**Part I:** Issues of 3D Shape **Representation in Archaeology** 

*The SHAPE Lab.* Goldsmiths College, University of London

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## The digitisation bottleneck

What can we really do with the technology?

We may drown under too much data !!

One site can (easily) produce hundreds of thousands of registered artifacts.





SHAPE Labs @ Brown University (since 1999) and Goldsmiths College (since 2004)

Combining 3D data and shape representation to the benefit of archaeology



BROWN UNIVERSITY S.H.A.P.E.

Center For Digital SHAPE - ARCHAEOLOGY PHOTOGRAMMETRY - ENTROPY



#### The Great Temple at Petra, Jordan. Archaeological site: Martha Joukowsky and Brown University







## Basic (but not easy yet): 3D Reconstructions



### More useful: 3D realistic context





## VR and large DB access @ Brown university: the ARCHAVE system for the Great Temple at Petra, Jordan.



Challenge: multi scale, multi user interplay with large multimedia DB via VR systems



## Solving the 3D puzzle problem





Challenge: apply such ideas to free-form sculptural elements.



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## One, two, three, ...

- Digital Archaeology
- Context for the exploration of large DB
- 3D puzzle solvers
- •
- Shape representation

The Medial Axis Transform: Singular solutions of the Eikonal equation of geometric optics.

$$\sum_{i=1}^{n} \left(\frac{\partial u}{\partial x_i}\right)^2 = 1.$$



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

Wolter (1980+): Geodesics, cut-locus

1995+: Shock singularities Contact typology













## Digital Shape Understanding



### Shape Understanding for Digital Archaeology



#### hendrix.lems.brown.edu/~arw

Bayesian assembly of 3D Axially Symmetric Shapes from Fragments Andrew Willis and David Cooper, Brown University

### 3D puzzle solver: correct 10 piece assembly







## Deformable Models : Smart Materials



Plate 24. 94-S-8 and 94-S-3. Mask of a woman, West Walkway, 1994. Photograph by Artemis A. W. Joukowsky. Virtual archaeological reconstruction

7

6

4

5

### Virtual sculpting

Markov Random Fields as Gibb's Distributions on Vertices of 3D Surface Meshes.

Cliques and Clique Potentials model smart materials.



## Hole Filling and Surface Fairing



Irregular mesh with holes produced by 3D laser scanner.

 $V_1(\mathbf{p}_i) = \alpha_1 \|\mathbf{p}_i - \mathbf{p}_i^0\|^2$ 



MRF-produced surface using above as input data.



$$V_2(\mathbf{p}_i, \mathbf{p}_j) = \alpha_2 \|\mathbf{p}_i - \mathbf{p}_i^0 - \mathbf{p}_j + \mathbf{p}_j^0\|^2$$

### Virtual Nose Reconstruction







$$\|\kappa_{\overrightarrow{\mathbf{v}}}\|^2$$

$$(\kappa_{\overrightarrow{\mathbf{v}}_{\perp}}) - \frac{1}{K} \Sigma_{k=1}^{K} \kappa_{\overrightarrow{\mathbf{v}}_{\perp}}(j_{k}))^{2}$$









SHAPE @ Goldsmiths Frederic F. Leymarie www.doc.gold.ac.uk/~ffl oe ffl@gold.ac.uk **Part II: The Medial Scaffold** for 3D Shape Representation

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- Medial scaffold for 3D shape representation
- Transitions of the medial axis

Wave propagation Oberlin, Teichman *et al*.





Maximal disks Wolter *et al*.











In 3D: the MA is a set of connected surfaces with boundary properties.

In 2D: the MA is directly a set directed graphs.

Map the 3D MA to an equivalent 3D graph structure:

• by studying the radius flow along the MA, *i.e.* as a vector field.

Leymarie-Kimia: Keep only singular points of the flow (radius) to build a graph (2001).



- 3D: Five types of points from contact theory [Giblin-Kimia PAMI04]:
  - Sheet:  $A_1^2$
  - Links:  $A_1^3$  (Axial),  $A_3$  (Rib)
  - Nodes:  $A_1^4$  (Voronoi vertices),  $A_1A_3$

 $\mathbf{A}_{k}^{n}$ : contact at *n* distinct points, each with k+1 degree of contact



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





Figure 4: (a) Generic situation for the initial flow of an  $A_1^2$  shock sheet: from the initial shock source, an  $A_1^2-2$  point, a 3D surface *S* radially grows-out to form the sheet; arrows indicate some directions of increasing radius values along the  $\mathcal{MA}$  sheet. (b) Flows at  $A_1^3$  and  $A_3$  shock curves. (c) Flows at  $A_1^4$ shock points, where the number of *inward* flows is indicated.

Shocks	Regular	Source	Relay	Sink
Sheet	$A_1^2 - 1$	$A_1^2 - 2$	$A_1^2 - 3^*$	$A_1^2 - 4$
Rib	$A_3 - 1$	$A_3 - 2$	$A_3 - 3^*$	$A_3-4$
Axis	$A_1^3 - 1$	$A_1^3 - 2$	$A_1^3 - 3^*$	$A_1^3 - 4$
Rib end	12	$A_1A_3-2$	$A_1A_3-3$	$A_1A_3-4$
Axis	1 <u>11</u> 2	N <u>n</u>	$A_1^4 - 2,$	$A_1^4 - 4$
end			$A_1^4 - 3$	100

Table 2: Final classification of 18 possible shock points based on contact with spheres,  $A_k^n$ , and flow type. There are 3 regular shock types, and 15 singular ones which are the sources, relays, or sinks for the flow. \* We consider degeneracies, *i.e.*, part of  $A_1^2$ -3,  $A_3$ -3 and  $A_1^3$ -3, as a special case of relay where shocks flow simultaneously in and out.



Figure 6: From the "classical"  $\mathcal{MA}$  static representation to the medial scaffolds. (a) Typical situation in 3D, where three medial sheets intersect into a medial curve. (b) Representation by the *augmented medial scaffold*, where medial nodes (red dots) along curves are connected by links; hyperlinks' cyclic order is indicated by a counterclockwise arrow. (c) Representation by the *medial scaffold* ( $\mathcal{MS}$ ), where the interior of sheets is implicit. (d) The *reduced medial scaffold*, is obtained from the  $\mathcal{MS}$  by discarding the geometry of shock curves. (e) The *topological medial scaffold* is obtained from the  $\mathcal{MS}$  when only the topology of the graph structure is preserved. **Red** dots correspond to  $\mathcal{MA}$  vertices, *i.e.*,  $A_1^4$  or  $A_1A_3$ . **Green** triangles correspond to shock sources of curves, *e.g.*,  $A_1^3$ –2 points, which are needed for capturing the  $\mathcal{MS}$ .  $A_1^3$  and  $A_3$  curves are shown in **red** and **blue**, respectively.

#### Medial Scaffold of **Point** Generators



Figure 7: (a) Two point generators generate an  $A_1^2$  shock sheet initiated at an  $A_1^2-2$  shock source at middistance between them. (b) Three point generators generate an  $A_1^3$  shock curve flowing in two opposite directions initiated at the  $A_1^3-2$  shock positioned at the circumcenter of the triangle defined by the triplet of generators. (c) Four point generators generate an  $A_1^4$  shock vertex located at the circumcenter of the corresponding tetrahedron.

Shocks	Regular	Source	Relay	Sink
Sheet	$A_1^2 - 1$	$A_1^2 - 2$	120) 	1
Axis	$A_1^3 - 1$	$A_1^3 - 2$	$A_1^3 - 3$	3 <b>.</b>
Axis end	-		$A_1^4 - 2, A_1^4 - 3$	$A_1^4 - 4$

Table 4: Only eight types of shock points arise from point generators.

#### Medial Scaffold of **Point** Generators





NB: Relationship with Morse theory (Siersma, Hart, Edelsbrunner, *et al.*)

### Medial Scaffold of **Point** Generators





### Medial Scaffold of **Point** Generators **Computation: Visibility property**



Figure 11: (a) The  $A_1^2-2$  shock between  $\mathbf{G}_i$  and  $\mathbf{G}_k$  forms iff there exists no generator  $\mathbf{G}_j$  inside the circle (sphere) with diameter  $\mathbf{G}_i\mathbf{G}_k$ . Thus, the angle  $\angle \mathbf{G}_i\mathbf{G}_j\mathbf{G}_k$  must either be acute or at most a right angle. (b) Thus, when considering potential pairings of generators with  $\mathbf{G}_i$ , the presence of  $\mathbf{G}_j$  implies that generators in the shaded area cannot possibly form a pairing with  $\mathbf{G}_i$  as  $\angle \mathbf{G}_i\mathbf{G}_j\mathbf{G}_k$  is then obtuse for those points; (c) in 3D, this region is a half-space (delimited by the plane  $\mathbf{T}_{ij}$ ).
#### Medial Scaffold of **Point** Generators **Computation: Visibility property**





#### Medial Scaffold of **Point** Generators **Computation: complexity**



Figure 18: Timing results for the construction of the shock scaffold for a set of artificially generated random samples from a 3D block (Left), and for a set of 40 shapes including pot sherds, body scans, blood vessels, mechanical parts, *etc.* (Right). All experiments were performed on an SGI Octane 2 (IRIX 6.5)® with a C language implementation, but using non-optimized development code. Horizontal scaling:  $\times 10^4$ .

2D is easy for smooth outlines



NB: Work of Amenta et al.

















- Medial scaffold for 3D shape representation
- Transitions of the medial axis

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

Singularity theory (Arnold *et al.*, 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.

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.

Transition	Collision of Types
$A_1^4$	$A_1^3 - A_1^3$
$A_{1}^{5}$	$A_1^4 - A_1^4, A_1^4 - A_1^3$
$A_5$	$A_1A_3$ - $A_1A_3$ , $A_3$ - $A_3$
$A_1A_3 - I$	$A_1A_3 - A_1A_3$
$A_1A_3 - II$	$A_1A_3$ - $A_1A_3$ , $A_1^3$ - $A_3$
$A_1^2 A_3 - I$	$A_1^4 - A_1 A_3$
$A_1^2 A_3 - II$	$A_1^3 - A_1 A_3$

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.



 $A_1A_3$ -I (protrusion-like, Leymarie, PhD, 2002)









#### $A_1^5$ (compression-like)













A<sub>5</sub> (ridge merging-like)

# Scaffold Regularization

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







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

Green:  $A_1A_3$  nodes, Pink:  $A_1^4$  nodes

# **2D** Scaffold Regularization

- Transition removal, *i.e.*, remove topological instability
- 2D Boundary Smoothing (via symmetry transforms) ordered by "scale" (Kimia, Tek, 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

#### (Leymarie, Kimia, Giblin, 2003-4)



# **3D** Scaffold Regularization



# Knot data: 10K random samples

Towards generalized cylinders



# Visual Search in large 3D DB

Graph matching via graduated assignement (presented at 3DPVT, Greece, Sept. 2004, Chang, Leymarie & Kimia) a solution to the Global Registration problem.



Digital Michelangelo Stanford, Firenze, NRC





Challenge: robust automatic extraction of graphs, dealing with topological instabilities/events.

### Compare Medial Scaffolds by Graph Matching

#### • Intractability

- Weighted graph matching: NP-hard
- One special case: Largest common subgraph: NP-complete
- Only "good" sub-optimal solutions can be found
- Graduated Assignment [Gold & Rangarajan PAMI'96]
  - [Sharvit *et. al.* JVCIR'98] index 25-shape database by matching 2D shock graphs





- 3D hypergraph matching:
  - Additional dimension
  - Generally not a tree, might have isolated loops
  - No inside/outside: non-closed surfaces or surface patches

## Graduated Assignment

#### Quadratic weighted graph matching

G,  $\overline{G}$ : 2 undirected graphs I: # of nodes in G, I: # of nodes in  $\overline{G}$  $\{G_i\}, \{\overline{G_i}\}$  nodes  $\{G_{ii}\}, \{\overline{G_{ii}}\}$  edges: adjacency matrices of graphs



Then objective function to maximize over the space of **M** 

Cost of matching G<sub>ij</sub> to G<sub>ij</sub>. – If the nodes match, how similar the links are.

is:  

$$E(\mathbf{M}) = \sum_{i=1}^{I} \sum_{\overline{i}=1}^{\overline{I}} \sum_{j=1}^{I} \sum_{\overline{j}=1}^{\overline{I}} \mathbf{M}_{i\overline{i}} \mathbf{M}_{j\overline{j}} L_{i\overline{i}j\overline{j}} + \alpha \sum_{i=1}^{I} \sum_{\overline{i}=1}^{\overline{I}} \mathbf{M}_{i\overline{i}} N_{i\overline{i}}$$

$$\mathbf{L}_{i\overline{i}j\overline{j}} : \text{link similarity between } \mathbf{G}_{ij} \text{ and } \mathbf{G}_{ij}$$
Cost of matching **C**

 $\mathbf{N}_{ii}$ : node similarity between  $\mathbf{G}_i$  and  $\mathbf{G}_i$ 

#### Modified Graduated Assignment for 3D Medial Scaffold Matching

$$E(\mathbf{M}) = \begin{cases} \alpha \sum_{i=1}^{I} \sum_{\overline{i}=1}^{\overline{i}} \mathbf{M}_{i\overline{i}} N_{i\overline{i}} + \beta \sum_{i=1}^{I} \sum_{\overline{j}=1}^{\overline{i}} \sum_{\overline{j}=1}^{\overline{i}} \sum_{\overline{i}ij}^{\overline{i}} \mathbf{M}_{i\overline{i}} \mathbf{M}_{j\overline{j}} L_{i\overline{i}j\overline{j}} \\ + \sum_{i=1}^{I} \sum_{\overline{i}=1}^{\overline{i}} \sum_{j=1}^{\overline{i}} \sum_{\overline{j}=1}^{\overline{i}} \sum_{k=1}^{\overline{i}} \sum_{k=1}^{\overline{i}} \mathbf{M}_{i\overline{i}} \mathbf{M}_{j\overline{j}} \mathbf{M}_{k\overline{k}} H_{i\overline{i}j\overline{j}k\overline{k}} , \end{cases}$$
Node cost:  
(radius)
$$N_{i\overline{i}}(G_i, \overline{G}_{\overline{i}}) = \begin{cases} 0, & \text{if } G_i \text{ and } \overline{G}_{\overline{i}} \text{ have different types,} \\ 1 - |\frac{r_i - r_{\overline{i}}}{max(R,\overline{R})}|, & \text{otherwise,} \end{cases}$$
Link cost:  
(tength)
$$L_{i\overline{i}j\overline{j}} = \begin{cases} 0, & \text{if any of links } ij \text{ and } \overline{i}\overline{j} \text{ are missing,} \\ 1 - |\frac{l_{ij} - l_{\overline{i}\overline{j}}}{max(L,\overline{L})}|, & \text{otherwise,} \end{cases}$$
Sheet (hyperlink) cost: (corner angle)
$$H_{i\overline{i}j\overline{j}k\overline{k}} = \begin{cases} 0, & \text{if any links } ij, jk, \overline{i}\overline{j}, \overline{j}\overline{k} \text{ are missing,} \\ 1 - |\angle{ijk} - \angle{\overline{i}\overline{j}\overline{k}}|, & \text{otherwise,} \end{cases}$$

### Medial scaffold matching example

#### Archaeological pot

Two scans of the outside surface of a pot (50K and 40K). The inner surface of the pot is missing.

Initial alignment via scaffold matching



Final registration after ICP



## Towards 3D Object Recognition



# Towards 3D Object Recognition



# Conclusions – Limitations + Future

- Perturbations smaller than contact sphere radius are not "visible" from the graph structure alone.
- Complementary to recent anisotropic smoothing methods (explicit ridges).
- Cost measures for 3D shape matching are at an early stage of development.
- Extension to other generators (inputs) is underway (polygons, curved patches).





## Conclusions – Extended generators







Requires hybrid methods: algebraic (Groebner bases) and numerical (intervals)

# Part III: Science, Art & Shape

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Ryonji garden, Japan, 15<sup>th</sup> century



#### Gert van Tonder et al. --- Nature, 2002.



Gert van Tonder et al. --- Nature, 2002.



Local (A1) vs. global (A2) MA's in Ryonji B1: Zakkein (no longer exists) – B2: Akisato Ritoh (1799)



#### Lascaux paintings







ROSE: Representation Of Spatial Experience ---- Ed Burton



AIKON: Automated/Artistic IKONograph ---P. Tresset & F. F. Leymarie @ Goldsmiths













AIKON: Automated/Artistic IKONograph ---P. Tresset & F. F. Leymarie @ Goldsmiths



AIKON: Automated/Artistic IKONograph ---P. Tresset & F. F. Leymarie @ Goldsmiths




(b)



# **Biomimetics & Sculpting**

Collaboration with Mid-Ocean Studio

### Brower Hatcher's manifesto:

Paradigm for sculpting where a deformable, layered, approximately regular scaffold structure is used as a framework upon which other sculptural elements can be associated.



# **Biomimetics & Sculpting**



(a)

## **Biomimetics & Sculpting**



Collaboration between Mid-Ocean Studio, Brown University & Goldsmiths College



### Kelowna, British Columbia, Canada

# **Biomimetics & Sculpting**



#### Using the Medial Scaffold to initiate biomimetism.

## Visual Search in large image DB

Expertise: Search via patterns represented as shock **graphs**.





Challenge: robust automatic extraction of graphs, dealing with topological instabilities/events.

# Perception Illusory contours & Gestalt



#### Kanisza triangle: 2D --> 3D



## Perception





Kanisza triangle: Symmetry transforms --- Ben Kimia et al.

# Perception --- Motion





M. Duchamp Nude descending a staircase (1912)

Etienne-Jules Marey --- Motion studies (1886)

### Perception --- Motion





#### Sensitivity maps: I. Kovacs, B. Julesz et al.

### Perception – Brain activity







#### Sensitivity maps: I. Kovacs, B. Julesz et al.

### Conclusions



#### www.doc.gold.ac.uk/morpholingua/

#### Special thanks to Rien v. d. Weygaert & Vincent Icke

### Project Mutations



FormGrow: S. Todd & W. Latham (early 1990's)

## Project Mutations



William Latham's organic art

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Other collaborators: Franz-Erich Wolter (Hannover), Gert van Tonder (Kyoto), Liliana Albertazzi (Bolzano), ...

www.doc.gold.ac.uk/morpholingua/