Computing Straight Skeletons and Motorcycle Graphs: Theory and Practice



Universität Salzburg, Austria

August 4, 2011

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Consider the following problems in *computational geometry*:

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Roof construction

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Tool path generation

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Using the straight skeleton, we obtain

- simple,
- efficient,
- numerically stable

algorithms for many problems in computational geometry.

- ▶ Introduced by [Aichholzer et al., 1995] for simple polygons *P*.
- Definition based on wavefront propagation process:



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- Definition based on wavefront propagation process:
 - edge events,
 - split events.



- Introduced by [Aichholzer et al., 1995] for simple polygons P.
- Definition based on wavefront propagation process:
 - edge events,
 - split events.
- Straight skeleton S(P): set of loci traced out by wavefront vertices.



- ▶ Extended to PSLGs¹ G by [Aichholzer and Aurenhammer, 1996].
 - Defined on the entire plane.
 - Rectangular caps at terminal vertices.



¹Planar Straight-Line Graph

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- Introduced by [Eppstein and Erickson, 1999].
- A motorcycle is a moving point with
 - a start point and
 - a constant velocity.



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- Introduced by [Eppstein and Erickson, 1999].
- A motorcycle is a moving point with
 - a start point and
 - a constant velocity.
- Consider *n* motorcycles m_1, \ldots, m_n .
 - Each motorcycle leaves a trace behind.
 - A motorcycle **crashes** when reaching another motorcycle's trace.
 - The motorcycle graph $\mathcal{M}(m_1, \ldots, m_n)$ is the arrangement of all traces.



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- Motorcycle graph $\mathcal{M}(P)$ induced by a polygon P:
 - A motorcycle for each reflex wavefront vertex, with the same velocity.
 - The edges of P are considered to be walls.



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- Motorcycle graph $\mathcal{M}(P)$ induced by a polygon P:
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▶ P is **non-degenerate** if two or more motorcycles do not crash simultaneously into each other.



Known algorithms:

- $r \in O(n)$: number of reflex wavefront vertices.
- Impl.: algorithm is suitable for implementation.

Alg.	Time	PSLG	Impl.
[Aichholzer et al., 1995]	$O(nr \log n)$	No	Yes
[Aichholzer and Aurenhammer, 1996]	$O(n^3 \log n)$	Yes	Yes
[Eppstein and Erickson, 1999]	$O(n^{1+\epsilon} + n^{8/11+\epsilon}r^{9/11+\epsilon})$	Yes	No
[Cheng and Vigneron, 2002]	$\exp O(n\log^2 n + r\sqrt{r}\log r)$	No	No

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Known implementations:

CGAL: for polygons with holes, quadratic runtime and memory usage.

Objective: Find an algorithm which is

- fast in practice and
- simple enough to be implemented.

Approach:

- > Algorithm by Aichholzer and Aurenhammer sounds promising.
- However, worst-case time complexity: $O(n^3 \log n)$.
- Open question: is the bound tight?

▶ Presented by [Aichholzer and Aurenhammer, 1996], handles PSLGs as input.



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- ▶ Presented by [Aichholzer and Aurenhammer, 1996], handles PSLGs as input.
- Kinetic triangulation:
 - Edge events: O(n)
 - Flip events: O(n³)
 - Split events: O(n)
 - Results in an $O(n^3 \log n)$ runtime.



Number of flip events

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Lemma ([Huber and Held, 2010b])

There exists polygons P with n vertices and triangulations T of P such that $\Omega(n)$ diagonals each reappear $\Omega(n)$ times.

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Lemma ([Huber and Held, 2010b])

Every PSLG G with n vertices admits a triangulation that employs O(n) Steiner points and is free of flip events.

Proof idea:

- Add the nodes and arcs of $\mathcal{S}(G)$ as Steiner points and triangulation diagonals.
- ► Show that the faces of S(G) can be triangulated such that flip events are avoided.
- ▶ Why does that work? Reflex wavefront vertices move on diagonals!

- Previous Steiner triangulations are based on $\mathcal{S}(G)$.
- Can we get rid of this requirement?

Image: A math a math

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- Can we get rid of this requirement?
- Consider a non-degenerate polygon P as input:
 - Replacing $\mathcal{S}(P)$ by $\mathcal{M}(P)$.
 - Reflex arcs of S(P) are covered by M(P).



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- Simulate the extended wavefront. [Huber and Held, 2010a]



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Lemma ([Huber and Held, 2010a])

The faces of the extended wavefront are convex at any time.

Hence, in the simulation, we only need to consider neighboring vertices.

Theorem ([Cheng and Vigneron, 2002])

 $\mathcal{M}(P)$ covers the reflex arcs of $\mathcal{S}(P)$.

► Hence, split events happen within the motorcycle traces.

Works only for a restricted class of input data:

- No arbitrary polygons.
- No PSLGs.

Idea

Generalize $\mathcal{M}(P)$ of non-degenerate polygons P to $\mathcal{M}(G)$ of arbitrary PSLGs G!

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Idea

Generalize $\mathcal{M}(P)$ of non-degenerate polygons P to $\mathcal{M}(G)$ of arbitrary PSLGs G!

However:

- $\mathcal{M}(G)$ needs to cover all reflex arcs of $\mathcal{S}(G)$!
- The extended wavefront still needs to induce a convex tessellation!

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• (a–b) Place a motorcycle for each reflex wavefront vertex in $\mathcal{W}(G, 0)$.



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- (a–b) Place a motorcycle for each reflex wavefront vertex in $\mathcal{W}(G, 0)$.
- Launch a new motorcycle when multiple motorcycles meet:
 - (c) To cover reflex straight skeleton arcs.
 - (d) To respect the convex tessellation property.



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Generalized motorcycle graph



Lemma ([Huber and Held, 2011c])

Consider a point p in the relative interior of $\mathcal{M}(G)$. Then a local disc is tessellated into convex slices by $\mathcal{M}(G)$.

Theorem ([Huber and Held, 2011c])

 $\mathcal{M}(G)$ covers the reflex arcs of $\mathcal{S}(G)$.

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• A non-procedural alternative characterization of S(G):

Generalizes a result of [Cheng and Vigneron, 2002].

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Generalizes a result of [Cheng and Vigneron, 2002].

▶ Computing *S*(*G*) using graphics hardware:

Apply techniques used by [Hoff et al., 1999] for Voronoi diagrams.

• A non-procedural alternative characterization of S(G):

- Generalizes a result of [Cheng and Vigneron, 2002].
- ▶ Computing *S*(*G*) using graphics hardware:
 - Apply techniques used by [Hoff et al., 1999] for Voronoi diagrams.
- A novel wavefront-type algorithm to compute S(G).

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A wavefront-type algorithm

We simulate the propagation of the extended wavefront:



- Split events happen within the extended wavefront.
- Only neighboring vertices can meet.

BONE: a C++ implementation:

- Double-precision floating-point arithmetics.
- O(n) space complexity.
- $O(n \log n)$ runtime in practice.
- O(nr log n) runtime in the worst case.
 - r is the number of reflex wavefront vertices.
 - Unlikely to occur in the real-world.

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Runtime



Random polygons generated by RPG.

Size n	Bone		CG	CGAL	
	MB	factor	MB	factor	
256	1.44		3.77		
512	2.65	1.8x	13.4	3.5x	
1024	5.06	1.9x	51.1	3.8x	
2 0 4 8	9.86	1.9x	201	3.9x	
4 0 9 6	19.5	2.0x	792	3.9x	
8 1 9 2	38.7	2.0x	3 197	4.0x	
16 384	77.1	2.0x	12 600	3.9x	

Table: Memory usage of BONE and CGAL

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Summary

- Investigations of the triangulation-based algorithm:
 - Huber, S. and Held, M. (2010b). Straight skeletons and their relation to triangulations. In Proc. 26th Europ. Workshop on Comp. Geom. (EuroCG '10), pages 189–192, Dortmund, Germany.
- Generalization of the motorcycle graph concept:
 - Alternative characterization of $\mathcal{S}(G)$.
 - Motivates an algorithm based on graphics hardware.
 - Huber, S. and Held, M. (2011c). Theoretical and practical results on straight skeletons of planar straight-line graphs. In *Proc. 27th Annual Symp. on Comp. Geom.* (SoCG '11), pages 171–178, Paris, France.
- ► A novel wavefront-type algorithm and the implementation BONE:
 - Accepts arbitrary PSLGs as input.
 - The fastest and most memory-efficient implementation at the moment.
 - Huber, S. and Held, M. (2010a). Computing straight skeletons of planar straight-line graphs based on motorcycle graphs. In *Proc. 22nd Canad. Conf. on Comp. Geom.* (CCCG '10), pages 187–190, Winnipeg, Canada.
 - Huber, S. and Held, M. (2011c). Theoretical and practical results on straight skeletons of planar straight-line graphs. In *Proc. 27th Annual Symp. on Comp. Geom.* (SoCG '11), pages 171–178, Paris, France.

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- ▶ MOCA: a motorcycle graph implementation:
 - Exploits geometric hashing, which is motivated by a stochastic analysis of the mean trace length.
 - MOCA: currently the only implementation which exhibits a subquadratic runtime in practice.
 - Huber, S. and Held, M. (2009). A practice-minded approach to computing motorcycle graphs. In Proc. 25th Europ. Workshop on Comp. Geom. (EuroCG '09), pages 305–308, Brussels, Belgium.
 - Huber, S. and Held, M. (2011b). Motorcycle graphs: Stochastic properties motivate an efficient yet simple implementation. ACM Journal on Exp. Alg., 17. in press.
- Straight skeletons approximating motorcycle graphs:
 - We are given *n* motorcycles. We can determine a *G* such that S(G) approximates $\mathcal{M}(m_1, \ldots, m_n)$.
 - We have an algorithm that computes $\mathcal{M}(m_1, \ldots, m_n)$ using $\mathcal{S}(G)$.
 - We obtained a proof for the P-completeness of straight skeletons of polygons with holes.
 - Huber, S. and Held, M. (2011a). Approximating a motorcycle graph by a straight skeleton. In Proc. 23rd Canad. Conf. on Comp. Geom. (CCCG '11), Toronto, Canada. to appear.

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