HARMONIC MEASURE, CONFORMAL MAPS AND OPTIMAL MESHES

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200 step random walk.



1000 step random walk.



Get Brownian motion in limit.



Suppose Ω is a planar Jordan domain.



Let E be a subset of the boundary, $\partial \Omega$.



Choose an interior point $z \in \Omega$.



 $\omega(z, E, \Omega) =$ probability a particle started at z first hits $\partial \Omega$ in E.



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 $\omega(z, E, \Omega) \approx 35/100$. What if we move starting point z?



Different z gives $\omega(z, E, \Omega) \approx 10/100$. Slow to compute each path ($\simeq \epsilon^{-2}$ steps on ϵ -grid). Can we go faster?




















This walk will get within ϵ of boundary in about $O(\log 1/\epsilon)$ steps. Takes about ϵ^{-2} steps on an ϵ -grid.



10, 100 and 1000 steps of walk inside a polygon. This illustrates the difficulty Brownian motion has in penetrating narrow corridors.

This is called the crowding phenomena (name to be explained later).









10, 100, 1000 and 10000 walks inside a 1×10 polygon.

Illustrates exponential difficulty of penetrating corridors.









Harmonic measure of short sides of $1 \times R$ rectangle is $\approx \exp(-\pi R/2)$.

Consider harmonic measure as a function of starting point z.

Path started at z is equally likely to hit anywhere on circle around z.

Then restart until it hits domain boundary.

Harmonic measure at z is average of harmonic measures on small circle.

Harmonic measure satisfies the mean value property.

 \Rightarrow Harmonic measure is a harmonic function of z.



Harmonic measure of $E \subset \partial \Omega$ is the harmonic function of base point with boundary values 1 on E and 0 elsewhere.

Harmonic functions are conformally invariant.

Riemann Mapping Theorem: If $\Omega \subsetneq R^2$ is simply connected, then there is a conformal map $f: D \to \Omega$.



Conformal = angle preserving





Georg Friedrich Bernhard Riemann Stated RMT in 1851



William Fogg Osgood First proof of RMT Transactions of AMS, vol. 1, 1900

The proof of Osgood represented, in my opinion, the "coming of age" of mathematics in America. Until then, ... the mathematical productivity in this country in quality lagged behind that of Europe, and no American before 1900 had reached the heights that Osgood then reached.

J.L. Walsh, "History of the Riemann mapping theorem", Amer. Math. Monthly, 1973.





Numerical conformal mapping:

- Koebe
- Theodorsen
- Fornberg
- Wegman
- Gaier
- Symm
- Kerzman-Stein
- Integral equations via fast multipole, Rokhlin
- Circle packing, Sullivan, Rodin, Stephenson
- CRDT, Driscoll and Vavasis
- SCToolbox, Trefethen, Driscoll
- ZIPPER, Marshall

Standard textbook proof of RMT by normal families gives an algorithm:

- Choose similarity map of Ω into D.
- Choose image boundary point closest to origin.
- Move this point to origin by Möbius transformation σ .
- Take square root (well defined on simply connected region).
- Move $\sqrt{\sigma(0)}$ back to 0 by Möbius transformation.
- Repeat.

 $d_n = \operatorname{dist}(\partial \Omega_n, 0)$

Lemma: If $d_0 \ge 1/2$ then $d_n = 1 - O(1/n)$.







2nd iteration









First 80 iterations. Converges, but is slow.

We want to measure computational complexity of conformal mapping.

Want finite input and finite output.

We will consider conformal maps between polygons and unit disk.

Input = vertices = n-tuple of complex numbers (plus base point)

Output = harmonic measures of edges = n-tuple of reals summing to 1 = conformal prevertices = n-tuple on circle Schwarz-Christoffel formula (1867):

$$f(z) = A + C \int_{k=1}^{z} \prod_{k=1}^{n} (1 - \frac{w}{z_k})^{\alpha_k - 1} dw,$$



 α 's known

z's unknown (= **SC-parameters** = **pre-vertices**)

Schwarz-Christoffel formula (1867):

$$f(z) = A + C \int_{k=1}^{z} \prod_{k=1}^{n} (1 - \frac{w}{z_k})^{\alpha_k - 1} dw,$$



Christoffel



Schwarz

Problem: given *n*-gon, compute the SC-parameters.

How fast can we do this?





Davis' method:

- Guess initial parameter values (all equal?).
- Plug guesses in SC-formula, get a polygon (correct angles, wrong lengths).
- If an edge is too long, shorten corresponding parameter arc.
- If too long, lengthen the gap.

 $new gap = \frac{old gap \times (target side/guessed side)}{sum of new gaps}$

Does Davis' method always converge?



20 iterations of Davis' method - QC error.





50 iterations of Davis' method.



QC error for 50 iterations of Davis' method.





QC error for 400 iterations of Davis' method.

Cross Ratios and Delaunay Triangulations (Driscoll and Vavasis)

Identifies n-tuples on T with R^{n-3} using cross ratios.

Uses standard high-dimensional root finding. Different versions based in different approximations of the derivative matrix:

- Full CRDT: discrete approximation (samples all directions)
- Simple CRDT: assume derivative = Identity
- Shortcut CRDT: use Broyden updates
















Comparison of Davis and CRDT



A 98-gon and its Delaunay triangulation.



10 iterations of shortcut CRDT applied to a 98-gon.



QC error of shortcut CRDT applied to the 98-gon.

Davis, CRDT give conformal maps onto approximate domains.

Instead, guess "approximately conformal" map onto correct polygon.

Iteration makes the map more conformal.

Theorem: Can compute ϵ -conformal map onto *n*-gon in time $C_{\epsilon} \cdot n$.

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 ϵ -conformal = 1 + ϵ quasiconformal.

 $C_{\epsilon} = O(\log \frac{1}{\epsilon} \log \log \frac{1}{\epsilon}).$

Data held as O(n) Laurent series of length $p = \log \frac{1}{\epsilon}$.

Bottleneck is doing O(1) FFTs per vertex of polygon.

Gives $O(\epsilon)$ approximation of SC-parameters.

"Scale invariant approximation" = still ϵ -good after rescaling by Möbius transformations = relative gap sizes are ϵ -accurate.

Quasiconformal maps: bounded angle distortion

Roughly, a K-QC map multiplies angles by $\leq K$.

More precisely: tangent map sends circles to ellipses a.e.



1-QC = conformal

For *n*-tuples z, w on unit circle,

 $d_{QC}(z, w) = \inf \log K$ s.t. $\exists K$ -QC map h(z) = w.

QC approximation implies "scale invariant" Euclidean approximation.

QC maps are differentiable almost everywhere.

$$f_z = f_x - if_y$$
 $f_{\overline{z}} = f_x + if_y.$

complex dilatation $\mu = \mu_f = f_{\overline{z}}/f_z$.

 μ encodes amount and direction of stretching.

$$f \text{ is } K\text{-QC iff } |\mu| \le k = \frac{K-1}{K+1} < 1.$$

Homeomorphic solutions of Beltrami equation

$$f_z = \mu f_{\overline{z}}$$

where $|\mu| < k < 1$.

Measurable Riemann Mapping Theorem: Given QC $g: D \to \Omega$, there is $f: D \to D$ so that $g \circ f$ is conformal.



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Need to solve Beltrami equation $f_z = \mu_g f_{\overline{z}}$.

Explicit exact solution by power series of singular integral operators. Linearization can be solved by convolution with 1/z.

Iteration converges quadratically to solution (Newton's method).

Measurable Riemann Mapping Theorem: Given QC $g: D \to \Omega$, there is $f: D \to D$ so that $g \circ f$ is conformal.



- Find initial QC map g to polygon.
- Solve a PDE for $f: D \to D$.

I will only address finding a good g.

Want g to be **fast** to compute and guaranteed **close** to correct answer.

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- **fast** comes from computational geometry.
- **close** comes from hyperbolic geometry.

Medial axis:

centers of disks that hit boundary in at least two points.



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Medial axis of a polygon is a finite tree.

Computable in O(n), Chin-Snoeyink-Wang (1999).

Related to Voronoi diagrams: divides polygon according to nearest edge.

Medial axis:

centers of disks that hit boundary in at least two points.



Claim: there is a "natural" choice of conformal map between any two medial axis disks.

A Möbius transformation is a map of the form

$$z \to \frac{az+b}{cz+d}.$$

Conformally maps disks to disks (or half-planes).

Form a group under composition.

Uniquely determined by images of 3 distinct points.





Intersecting circles:



Fix intersection points a, b and map $c \to d$ as shown.

Determines unique Möbius map between disks.

Part of 1-parameter symmetric family fixing a, b.















Points follow circular paths, perpendicular to boundary.

How does this give a map from polygon P to a circle?



• Fix a "root" MA disk D.



• For any $z \in P$, take MA disk D_z touching z.



• Connect D_z to D on MA.


















We discretize only to draw picture.

Limiting map has **formula** in terms of medial axis.

Similar flow for any simply connected domain.















Theorem: Mapping all n vertices takes O(n) time.

Uses linear time computation of MA (Chin-Snoeyink-Wang) and bookkeeping with cross ratios.



Use "MA-parameters" in Schwarz-Christoffel formula.



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Target Polygon

MA Parameters

Looks pretty close. How do we measure error?

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Target Polygon

MA Parameters

Looks pretty close. How do we measure error?

By minimal K-QC map mapping vertices to vertices.

Any example gives upper bound, e.g., piecewise linear.

Upper bound for QC-distance:

- Find compatible triangulation
- Compute affine map between triangles
- Take largest K.



The most distorted triangle is shaded. Here K = 1.24.

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Bounds QC-error of guessed parameters without needing to know the true SC-parameters.

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Short answer: hyperbolic 3-manifold theory

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Longer answer: because MA-map has conformal extension to different region with same boundary.

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- Other region is a surface in upper 3-space.
- The surface can be mapped conformally to disk.
- Medial axis map = boundary values of this map.

The **dome** of Ω is upper envelope of all hemispheres with base in Ω .



Suffices to take medial axis disks (= maximal disks).















Every dome has conformal map to disk by "flattening".




Medial axis map = boundary of flattening map (iota)

= boundary of conformal map of dome to hemisphere



Map dome to hemisphere by makings sides flush.



Planar version of previous figure.





How are these connected?



How are these connected? By projection.













Region below dome is union of hemispheres

Hemispheres = hyperbolic half-spaces.

Region above dome is hyperbolically convex.

Consider nearest point retraction onto this convex set.

Hyperbolic metric on disk given by

$$d\rho = \frac{ds}{1 - |z|^2} \simeq \frac{ds}{\operatorname{dist}(z, \partial D)}$$

- Geodesics are circles perpendicular to boundary.
- Shaded region is hyperbolically convex.
- Metric transfers via conformal maps to other domains.
- For simply connected regions $d\rho \simeq ds/\text{dist}(z,\partial\Omega)$.



In the upper half-space $R^3_+ = \{(x, y, t) : t > 0\}$, metric is $d\rho = ds/2t$.



Geodesics in R^3_+ are vertical rays or semi-circles perpendicular to R^2 .



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Consider nearest point retraction onto this convex set.



















Need not be a homeomorphism, but ...



Need not be a homeomorphism, but it is a **quasi-isometry** $\frac{1}{A} \leq \frac{\rho(R(x), R(y))}{\rho(x, y)} \leq A, \quad \text{if } \rho(x, y) \geq B.$

i.e., R is bi-Lipschitz on large scales.

Metrics are hyperbolic metrics on Ω and S.



"Smoothing" gives K-QC map fixing boundary points.

Sullivan's theorem: K is independent of domain.

Dennis Sullivan, David Epstein and Al Marden, C.B.

Best value unknown, 2.1 < K < 7.82.







Dennis Sullivan

David Epstein

Al Marden



Iota = conformal from dome to disk.

Medial axis flow = boundary values of iota

Riemann map = conformal from base to disk

Sullivan's thm \Rightarrow MA-map has $K\text{-}\mathrm{QC}$ extension

Sketch of proof that R is quasi-isometry

One direction: R is Lipschitz.

Other direction: R^{-1} is Lipschitz at distances ≥ 1 .

Fact 1: If $z \in \Omega$, $\infty \notin \Omega$, $r \simeq \operatorname{dist}(z, \partial \Omega) \simeq \operatorname{dist}(R(z), R^2) \simeq |z - R(z)|.$



Fact 2: R is Lipschitz.

• Ω simply connected $\Rightarrow d\rho \simeq |dz|/\text{dist}(z,\partial\Omega).$

• $z \in D \subset \Omega$ and $R(z) \in \text{Dome}(D) \Rightarrow z$ in hyperbolic convex hull of $\partial \Omega \cap \partial D$ in D.

$$\Rightarrow \operatorname{dist}(z, \partial \Omega) / \sqrt{2} \le \operatorname{dist}(z, \partial D) \le \operatorname{dist}(z, \partial \Omega)$$
$$\Rightarrow \quad \rho_{\Omega}(z) \simeq \rho_{D}(z) = \rho_{\operatorname{Dome}}(R(z)).$$



Fact 3: $\rho_S(R(z), R(w)) \le 1 \Rightarrow \rho_\Omega(z, w) \le C$. Suppose dist $(R(z), R^2) = r$.

Suppose γ is geodesic on dome from R(z) to R(w).

$$\Rightarrow \qquad \operatorname{dist}(\gamma, R^2) \simeq r \\ \Rightarrow \qquad \operatorname{dist}(R^{-1}(\gamma), \partial\Omega) \simeq r, \qquad R^{-1}(\gamma) \subset D(z, Cr) \\ \Rightarrow \qquad \rho_{\Omega}(z, w) \leq C$$



Moreover, $g = \iota \circ \sigma : \Omega \to D$ is locally Euclidean Lipschitz. $|g'(z)| \simeq \frac{\operatorname{dist}(g(z), \partial D)}{\operatorname{dist}(z, \partial \Omega)}.$

Use Fact 1

$$dist(z, \partial \Omega) \simeq dist(R(z), R^2)$$
$$\simeq \exp(-\rho_{R^3_+}(R(z), z_0))$$
$$\gtrsim \exp(-\rho_S(R(z), z_0))$$
$$= \exp(-\rho_D(g(z), 0))$$
$$\simeq dist(g(z), \partial D)$$

The factorization theorem: Riemann map $f = h \circ g$ where

- $g: \Omega \to D$ is Lipschitz in Euclidean path metrics,
- $h: D \to D$ is biLipschitz in hyperbolic metric



Cor: Any s.c. domain can be mapped 1-1, onto a disk by a contraction for the internal path metric.

Crescents in base can map to geodesics on surface.



Gray collapses to bending lines, "width = angle".

White maps isometrically to dome.



Angle scaling family - crescent angles decrease "Morphs" region to disk. Intermediate regions need not be planar. Gives continuation method to apply Newton's method.




































Application to computational geometry: Quadrilateral meshes







Marshall Bern and David Eppstein, 2000.

- *n*-gons have O(n) quad-mesh with angles $\leq 120^{\circ}$.
- $O(n \log n)$ work.
- Regular hexagon (and Euler's formula) shows 120° is sharp.





Marshall Bern



David Eppstein



David Epstein



David Eppstein

- P = hyperbolic geometry, University of Warwick
- $P^2 =$ computational geometry, UC Irvine

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Original angles $< 60^{\circ}$ remain unchanged. 60° is sharp.

Proof uses conformal mapping, plus an idea from hyperbolic manifolds: **thick/thin decompositions**.

Idea of proof: transfer mesh from disk



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But number of boxes depends on geometry (not just n).



Obvious idea: subdivide disk into boxes until preimages are separated.

Gives too many boxes ($\gg n$) if pre-vertices cluster tightly.

A **cluster** is a set $S \subset V$ so that

 $\operatorname{diam}(S) \ll \operatorname{dist}(S, V \setminus S).$



Subdivide until boxes separate points.

Gives $\gg n$ boxes if pre-vertices cluster tightly.

Fact: can find all clusters in O(n) using medial axis.

"Cover" each cluster by a half-annulus.



Maps to a **hyperbolic thin piece** dividing polygon.

Surface **thin part** is union of short non-trivial loops.



parabolic = puncture, hyperbolic = handle

Thick and Thin parts of a polygon

Thin part is union of short curves between edges.



Parabolic = adjacent, Hyperbolic = non-adjacent **Rough idea:** sides I, J so $dist(I, J) \ll min(|I|, |J|)$.

Thick parts = remaining components (white)

More examples of hyperbolic thin parts.



Inside thick regions (white) conformal pre-vertices are well separated on circle (no clusters).

Implies good estimates for conformal map.

Idea for quad-mesh theorem:

- Decompose polygon into O(n) thick and thin parts.
- Mesh thin parts "by hand".
- Conformally map mesh on disk to thick parts.

Thin parts are meshed by explicit construction (easy).



Thick parts: transfer mesh from disk









Draw (hyperbolic) convex hull of thin regions.



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Take pentagons from tesselation hitting convex hull but missing thin parts.



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Take pentagons from tesselation hitting convex hull but missing thin parts. Extend pentagon edges to boundary.



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Analog of Whitney or quadtreee construction.



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Take pentagons from tesselation hitting convex hull but missing thin parts. Extend pentagon edges to boundary.

Pentagons, quadrilaterals, triangles and half-annuli.



Meshes designed to match along common edges.

So far, we have been meshing simple polygons.

Harder case: mesh PSLGs.

A **Planar Straight Line Graph** (PSLG) is a finite point set plus a set of disjoint edges between them.



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Size = number of vertices = n.

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Mesh convex hull conforming to PSLG.











More PSLGs

Theorem: Every PSLG of size n has $O(n^2)$ quad-mesh with all angles $\leq 120^{\circ}$ and all new angles $\geq 60^{\circ}$.

Angles and complexity sharp.

The $O(n^2)$ is sharp because any mesh with maximum angle $\leq \theta < 180^{\circ}$ sometimes requires n^2 elements.

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I won't discuss proof of this here. Uses results several ideas:

• Thick/thin decomposition

• Sinks = a polygon that can be quad-meshed with angles between 60° and 120° using a given (even) set of boundary vertices, without adding any extra boundary vertices.

Square is not a sink, regular octagon is.

For sinks, every "even boundary meshing problem" has a solution. Sinks stop propagation of vertices as in previous example.

• optimal triangulations of PSLGs

Cor (of proof): All vertex degrees are 4 with O(n) exceptions.

Cor: Mesh is a disjoint union of O(n) combinatorial rectangular grids.

Cor: All angles are in $[89^\circ, 91^\circ]$ with O(n) exceptions.







Every quad-mesh gives a triangulation: add diagonals.

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Previous: S. Mitchell 1993 (157.5°), Tan 1996 (132°).

Can we improve the 120° upper bound?

Can we get a positive lower bound on angles?

Every quad-mesh gives a triangulation: add diagonals.

Corollary: Every PSLG has a $O(n^2)$ triangulation, all angles $\leq 120^{\circ}$.

Previous: S. Mitchell 1993 (157.5°), Tan 1996 (132°).

Can we improve the 120° upper bound? **Yes**

Can we get a positive lower bound on angles? \mathbf{No}

No lower angle bound. For $1 \times R$ rectangle number of triangles $\gtrsim R \times$ (smallest angle)



So, bounded complexity \Rightarrow no lower angle bound.

Upper bound $< 90^{\circ}$ implies lower bound > 0:



 $\alpha, \beta < (90^{\circ} - \epsilon) \Rightarrow \gamma = 180^{\circ} - \alpha - \beta \ge 2\epsilon.$

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So 90° is best uniform upper bound we can hope for.



Is NOT="non-obtuse triangulation" possible?

Upper bound $< 90^{\circ}$ implies lower bound > 0:



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So 90° is best uniform upper bound we can hope for.



Is NOT="non-obtuse triangulation" possible? Yes

Brief history of NOTs:

- Always possible (no bound): Burago, Zalgaller 1960.
- Rediscovered: Baker, Grosse, Rafferty, 1988.
- $\bullet \ O(n)$ for points sets: Bern, Eppstein, Gilbert 1990
- $O(n^2)$ for polygons: Bern, Eppstein, 1991
- \bullet O(n) for polygons: Bern, Mitchell, Ruppert, 1994
- PSLG's: exist, n^2 lower bound

Do a polynomial number of triangles suffice?

Applications of nonobtuse triangulations:

- Discrete maximum principle (Ciarlet, Raviart, 1973)
- Convergence of finite element methods (Vavasis, 1996)
- Fast marching method (Sethian, 1999)
- Meshing space-time (Ungör, Sheffer, 2002)
- Machine learning (Salzberg, et. al., 1995)





Voronoi cells (think of cell phone connecting to closest tower).



If country boundaries conform to cell boundaries, then a phone always connects to a tower in the same country.



Given polygonal countries, can we place towers so this happens? Do a polynomial number of towers suffice? Salzberg, Delcher, Heath, Kasif, 1995, Best-case results for nearestneighbor learning.

Given polygon Γ find sets I, O so that

$$\operatorname{int}(\Gamma) = \{ z : \operatorname{dist}(z, I) < \operatorname{dist}(z, O) \},\$$

(Voronoi diagram of $I \cup O$ covers Γ .)

Easy for nonobtuse triangles. Reduces problem to finding a NOT.



 $O(n^2)$ is best known lower bound, so a gap remains.

Equivalent: Every triangulation has $O(n^{2.5})$ non-obtuse refinement.



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Cor: Any PSLG has a conforming Delaunay triangulation of size $O(n^{2.5})$. (see Edelsbrunner, Tan 1993 for $O(n^3)$)

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Cor: Every PSLG has a triangulation with all angles $\leq 90^{\circ} + \epsilon$ and $O(n^2/\epsilon^2)$ elements.

Follows from proof of NOT-theorem.

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Cor: Every PSLG has a triangulation with all angles $\leq 90^{\circ} + \epsilon$ and $O(n^2/\epsilon^2)$ elements.

Cor: Every triangulation of a simple *n*-gon has a nonobtuse refinement with $O(n^2)$ elements.

This improves $O(n^4)$ result of Bern and Eppstein (1992).

The segment [v, w] is a **Gabriel** edge if it is the diameter of a disk containing no other points of V.



Gabriel edge.

The segment [v, w] is a **Gabriel** edge if it is the diameter of a disk containing no other points of V.



Not a Gabriel edge.

The segment [v, w] is a **Gabriel** edge if it is the diameter of a disk containing no other points of V.



Gabriel graph contains the minimal spanning tree.

Gabriel and Sokol, A new statistical approach to geographic variation analysis, Systematic Zoology, 1969.

Gabriel edge is a special case of a **Delaunay** edge: [v, w] is a **chord** of an open disk not hitting V.



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Gabriel edge is a special case of a **Delaunay** edge: [v, w] is a **chord** of an open disk not hitting V.



Delaunay edges triangulate.

DT minimizes the maximum angle, among all triangulations.

Thus, if a point set has a NOT, then DT = NOT.



Follows from work of Bern, Mitchell, Ruppert (1994).







Theorem: Given a triangulation, we can add $O(n^{2.5})$ points to the edges so that every new edge is Gabriel.

Gabriel edges \Rightarrow non-obtuse triangulation

Bern-Mitchell-Ruppert (1994)

BMR Lemma: Add k vertices to sides of triangle (at least one per side) so all edges become Gabriel, then add all midpoints. Resulting polygon has a O(k) NOT, with no additional vertices on boundary.



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BMR Lemma: Add k vertices to sides of triangle (at least one per side) so all edges become Gabriel, then add all midpoints. Resulting polygon has a O(k) NOT, with no additional vertices on boundary.

Building a NOT for a PSLG:

- Replace PSLG by triangulation of itself.
- Add vertices to make all edges Gabriel.
- Apply BMR lemma. Done.





• Pack with disjoint disks so only 3-sided and 4-sided regions remain.



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- Connect centers.



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- Divides triangle into triangles and quadrilaterals.



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Nonobtusely triangulate each region without new boundary vertices. Several cases.

First case: decompose 3-region into right triangles



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• Add center of circle through the three tangent points.

First case: decompose 3-region into right triangles



- Add center of circle through the three tangent points.
- Connect center to tangent points and centers of circles

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- Add center of circle through the three tangent points.
- Connect center to tangent points and centers of circles

The 4-regions are similar (but several cases arise).



So Gabriel covering implies a nonobtuse triangulation.

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So Gabriel covering implies a nonobtuse triangulation.



Break every triangle into thick and thin parts. Thin parts = corners, Thick part = central region



Divide triangle into thick and thin parts.

Thick sides are base of half-disk inside triangle.

Thick version prevents infinite propagation.



Then vertices of thick part give Gabriel edges.



But, adjacent triangle can make Gabriel condition fail.



Idea: "Push" vertices across the thin parts.



Thin parts foliated by circles centered at vertices.

Push vertices along foliation paths.



• Start with any triangulation.



- Start with any triangulation.
- Make thick/thin parts.



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- Start with any triangulation.
- Make thick/thin parts.
- Propagate vertices until they leave thin parts.
- Intersections satisfy Gabriel condition. Why?



Tube is "swept out" by fixed diameter disk.

Disk lies inside tube or thick part or outside convex hull.

In triangulation of a n-gon, adjacent triangles form tree.


In triangulation of a n-gon, adjacent triangles form tree.



In triangulation of a n-gon, adjacent triangles form tree.



Hence foliation paths never revisit a triangle.

O(n) starting points, so $O(n^2)$ points are created.

Thm: Triangulation of a n-gon has a $O(n^2)$ NOT. Improves $O(n^4)$ by Bern and Eppstein (1992).



Delaunay triangulation of 10 random points,



The boundary of the triangulation



The central regions.



Propagation lines starting at all cusp points.



Propagation lines identify boundary points; induces tree. Discontinuous, but piecewise length preserving.



60 points



The central regions.



Propagation lines starting at all cusp points.



A ring of equilateral triangles.



The in-circles are tangent.



The the cusps touch; for a closed flow line.



No matter how we triangulate interior, flow lines never exit.



No matter how we triangulate interior, flow lines never exit.



No matter how we triangulate interior, flow lines never exit.

Idea: perturb paths to terminate sooner.

If a path returns to same thin edge at least 3 times it has a sub-path that looks like one of these:



C-curve, S-curve, G-curves

Return region consists of paths "parallel" to one of these.



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There are O(n) return regions and every propagation path enters one after crossing at most O(n) thin parts.

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There are O(n) return regions and every propagation path enters one after crossing at most O(n) thin parts.

IDEA: bend paths to terminate before they exit.

Gives $O(n^2)$ if it works.

	//////////////////////////////////////		\ \ /				



If path bends too fast, Gabriel condition can fail.



Bend slowly enough to satisfy Gabriel condition.



Bend slowly enough to satisfy Gabriel condition.



$$\Delta y \approx (\Delta x/r)^2 r = (\Delta x)^2/r.$$
$$r = \max(r_1, r_2).$$



 $k \times 1$ region crossing n (equally spaced) thin parts,

$$r \approx 1, \quad \Delta x \approx k/n, \quad \Rightarrow \quad \Delta y \approx k^2/n^2$$

Need $1 \le \sum \Delta y = n \Delta y = k^2/n$.

Bent path hits side of region if $k \gg \sqrt{n}$.



• Show there are O(n) return regions.



- Show there are O(n) return regions.
- Divide each region into $O(\sqrt{n})$ long parallel tubes.



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- Divide each region into $O(\sqrt{n})$ long parallel tubes.
- Entering paths can be bent and terminated. Total vertices created = $O(n^2)$, but ...
- Each region has $O(\sqrt{n})$ new vertices to propagate. Vertices created is $O(\sqrt{n} \cdot n^2) = O(n^{2.5})$.

Hard case is spirals:



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Curves may spiral arbitrarily often.

No curve can be allowed to pass all the way through the spiral. We stop them in a multi-stage construction.



• Start with \sqrt{n} parallel tubes at entrance of spiral. Terminate entering paths (1 spiral).



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- Make tube edge self-intersect $(n^{1/2} \text{ spirals})$
- Loops with increasing gaps $(n^{1/2} \text{ loops}, n \text{ spirals})$
- Beyond radius n spiral is empty.

Careful estimates needed to get $O(n^{2.5})$ vertices.

Almost Nonobtuse Triangulation: Replace cusps by cones of angle ϵ . Same construction in thick parts.



Paths can be terminated inside a $1 \times \frac{1}{\epsilon}$ tube. **Thm:** Uses angles $\leq 90^{\circ} + \epsilon$ and $O(\frac{n^2}{\epsilon^2})$ triangles.

Summary:

Delaunay triangulation (DT) is easy to compute but is non-conforming and allows large angles.

We can add $O(n^{1.5})$ new points and perturb foliation paths to end quickly. Gives $O(n^{2.5})$ Gabriel edges.

From this we get a $O(n^{2.5})$ conforming NOT-DT.

DT or NOT-DT, that is the question. Whether 'tis nobler in the mind to suffer the slings and arrows of obtuse angles, or take arms against a sea of paths, and by perturbing end them?

Questions:

- Implementable?
- Average versus worst case bounds?
- Improve 2.5 to 2 in NOT theorem?
- Relation to closing lemma for vector fields?
- 3-D meshes? The eightfold way? Ricci flow?
- Polynomial meshes using acute tetrahedra? Even cube is hard.
- Other applications for thick/thin pieces?
- Applications of Mumford-Bers compactness?
- Best K for medial axis map? (2.1 < k < 7.82)
- Can we do better than medial axis map?

More Questions:

- Does Davis' method converge?
- Does CRDT converge?
- Classify sinks.
- Do NOTs and Delaunay triangulations have same complexity?
- Are rectangular grid sub-meshes good for anything?