

# Harmonic Soft Maps and the Laplace-Beltrami Operator

## Overview Presentation

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March 23, 2014

# Introduction

- Project goal is to discover and understand the landscape of ideas surrounding harmonic maps and the Laplace-Beltrami operator while exploring related applications.
- In particular
  - ▶ The variational formulation of the Laplace-Beltrami operator
  - ▶ The generalization of Harmonic Maps from functions between manifolds to soft maps
  - ▶ The interplay between these ideas

# Laplace-Beltrami Operator

Throughout this presentation  $M_S$  and  $M_T$  will denote two smooth, compact Riemannian manifolds with gradient operators  $\nabla_S, \nabla_T$ , respectively.

## Definition

Let  $g_S$  denote the metric for  $M_S$ , then the Laplace-Beltrami Operator at a point  $x \in M_S$  is given by  $\Delta_{g_S} u \equiv \operatorname{div} \cdot \operatorname{grad} u$ .

- The Laplace-Beltrami Operator on a Riemannian Manifold is determined by the metric.
- The converse direction holds too, by intermediate construction of the heat kernel

# The Heat Equation

Consider a heat diffusion process on a manifold. The goal is to find the amount of heat at each location of the manifold  $u(x, t) : M_S \times \mathbb{R}^+ \rightarrow \mathbb{R}$  for all  $t > 0$ , given an initial distribution  $u(x, 0)$ .

## Definition

$$\Delta_{g_S} u(x, t) = -\frac{\partial u(x, t)}{\partial t}$$

# Solving the Heat Equation

Intuitively, suppose we had a function  $K : M_S \times M_S \times \mathbb{R}^+ \rightarrow \mathbb{R}$  which given two points  $x, y \in M_S$  encodes the proportion of heat at position  $y$  from position  $x$  after a time  $\Delta t$ . Then,

Fact

$$u(x, t) = \int_{M_S} K(x, y, t) u(y, 0) dy$$

What would such a  $K$  look like?

# The Heat Kernel

## Definition

Let  $\lambda_n, \phi_n$  be the eigenvalues and eigenfunctions of  $\Delta_{g_S}$ . The heat kernel  $K(x, y, t) \in C^\infty(M_S \times M_S \times \mathbb{R}^+)$  is given by

$$K(x, y, t) = \sum_{n=0}^{\infty} e^{-\lambda_n t} \phi_n(x) \phi_n(y)$$

- Analogous to Fourier analysis on the manifold
- Contains all of the information regarding the structure of the manifold
  - ▶ can be used to determine the metric

# Soft Maps Between Surfaces [SNBBcG]

## Definition

A *Soft Map* from  $M_S$  to  $M_T$  is a function assigning to each point  $x \in M_S$  a probability distribution  $\mu_x$  over  $M_T$ .

- Let  $\mathcal{U} \subseteq M_T$  then  $\mu_x(\mathcal{U})$  encodes the probability that  $x$  maps into  $\mathcal{U}$ .  
In particular it is required that:
  - ▶  $\mu_x(\mathcal{U}) \in [0, 1]$
  - ▶  $\mu_x(M_T) = 1$
- Soft maps generalize point to point maps.

# Harmonic Maps [SGB]

## Definition

The *Dirichlet Energy* of a map  $\phi : M_S \rightarrow M_T$  is given by

$$\mathcal{E}_D(\phi) \equiv \int_{M_S} \|\nabla_S \phi(x)\|^2 dx$$

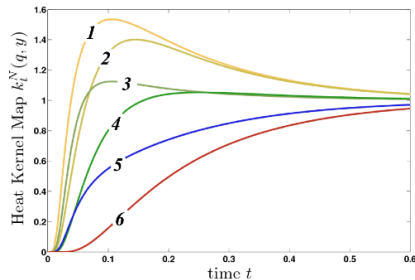
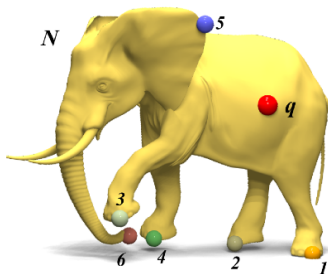
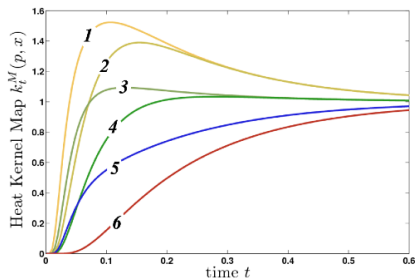
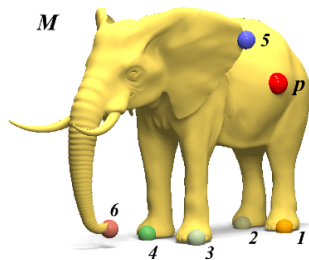
- Can think of this as a measure of the “intrinsic stretching” of  $\phi$ .
- Maps which extremize this functional are known as *harmonic maps*.
- Project goal: Investigate and understand how to generalize this notion to soft maps.



# One Point Isometric Matching by Heat Kernel [OMMG]

- Gives a method to recover an isometry when given only a single pair of corresponding points between two geodesically identical meshes
- Works by exploiting the invariance of the heat kernel under isometry
  - ▶ Given a pair of isometric manifolds  $M, N$  and a pair of points  $p \in M, q \in M$  such that for some isometry  $\psi : M \rightarrow N, \psi(p) = q$ . One can associate to every point on  $x \in M$  a signature  $k_t^M(p, x)$  and likewise for any  $y \in N$  a signature  $k_t^N(q, y)$ .
  - ▶ Related points can be identified by matching signatures
  - ▶ Both the initial correspondence and isometry can be found efficiently in practice
- Very general. That is, it does not depend genus of the surface, or dimension

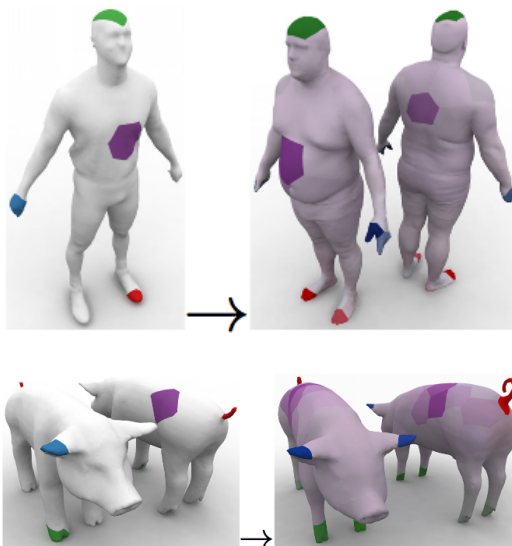
# One Point Isometric Matching by Heat Kernel [OMMG]



# Applications of Soft Maps [SNBBcG]

- Models  $M_1, M_2$  are discretized into patches corresponding to geodesic voroni cells
- A descriptor  $\phi_s(U) \in \mathbb{R}^k$  is associated with each patch  $U \subset M_s$ ,  $s \in \{1, 2\}$  that encodes some information about its geometry.
- A solver numerically finds a soft correspondence  $A$  which minimizes the energy  $E(A) = E_\phi(A) + \lambda E_{cont}(A) + \beta E_s(A)$  where
  - ▶  $E_\phi$  ensures the corresponding patches have similar geometry
  - ▶  $E_{cont}$  attempts to keep local patches local in the correspondence by applying a cost based on *GEMD*
  - ▶  $E_s$  is a sharpness term that tries to mediate tradeoff between  $E_\phi$  and  $E_{cont}$  when there is an exact symmetry.

# Applications of Soft Maps [SNBBcG]



# Bibliography

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