Topological Measures of Similarity (for curves on surfaces, mostly)

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Motivation: Measuring Similarity Between Curves

How can we tell when two cycles or curves are similar to each other?



Similarity measures have many potential applications:

- Analyzing GIS data
- Map analysis and simplification
- Handwriting recognition
- Computing "good" morphings between curves
- Surface parameterizations

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There are many different ways to check similarity. Most focus on either the geometry or the topology of the curve and the ambient space. Most of this talk with focus on one of two settings. First setting:



The plane, sometimes minus a set of (polygonal) obstacles.

Second setting: A combinatorial or piecewise linear orientable surface.



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Any such space is homeomorphic to a sphere with a number of handles attached; we call this number the *genus* of the surface.

Analyzing our algorithms:

• In the plane, our algorithms will be analyzed in terms of *n* and *m*, which are the size of the input curves. If there are obstacles, we generally use *p* or *P* to denote the total complexity of the obstacles.

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- In the plane, our algorithms will be analyzed in terms of *n* and *m*, which are the size of the input curves. If there are obstacles, we generally use *p* or *P* to denote the total complexity of the obstacles.
- On a surface, *n* will be the number of triangles in our input (which is generally an upper bound on the size of the curves, although sometimes that is separate). The value *g* will be the genus of the underlying surface.

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If a problem is NP-Complete, we do not know of any polynomial time algorithm; in a sense, the best solution to these problems is to try all possible solutions.

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More formally, given two curves $\gamma_1, \gamma_2 : [0,1] \rightarrow M$: $d_H(\gamma_1, \gamma_2) = \max\{\sup_{s \in [0,1]} \inf_{t \in [0,1]} d(\gamma_1(s), \gamma_2(t)), \sup_{t \in [0,1]} \inf_{s \in [0,1]} d(\gamma_1(s), \gamma_2(t))\}$



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More formally, given two curves γ_1 and γ_2 , the Fréchet distance is:



Alt and Godau gave the first algorithm to compute this for piecewise linear curves in the plane; their algorithm runs in $O(mn\log(mn))$ time.

Consider each pair of segments from the two curves, and calculate which portions are within ϵ of each other.



We build the *free space diagram* by forming the *n* by *m* grid, and determine if there is a matching that keeps the leash $\leq \epsilon$ by searching in this grid.

Since the initial algorithm, it has been studied extensively: applications, approximations, improved algorithms for restricted classes of curves, and lower bounds are just a few of the many results. Since the initial algorithm, it has been studied extensively: applications, approximations, improved algorithms for restricted classes of curves, and lower bounds are just a few of the many results.

In addition, Fréchet distance has also been considered in higher dimensions:

- It is NP-Hard to compute the Fréchet distance between two surfaces [Godau 1998], even for polygons with holes [Buchin-Buchin-Schulz 2010].
- Still NP hard even for surfaces traced by curves [Buchin-Ophelders-Speckmann 2015].
- Finally, it is computable to compute the Fréchet distance between surfaces [Neumann 2017].

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Algorithms are known in some limited settings, such as convex polytopes [Maheshwari and Yi 2005] and simple polygons [Cook Wenk 2008]. However, much remains open.

Definition

A homotopy is a continuous deformation of one path to another. More formally, a homotopy between two curves α and β on a surface M is a continuous function $H : [0,1] \times [0,1] \rightarrow M$ such that $H(\cdot,0) = \alpha(\cdot)$ and $H(\cdot,1) = \beta(\cdot)$.



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Testing if two curves are homotopic has been studied in both of our settings.

- Cabello et al (2004) give an algorithm to test if two paths in the plane minus a set of obstacles are homotopic in O(n^{3/2} log n) time.
- Given a graph cellularly embedded on a surface and two closed walks on that graph, there is an O(n) time algorithm to decide if the two walks are homotopic [Dey and Guha 1999, Lazarus and Rivaud 2011, Erickson and Whittlesey 2012].

Combinatorially optimal homotopies

There is work [Chang-Erickson 2016] on finding the "best" homotopy, as well; usually, this involves minimizing number of simplifications moves to untangle a curve.

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Figure 1.1. Homotopy moves $1 \rightarrow 0$, $2 \rightarrow 0$, and $3 \rightarrow 3$.

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Figure 1.1. Homotopy moves $1 \rightarrow 0$, $2 \rightarrow 0$, and $3 \rightarrow 3$.

In the plane, they prove this is $\Theta(n^{3/2})$.



This connects to older results [Steinitz 1916, Francis 1969, Truemper 1989, Feo and Provan 1993, Noble and Welsh 2000], and electrical moves on the medial graph of the input planar graphs.

However, in many applications we'd like to include more of a notion of the geometry of the underlying space, as well.



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Intuitively, curves with small homotopic Fréchet distance will be close both geometrically and topologically.

$$d_{F}(\gamma_{1},\gamma_{2}) = \inf_{\text{homotopies } H} \{\sup\{|H(\cdot,t))| \mid t \in [0,1]\}\}$$









Homotopic Fréchet Distance on a Surface

We could just have easily called this the *width* of the homotopy:



(Note: it is not known how to compute this on surfaces at all.)

There is a polynomial time algorithm algorithm to compute the homotopic Fréchet Distance between two polygonal curves in the plane minus a set of polygonal obstacles [C.-Colin de Verdiére-Erickson-Lazard-Lazarus-Thite 2009].

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The algorithm has some similarities to the work of Alt and Godau, but is considerably more complex since there are an infinite number of homotopy classes to consider.

Lemma

When obstacles are points, an optimal homotopy class contains a straight line segment.



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This allows us to brute force a set of possible homotopy classes which could be optimal, by trying all straight line segments.

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In an upcoming paper (joint with Arnaud de Mesmay and Tim Ophelders), we are able to show the problem is in NP in the planar or combinatorial surface setting when the beginning and ending leash are fixed, but this is slightly different than the planar case, where these leashes are not fixed. The height of a homotopy is an orthogonal definition to homotopic Fréchet distance:

$$d_{HH}(\gamma_1,\gamma_2) = \inf_{ ext{homotopies } H} \{ \sup\{|H(s,\cdot)| \mid s \in [0,1] \} \}$$



No algorithm is known to compute the homotopy height between two curves in any setting.

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If you consider the setting where your curves are the boundaries of a triangulated disk, it is closely connected to parameters such as cut width which are known to be NP-Complete, but the reductions do not quite work for this problem. [Har-Peled-Nayyeri-Salavatipour-Sidiropoulos 2012] give an $O(\log n)$ approximation algorithm for computing both the homotopy height and the homotopic Fréchet distance between two curves on a PL surface.

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They use a clever divide and conquer algorithm based on shortest paths for homotopy height, and then use this algorithm as a subroutine to solve homotopic Fréchet distance.



Instead of focusing on the length or width, we can also examine the total area swept by a homotopy [C-Wang 2013].



Surprisingly, this measure is much more tractable on surfaces than any other measure which takes topology into account, even for non-disjoint cycles.



More formally, given a homotopy H, the area of H is defined as:

$$\mathsf{Area}(H) = \int_{s \in [0,1]} \int_{t \in [0,1]} \left| \frac{dH}{ds} \times \frac{dH}{dt} \right| ds dt$$

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Note that in generally, this is an improper integral, and the value for any H is not necessarily even finite.

Douglas and Rado (1930's) were the first to consider this problem, as a variant of Plateau's problem (1847) dealing with soap bubbles and minimal surfaces.



[Minimal sub manifolds and related topics, Y. L. Xin]

Realizing the minimum area

There is an additional problem in that to find the infimum, we might have a pathological case where a sequence of good H's converge to something that is not even continuous.



They developed a restricted version using Dirichlet integrals (or energy integrals) which allow control over the parameterizations of the minimal surfaces. These integrals not only minimize area, but also ensure (almost) conformal parameterizations in the space. They developed a restricted version using Dirichlet integrals (or energy integrals) which allow control over the parameterizations of the minimal surfaces. These integrals not only minimize area, but also ensure (almost) conformal parameterizations in the space.

Theorem

Let γ be a finite Jordan curve in \mathbb{R}^n . Then there exists a continuous map $\Gamma : \{(x, y) \in \mathbb{R}^2 : x^2 + y^2 \leq 1\} \to \mathbb{R}^n$ such that:

- **(**) Γ maps the boundary of the disk monontically onto γ .
- I is harmonic and almost conformal
- I realizes the infimum of all areas

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(Well, I'm hiding a few details about the Dirichlet integrals here...)

Our setting is much simpler - we are either in \mathbb{R}^2 or a piecewise linear surface. However, we do need some assumptions in order for the minimum area homotopy to exist.

• We must assume that *H* is continuous and piecewise differentiable (so it is differentiable everywhere except at a finite set of points and arcs).

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- We must assume that *H* is continuous and piecewise differentiable (so it is differentiable everywhere except at a finite set of points and arcs).
- We must also assume the homotopy is monotone along the boundary of the domain and is regular on the interior (meaning intermediate curves are "kink-free").

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- We must assume that *H* is continuous and piecewise differentiable (so it is differentiable everywhere except at a finite set of points and arcs).
- We must also assume the homotopy is monotone along the boundary of the domain and is regular on the interior (meaning intermediate curves are "kink-free").
- Finally, we will assume our input curves (on *M*) are simple and have a finite number of piecewise analytic components. (In practice, they will simply be PL curves.)

Let I be the number of intersections and n be the complexity of the input curves.

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We give an algorithm that can be implemented in $O(I^2n)$ time using dynamic programming, which simply builds up the sets of anchor points iteratively and uses previous solutions to speed up future computation. Let I be the number of intersections and n be the complexity of the input curves.

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However, this can be improved to $O(I^2 \log I)$ time with $O(I \log I + n)$ preprocessing if we are more careful about how we compute the winding numbers.
More recent algorithms for homotopy area

There has also been recent work to compute the best area homotopy when the input curve is not so "nice", but is an immersion of a disk into the plane.



- One result [Nie 2014] connects this problem to the weighted cancellation norm, which is a very combinatorial way to covert the best homotopy into a series of reduction moves on a word problem. The result is a polynomial time algorithm.
- Another [Fasy-Karakoc-Wenk 2016] consider a different approach which is more geometric, building up an exponential time algorithm, although perhaps faster dynamic programming techniques can speed this up.

Our paper [C.-Wang] also considers the algorithm for surfaces, which builds upon the planar algorithm.



Consider two homotopic curves on a triangulated surface M with positive genus.

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Lifting P and Q

If we fix a lift for the endpoints of P and Q in the universal cover U(M), then $P \circ Q$ lifts to a unique closed curve in U(M). Therefore, any homotopy between P and Q on M will correspond to a homotopy between their lifts in U(M) with the same area.



We construct a portion of the universal cover which contains the lifts of P and Q as well as the regions inside their concatenation.

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We then use our planar algorithm in U(M), since similar results about the winding number will hold. Since we can simplify much of the interior of the regions in our representation, the total running time here is $O(gK \log K + I^2 \log I + In)$.



Using homology?

- Homology is a coarser invariant than homotopy all homotopies produce homologies, but not all homologies come from homotopies.
- In general, much more tractable reduces to a linear algebra problem, and software is widely available and highly optimized.
- Potentially much wider applications: works for cobordisms, arbitrary dimension submanifolds of arbitrary dimension manifolds, etc.



How to compute homology area

Formally (joint work with Mikael Vejdemo Johansson, and also considered in more limited settings in Dey, Hirani and Krishnamoorthy):

- Given cycles α and β , try to compute z such that $dz = \alpha \beta$.
- Goal: compute z with a smallest area. Recall that d is a linear operator, and z and $\alpha \beta$ are vectors.
- Optimization problem is then: arg min_z (area z), subject to dz = α - β.

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- Optimization problem is then: arg min_z (area z), subject to dz = α - β.
- Note again that this is NOT the same as homotopy area, at least for d ≤ 3:



In matrix multiply time, we can compute the best area homology on meshes:







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Definition

An *isotopy* is a homotopy H such that for each fixed time t, H(x, t) is a homeomorphism.

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An *isotopy* is a homotopy H such that for each fixed time t, H(x, t) is a homeomorphism.

A *homeomorphism* is a function which is a continuous bijection where the inverse is also continuous. In our setting, this will mean that every intermediate curve in the homotopy must also have an image that is simple.

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- In the plane minus polygonal obstacles, the test takes $O(n^{3/2} \log n)$ time.
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Note that the isotopy is fixed in the sense that you must indicate which vertices map to each other under the isotopy.

[C.-Ju-Letscher 2009] introduced the idea of isotopic Fréchet distance:

$$\mathcal{I}(A,B) = \inf \begin{array}{c} h: M \times I \to M \\ h(\cdot,t) \text{ homeomorphism} \\ h(x,0) = x \ \forall x \in X \\ h(A,1) = B \end{array} \xrightarrow{\text{max}_{x \in X} \text{ len} h(x, \cdot)}$$

In other words, what's the longest trajectory in an ambient isotopy?

If A and B are not ambiently isotopic then $\mathcal{I}(A, B) = \infty$.



Homotopic versus Isotopic Fréchet Distance

Proposition For any L > 0 and $\epsilon \in (0, L/2)$ there exists a pair of curves $C_1, C_2 \in \mathbb{R}^2$ with

$$\mathcal{F}(C_1, C_2) = \mathcal{H}(C_1, C_2) = \epsilon$$
$$\mathcal{I}(C_1, C_2) \geq \frac{2}{9}L$$



The best homotopy versus an isotopy



Erin Chambers Topological Measures of Similarity

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The best homotopy versus an isotopy

Actually, the best isotopy is even more complicated! The prior picture gave a distance of $\sqrt{L^2 + \epsilon^2}$. This was off by a factor of roughly 2 [Buchin-C.-Ophelders-Speckmann 2017]:



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In this work, we also consider restricted versions of the problem, and compute optimal isotopies if there is a direction in which both input curves are monotone. Other types of measures may be worth considering, as topological notions are not often incorporated in this literature:

- Geodesic width [Efrat, Guibas, Har-Peled, Mitchell, and Murali 2002] is a notion of deformation where intermediate curves may not cross the initial input curves, and the morph must stay within the area enclosed by the initial and final leash (combined with the curves). Since these are geodesic, again the leashes won't cross. However, the two input curves are also not allowed to cross each other.
- There are many algorithms (i.e. [Angelini et al, 2014] that seek to compute a morph which bounds the number of steps in the morph; these don't really consider the geometry as much, but perhaps could use tools or be connected to more combinatorial notions of homotopy.

- Other than homology area, very few of these algorithms have been implemented, despite many practical applications.
- There is no algorithm to compute homotopic Fréchet distance on surfaces (or even polyhedra).
- Height of a homotopy algorithms are also open; all that is known is an O(log n) approximation and that it's in NP.
- (Perhaps both are even NP-Complete...)
- It is unknown how to compute homotopy area between cycles on surfaces.

- Testing isotopy is understood, but using it as a measure of similarity is pretty wide open.
- All of these could be used for finding median trajectories or perhaps clustering recent work uses homology area (practical) and homotopy area (not so practical), but applications areas could motivate new directions.
- Can any of these be made tractable for curves on 3-manifolds, or even 3-manifolds which are embedded in IR³? (Possibly instead of area we may need a more combinatorial notion, such as Hsien's result a "best" homotopy might be one with fewer uncrossing moves, then.)