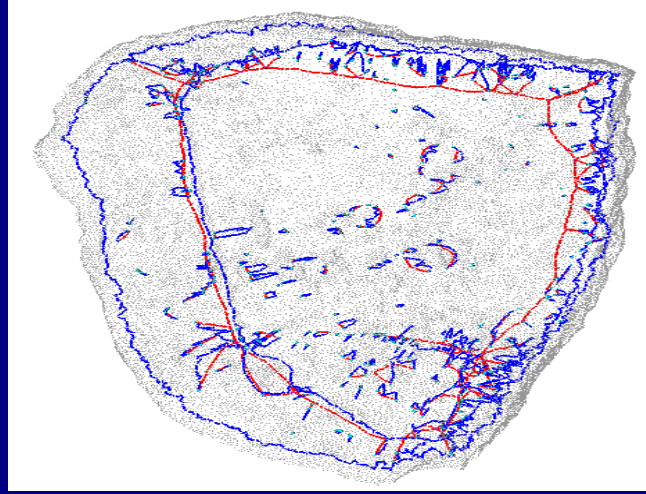
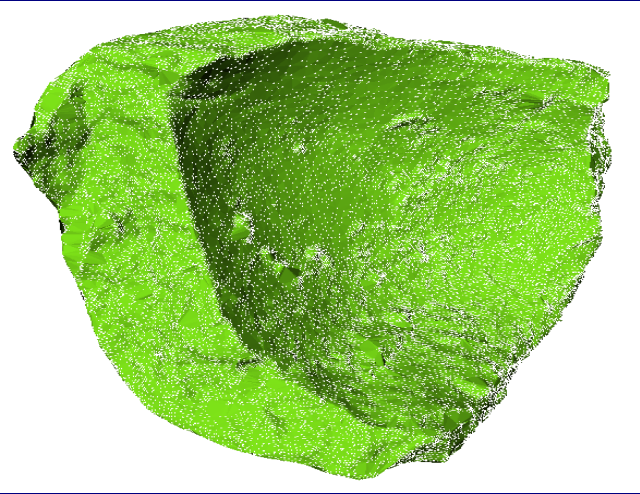
# 3D Scaffold Regularization



- (1) **Compute** full Scaffold from unorganized point clouds.
- (2) Symmetries pertaining to the interaction of nearby samples are used to mesh the data into **surface** patches ( $\underline{S}$ ) [Leymarie & Kimia, DIMACS 2003].
- (3) Remaining graph structure is the **Medial Scaffold (MS)**.
- (4) Detect **Axial-Rib loops** in MS.
- (5) “Walk” along **axial curves** for each loop identifies **contact curves** on  $\underline{S}$ : protrusions limits.
- (6) Build smooth **cut-off patches**.
- (7) **Rank order** loop structures.
- (8) Perform **transition removal**.

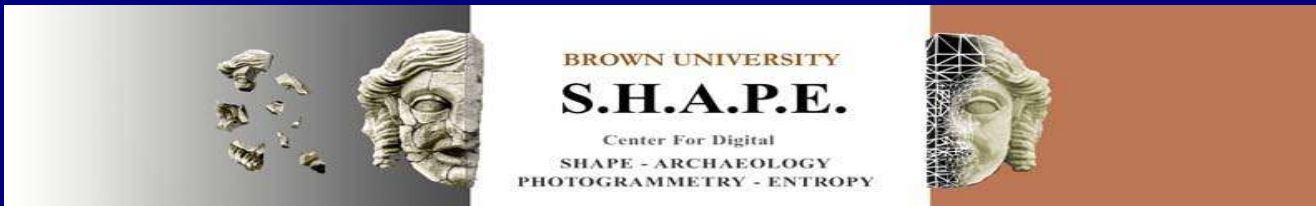
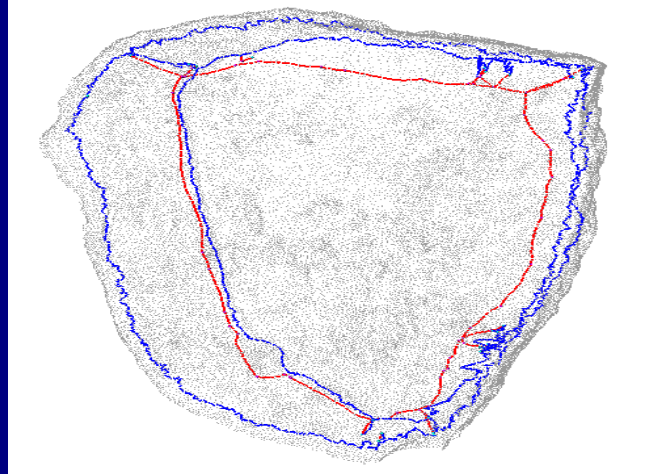
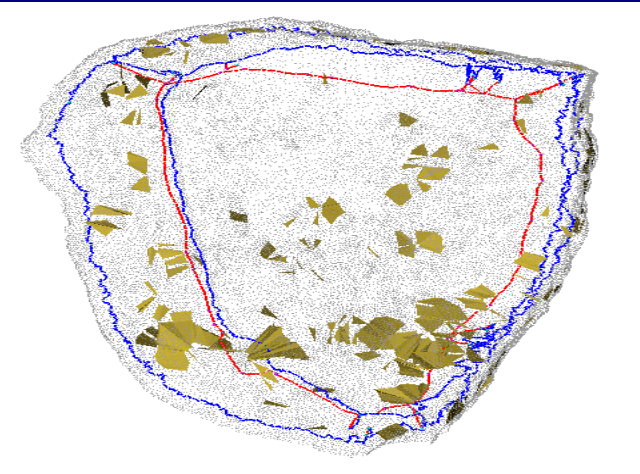


# 3D Scaffold Regularization



Sherd data: 50K  
from laser scans

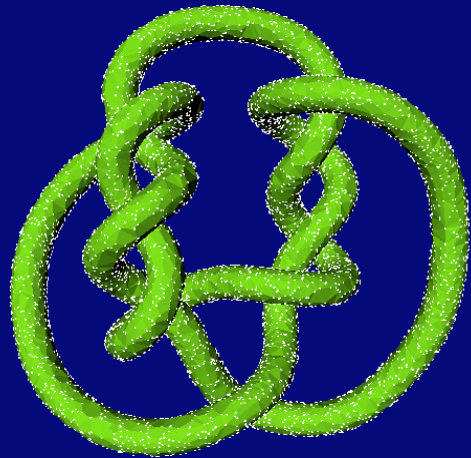
Significant **ridges**  
useful for pot  
matching and  
reconstruction  
(a 3D puzzle)  
in digital archaeology  
applications.



**SHAPE Lab. :**  
[www.lems.brown.edu/shape/](http://www.lems.brown.edu/shape/)

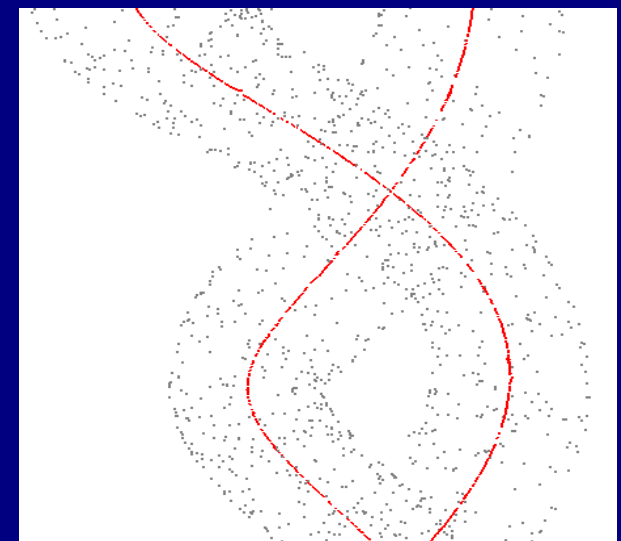
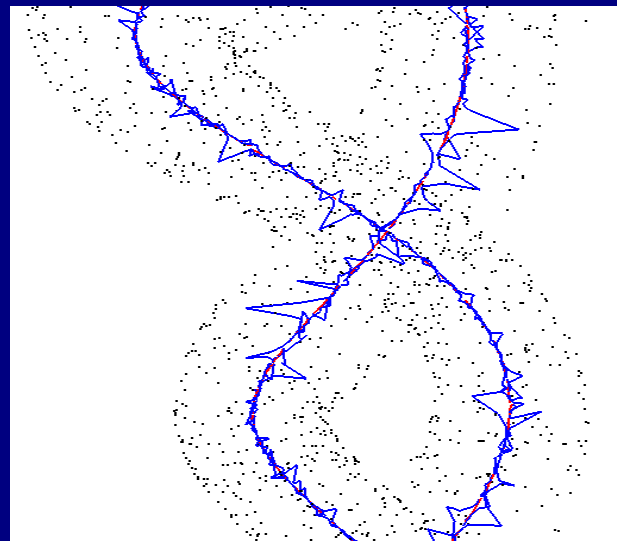
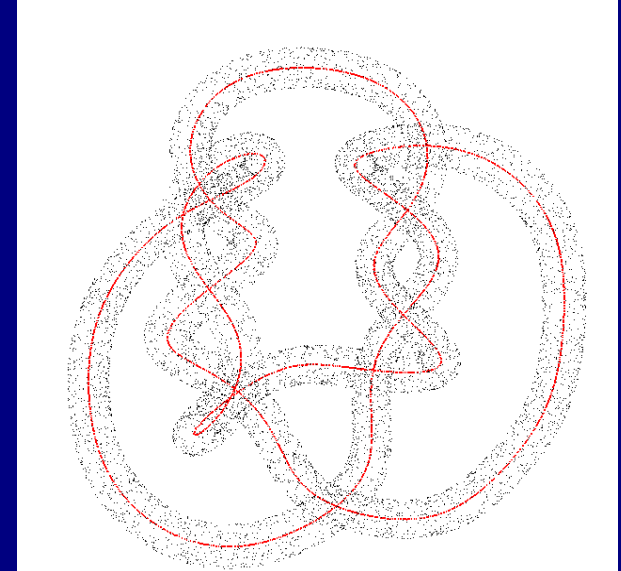
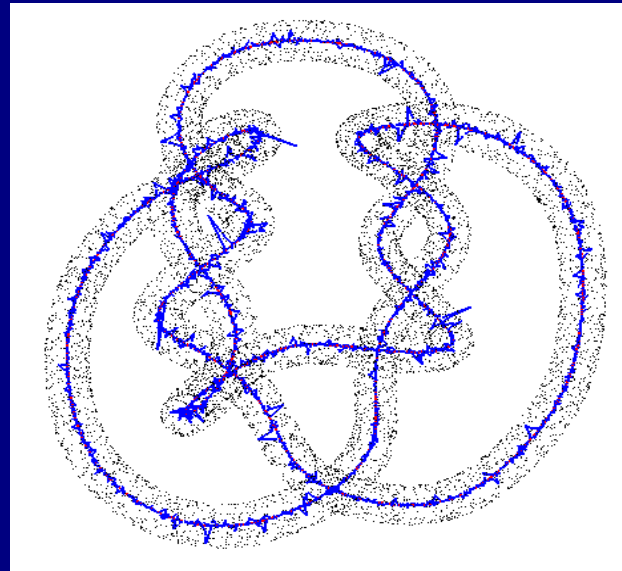


# 3D Scaffold Regularization



Knot data: 10K  
random samples

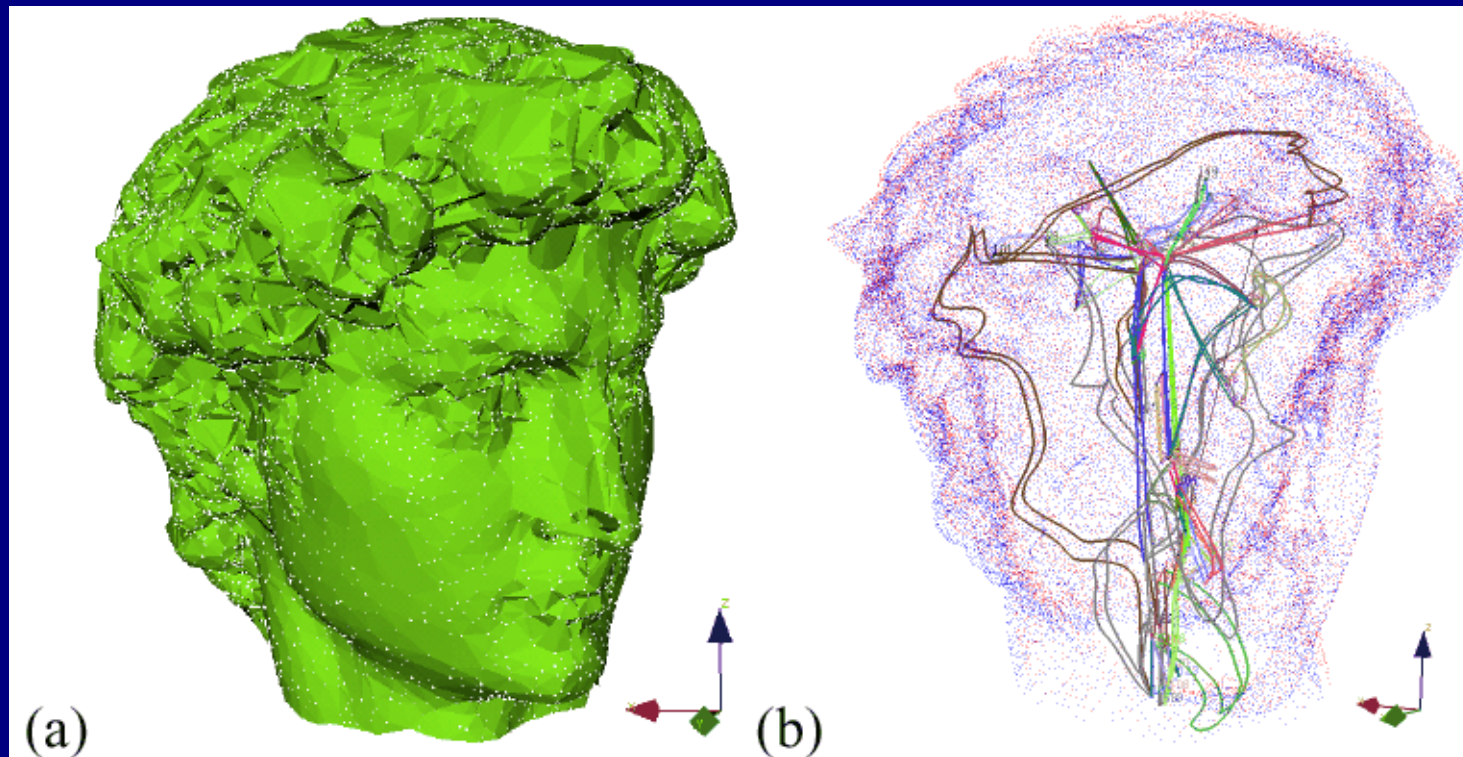
**Towards  
generalized  
cylinders**



# Towards 3D Object Recognition

Graph matching via graduated assignment

(to be presented at 3DPVT, Greece, Sept. 2004, Chang, Leymarie & Kimia)  
a solution to the **Global Registration** problem.

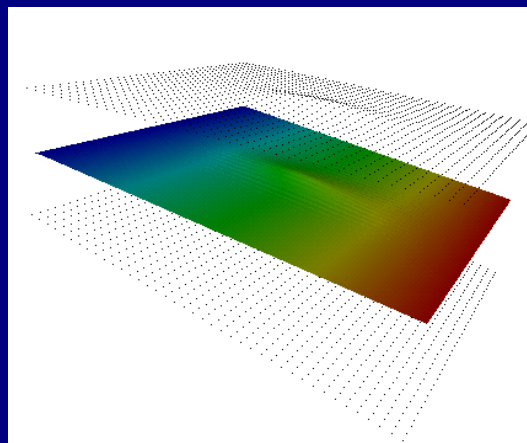


David data: 20K and 30K reduced sample sets (ground truth = 50K)

Validation against ground truth: (object dimension = 69x69x76)  
average sq. dist. = 0.000005

# Conclusions - Limitations

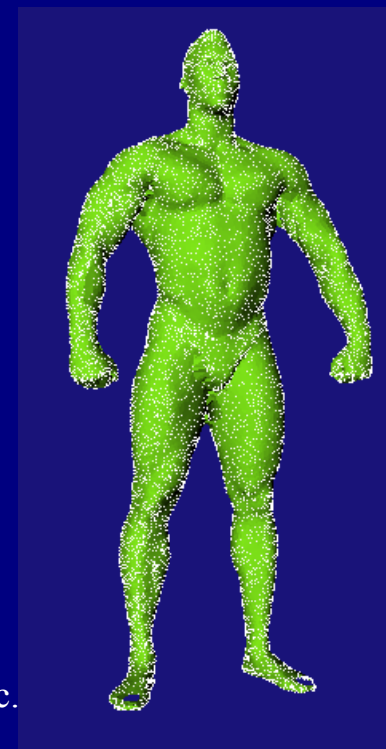
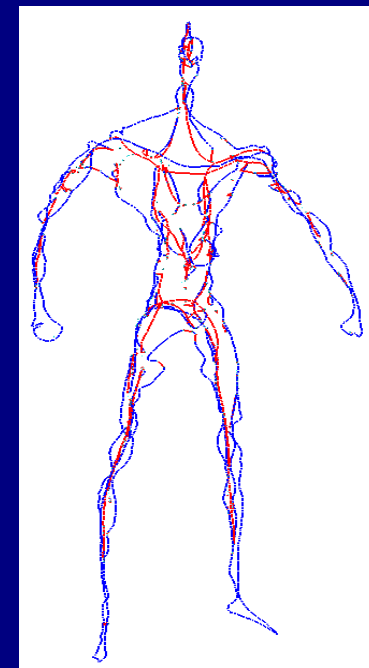
- Perturbations smaller than contact sphere radius are not “visible” from the graph structure alone.



Study **curvatures** of the MA [Damon, Giblin & Kimia, Siersma].

Study the **topography** of the MA, e.g., hills & dales [Nackman & Pizer, 1980's]

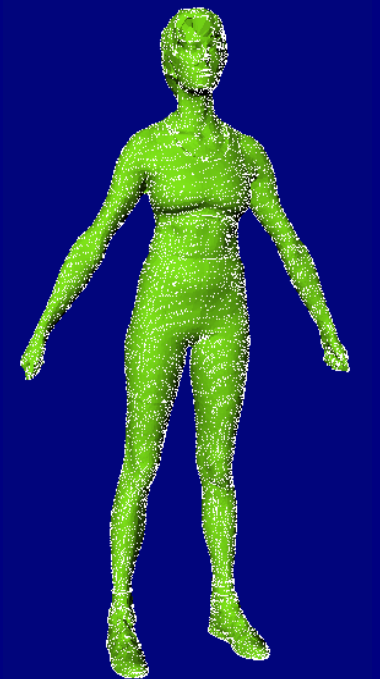
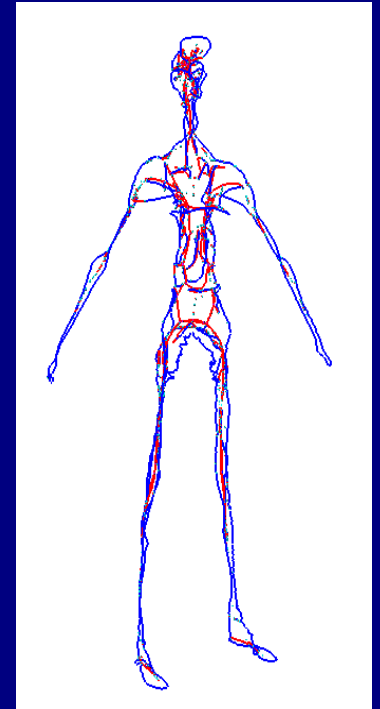
- Complementary to recent anisotropic smoothing methods (explicit ridges).
- Four remaining transitions not yet used for surface regularization.



Data from  
Cyberware Inc.

# Conclusions - Features

- Hierarchical representation is built-in.
- Scale represented: to distinguish large features from small ones and rank accordingly.
- Reconstruction of the shape from its skeleton is always possible (exact to approx.).
- Robustness: Structural information from the scaffold is more reliable than surface samples.
- Generalized axes of elongated objects, and ridges are explicit represented.
- Shape deformations are now handled.



Data from  
Cyberware Inc.

# WESKATMA

What Everybody Should Know About The Medial Axis

- A natural graph structure for the MA exists and leads to efficiency in computation, visualization, applications: the Medial Scaffold hierarchy in 3D.
- The MA is typically NOT overly sensitive to small (scale) perturbations; it does respond to sharpness.
- Shape deformations and perturbations are encoded as topological events, the transitions of shock waves.
- The MA needs not be traced explicitly: the focus should be on the (isolated) singularities of the radius flow.

