

Mesh Segmentation

Thomas Funkhouser
(most slides by Arik Shamir)

Introduction

Goal:

- Given: a mesh $M = \{V, E, F\}$
- Create: a set S of submeshes M_i that partition the faces of M into disjoint subsets.

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Motivation

Applications:

- Analysis
- Representation
- Recognition
- Collision detection
- Animation
- Modeling
- etc.

Motivation

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Cohen-Steiner et al.

Motivation

Applications:

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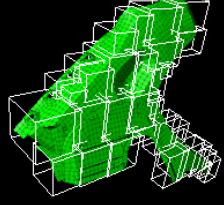
Query

Database

Motivation

Applications:

- Analysis
- Representation
- Recognition
- Collision detection**
- Animation
- Modeling
- etc.

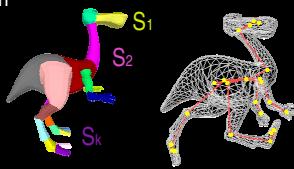


Tal & Frisch

Motivation

Applications:

- Analysis
- Representation
- Recognition
- Collision detection
- Animation**
- Modeling
- etc.

Katz & Tal

Motivation

Applications:

- Analysis
- Representation
- Recognition
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- Animation
- Modeling**
- etc.



Problem Statement

Optimization formulation:

- Given: a mesh $M = \{V, E, F\}$
- Create: a set S of submeshes M_i that partition the faces of M into disjoint subsets that minimize an objective function J under a set of constraints C



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Outline

- Constraints
- Objective function
- Algorithmic strategies
- Evaluation

Constraints

Cardinality

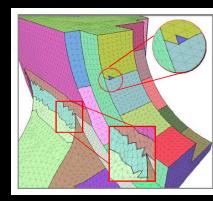
- Not too small and not too large or a given number (of segment or elements)
- Overall balanced partition

Geometry

- Size: area, diameter, radius
- Convexity, Roundness
- Boundary smoothness

Topology

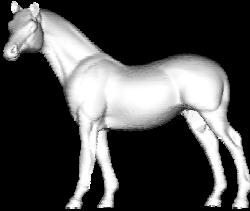
- Connectivity (single component)
- Disk topology



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Objective Function

Object function J says how “good” a segmentation is ...

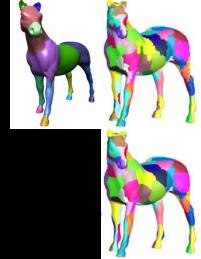


What properties define a good segmentation of this horse?

Objective Function

Object function J says how “good” a segmentation is ...

- Number of segments?
- Surface properties?
- Boundary properties?
- Global shape properties?
- Match examples?
- Semantics?
- etc.

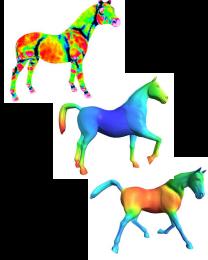


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Objective Function

Mesh attributes to consider:

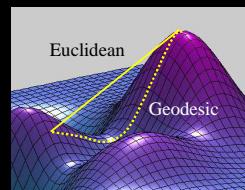
- Distances
- Normal directions
- Smoothness, curvature
- Shape diameter
- Distance to proxies
- Convexity
- Symmetry
- etc.



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Distances

Triangles in same segment ought to be close

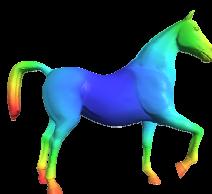



Geodesic distance to point Geodesic vs. Euclidean distance

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Distances

Triangles in same segment ought to be close
Discontinuities in functions of distance indicate possible boundaries

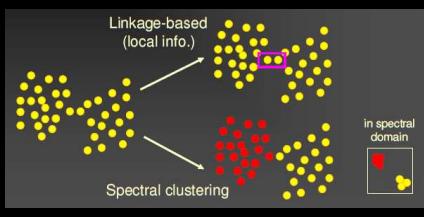


Average geodesic distance to other points

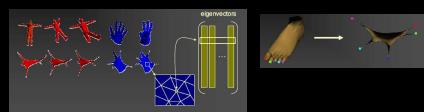
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Distances with Spectral Embedding

Linkage-based (local info.)



Spectral clustering



in spectral domain

Zhang

Normal direction, Dihedral Angles

Triangles in same segment ought to have normals that are: similar (planar)?, continuous (no creases)?

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Smoothness, Curvature

Concave creases indicate good segmentation boundaries

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Diameter

Distinguish between thin and thick parts in a model

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Convexity

Parts generally should be convex and compact

$$\text{Convexity} = \frac{\sum_{t \in P} \text{dist}(t, C(P)) \cdot \text{area}(t)}{\sum_{t \in P} \text{area}(t)},$$

$$\text{Compactness} = \frac{\text{area}(C)}{\text{volume}(C)^{2/3}}$$

Kraevoy

Symmetry

Segments should be locally symmetric

Podolak

Combining many properties

Randomized cuts

(a) Input mesh (b) Randomized Cuts (c) Partition Function

Segmenting and Labeling

Multi-objective mesh segmentation

Model	Labels	Summary of objectives used
Hammer	handle, head	narrow(·), flat(·), planesymmetric(·), ellipsoidal(·), perpendicular(·, ·), similarity
Quadruped	head, body, legs, ... , legs	5-narrow (hand), perpendicular (hand, head), CS
Bird	body, wing ₁ , wing ₂ , tail	In dogs, compactness of head is emphasized with 8-narrow (body), 4-flat (wing), 8-similarity (wing), 8-similarity (tail). See Kravtov and Sheffer – Convexity
Octopus	head, arm ₁ , ... , arm _n	ellipsoidal (head, arm ₁ , ... , arm _n), similarity(arm _i)
Hummingbird	head, torso, arm, left_ear, right_ear, leg, left_leg, right_leg	narrow(arm_left), narrow(arm_right), narrow(left_ear), narrow(right_ear), narrow(torso), narrow(head), narrow(left_leg), narrow(right_leg)

Figure 13: Objectives used to obtain segmentations of each

Simari

Segmenting and Labeling

Use conditional random field to learn segments and labels based on examples

Input Mesh → **Labeled Mesh**

Training Meshes

- Head
- Neck
- Torso
- Leg
- Tail
- Ear

Kalogerakis

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Algorithmic Strategies

Segmentation problem:

- Given: a mesh $M = \{V, E, F\}$
- Create: a set S of submeshes M_i that partition the faces of M into disjoint subsets.

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Algorithmic Strategies

If $|M| = n$ and $|S| = k$, then the search space of possible mesh decompositions is of order k^n .

- NP-complete
- Must revert to approximation algorithm

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Segmentation as Clustering

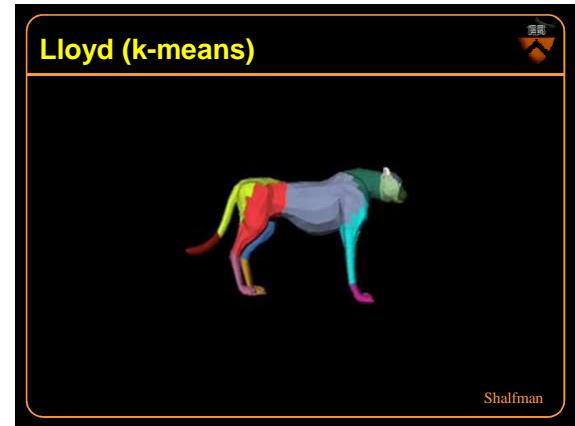
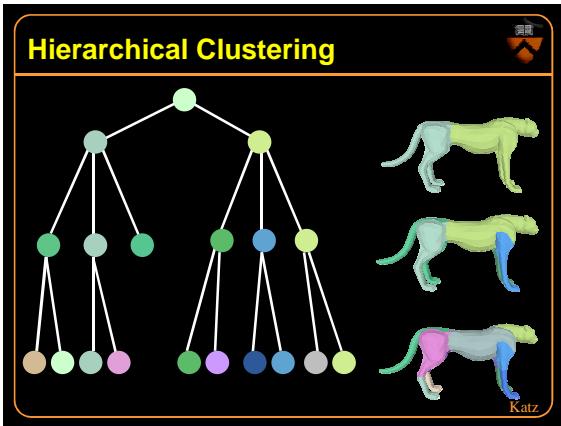
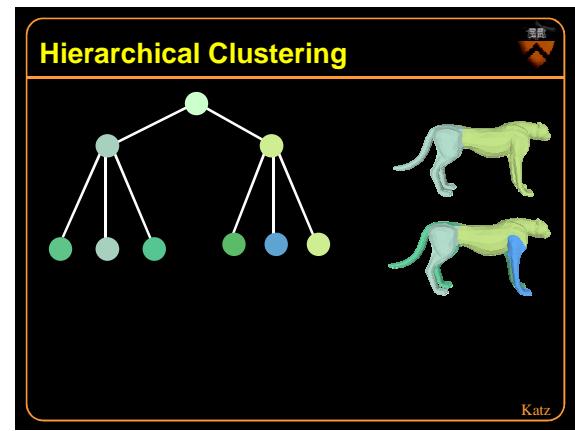
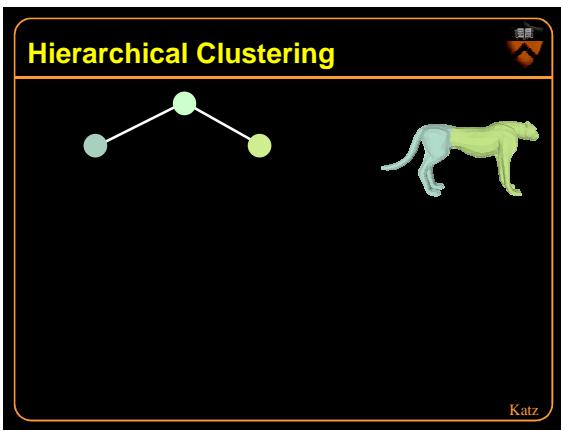
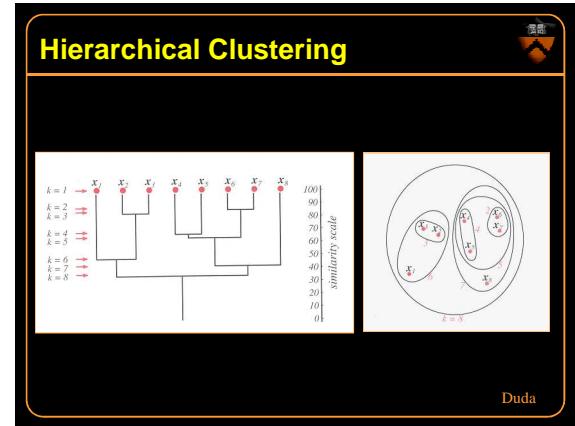
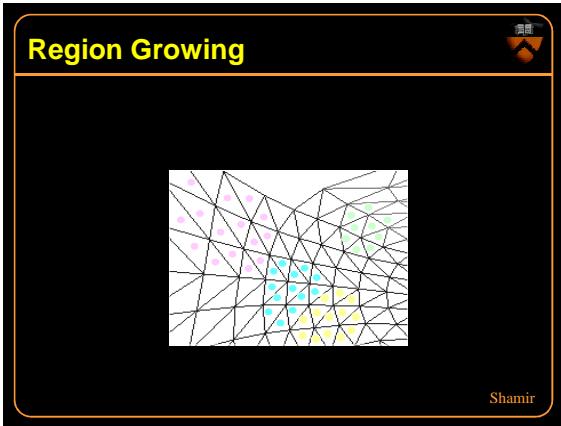
The basic segmentation problems can be viewed as assigning primitive mesh elements to sub meshes

- Clustering problem
- Well-studied in machine learning

Most segmentation strategies have basis in classic clustering algorithms:

- Region growing (local greedy)
- Primitive fitting (model-based)
- Hierarchical clustering (global greedy)
- K-means (iterative)
- Graph Cut

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Primitive Fitting

Find set of primitives that best approximates shape and map triangles to primitives

Planes Cylinders Spheres, cylinders, & rolling ball surfaces

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Simplification

Iterative edge collapses

Li

Graph Cuts

Define a graph where each node is an element and the edges hold weights according to the distances between the elements.

Example: dual graph and the weight is the dihedral angle.

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Graph Cuts

Define a graph where each node is an element and the edges hold weights according to the distances between the elements.

Example: dual graph and the weight is the dihedral angle.

Comparison of Strategies

Strategies

- Region growing
- Hierarchical
- Iterative
- Graph cut

greedier intensive

Other considerations: local control, hierarchy, convergence, parametric vs. non parametric...

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Choosing the Number of Segments

$G(k)$

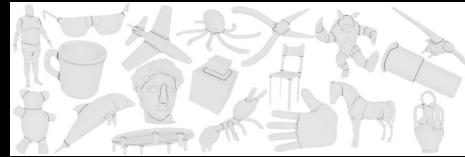
$G'(k)$

Katz

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Benchmark for Mesh Segmentation



Chen09