COMPUTING STRAIGHT SKELETONS BY MEANS OF KINETIC TRIANGULATIONS

Peter Palfrader

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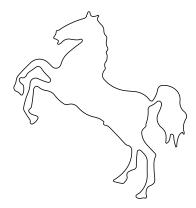
INTRODUCTION Definition Applications

2 TRIANGULATION-BASED ALGORITHM Basic Idea Flaws of the original Algorithm Experimental Results

3 FUTURE WORK

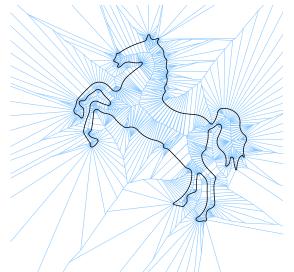
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- Problem: Given input graph, find the straight skeleton.

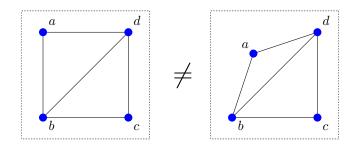


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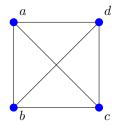
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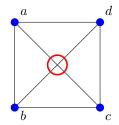
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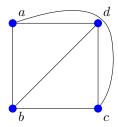
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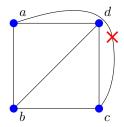
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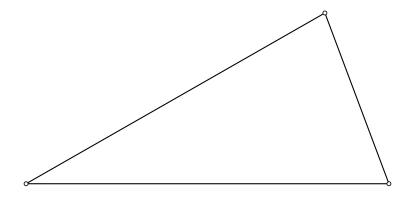
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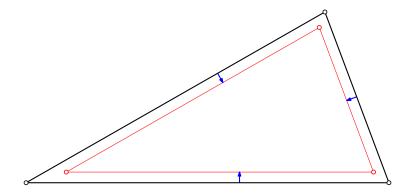
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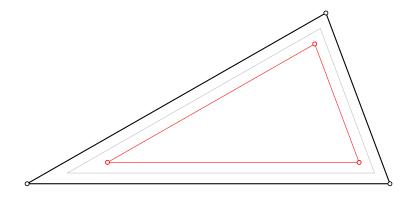
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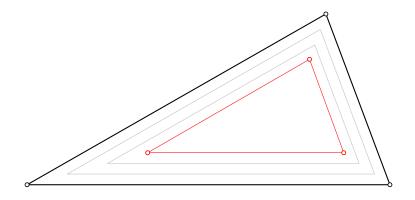
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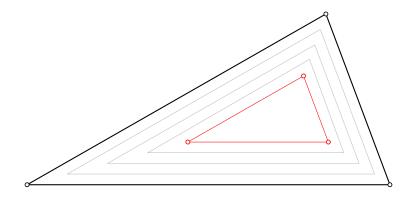
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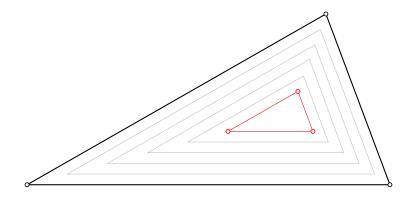
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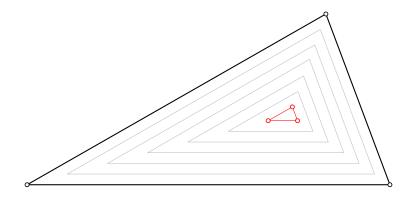
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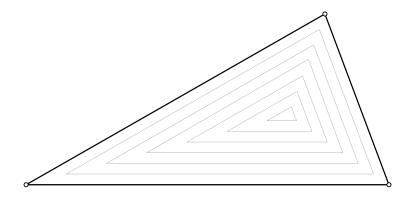
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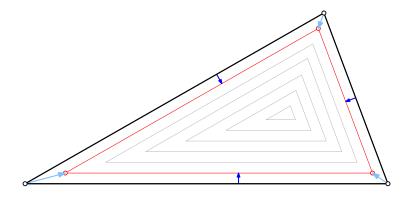
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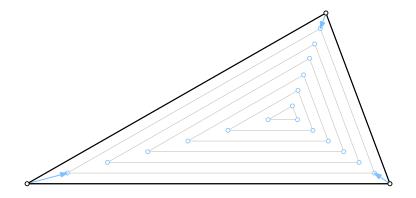
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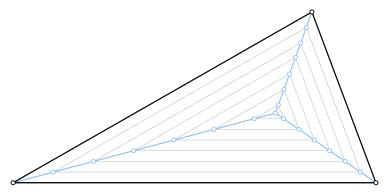
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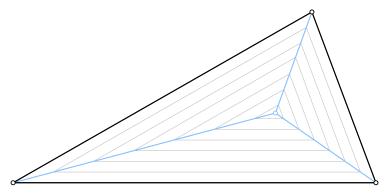
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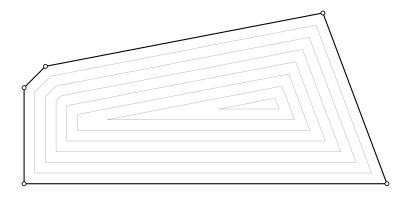


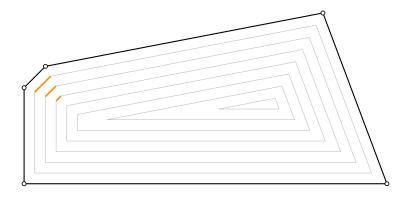
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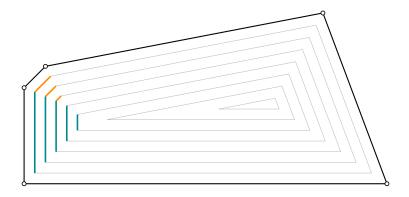


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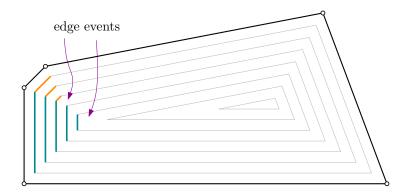




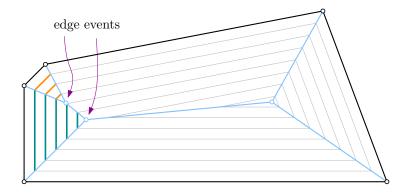




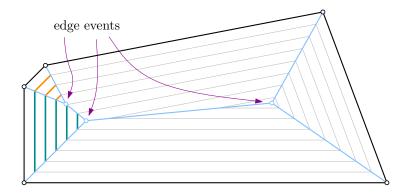
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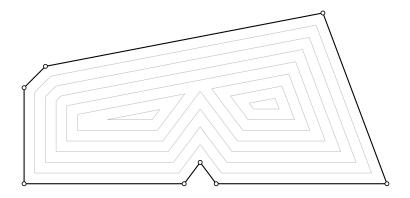


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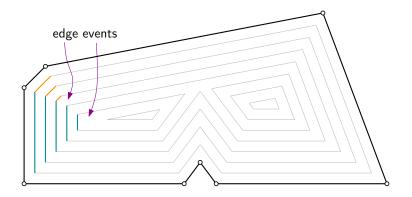


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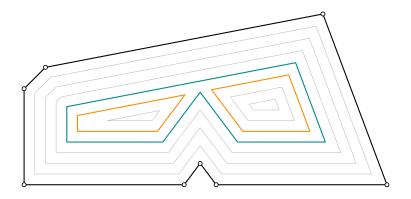




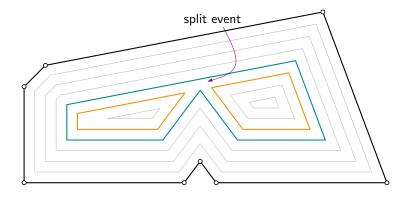
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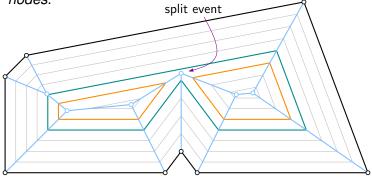
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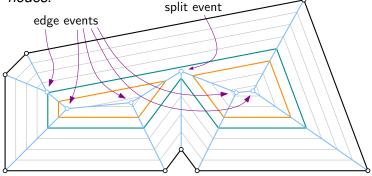
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STRAIGHT SKELETON OF A PSLG

• This definition can easily be expanded to work for arbitrary planar straight line graphs instead of just simple polygons.

SUMMARY: STRAIGHT SKELETONS

- The straight skeleton is the union of traces of wavefront vertices over the propagation process.
- The topology of the wavefront changes with time due to edge and split events. These are witnessed in \mathcal{SK} as nodes.

APPLICATIONS: ROOF MODELING

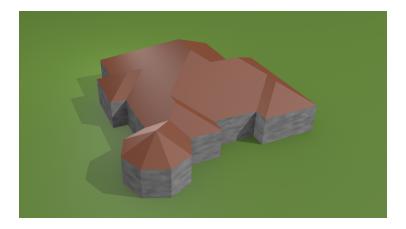


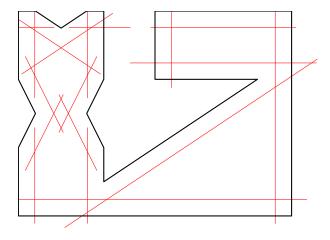
image credit: Stefan Huber

APPLICATIONS: GIS

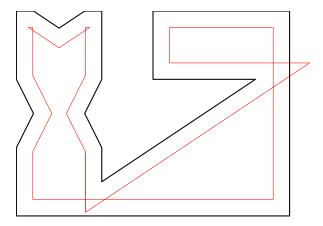


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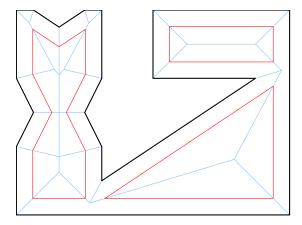
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APPLICATIONS: CUT AND FOLD

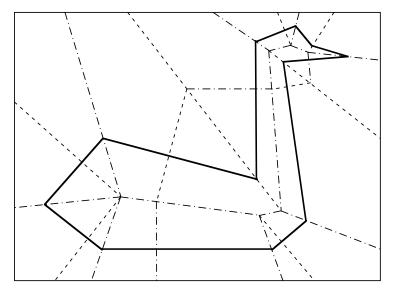
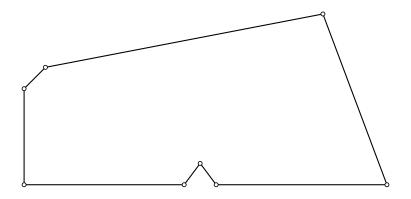




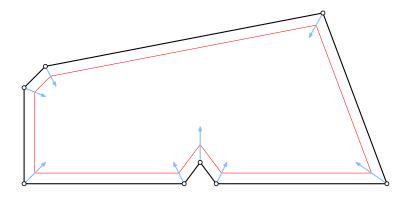
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- Design of Pop-Up cards [Sugi13].
- Shape reconstruction and contour interpolation [OPC96].
- Area collapsing in geographic maps and centerlines of roads [HS08].

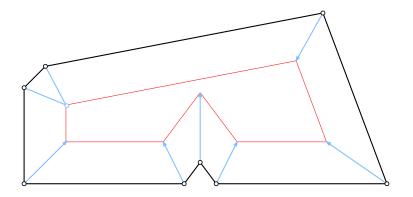
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- · Problem: When will the next event happen, and what is it?
- If we solve this, we can incrementally construct the SK.



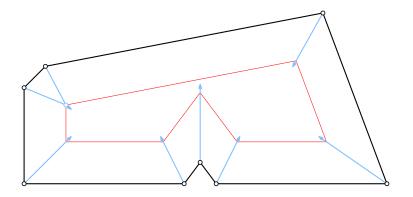
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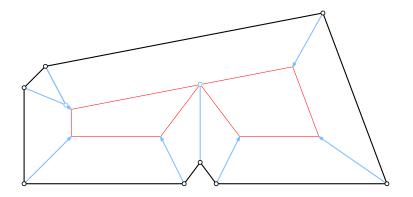
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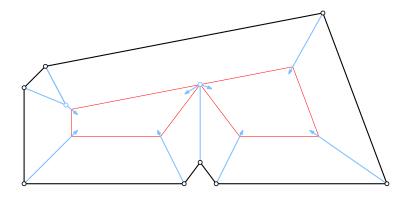
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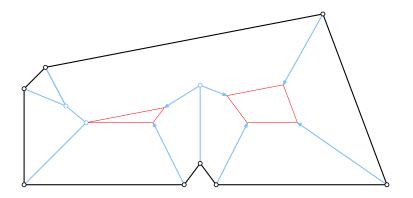
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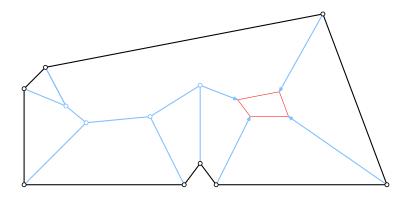
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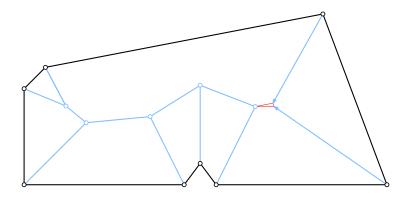
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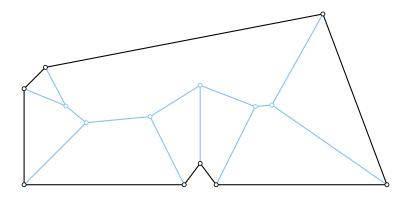
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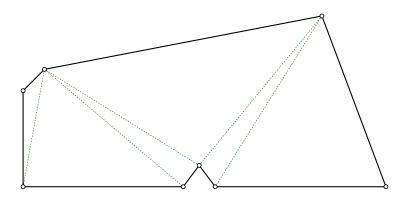
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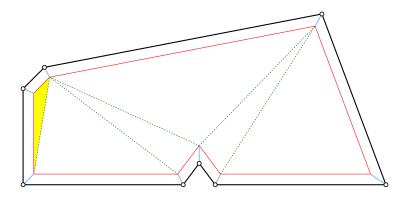
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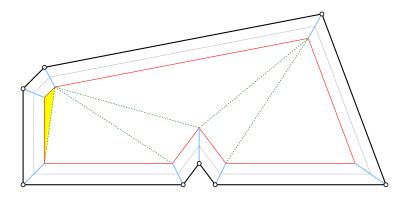
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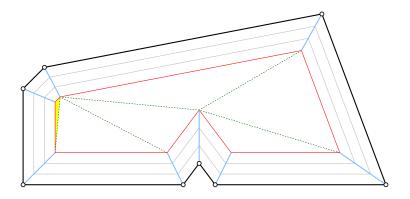
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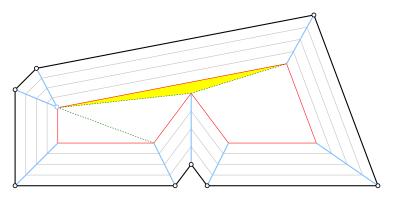
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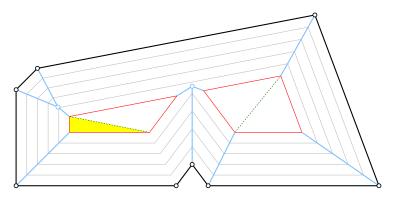
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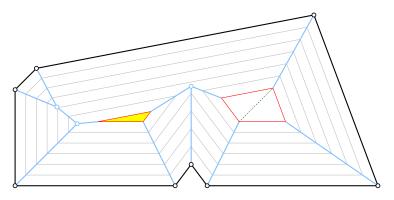
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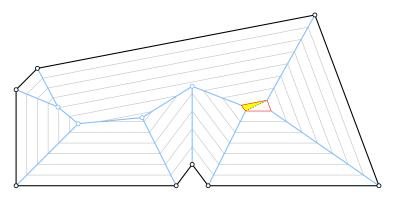
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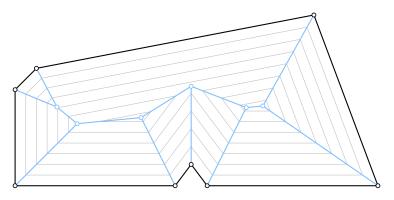
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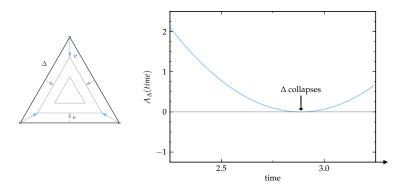
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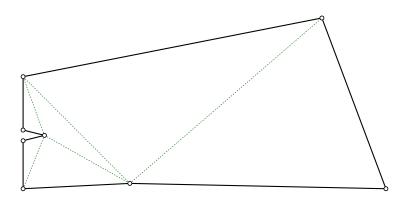


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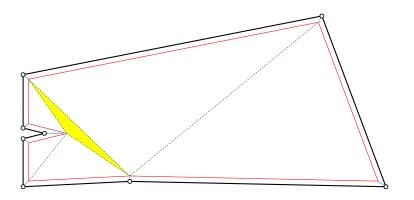


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- Maintain a priority queue of collapses.
- On events, update triangulation and priority queue as required.
- We can always easily find the next event, and thus compute the straight skeleton.

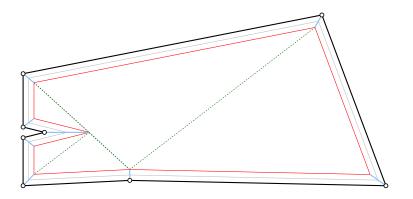
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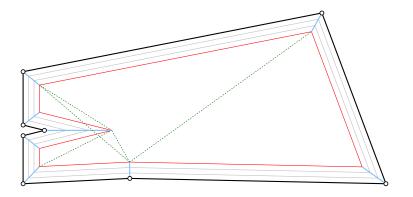
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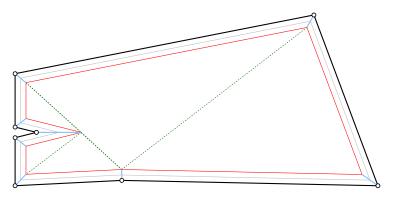
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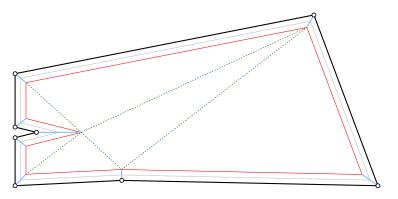
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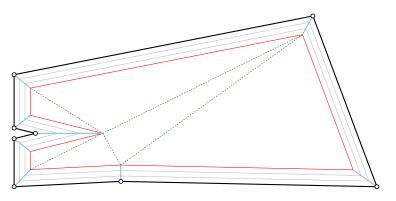
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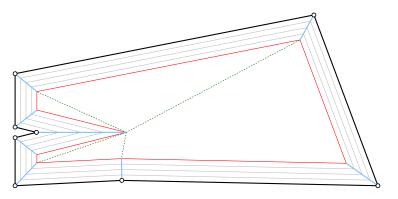
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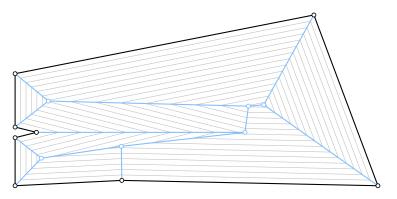
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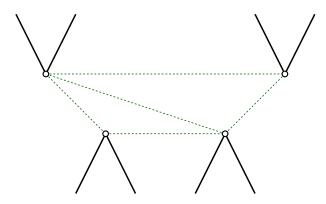
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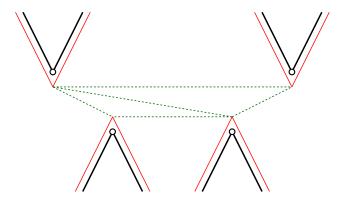


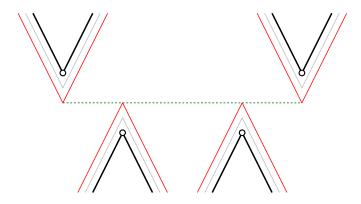
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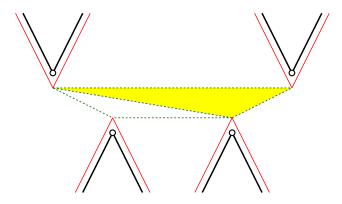


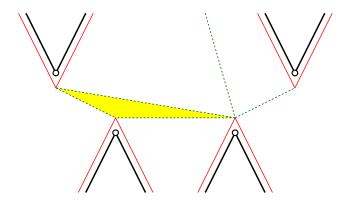
- We have implemented this algorithm.
- We filled in gaps in the description of the algorithm.
- The algorithm does not always work when input is not in general position. We have identified and corrected these flaws.
- We have run extensive tests using this code.

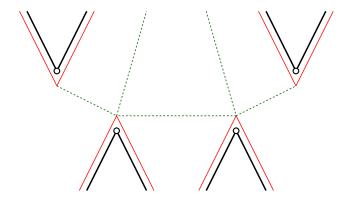


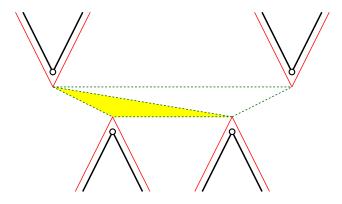


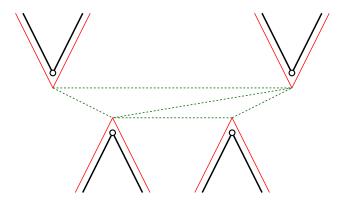


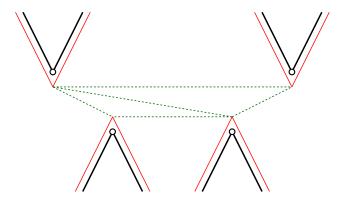




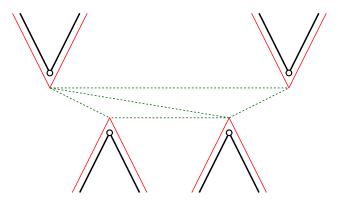








• Without general position, this algorithm can end up in infinite loops.



• This is not a result of inexact floating point operations. The same can happen with exact arithmetic!

If we had exact arithmetic operations, the following would work:

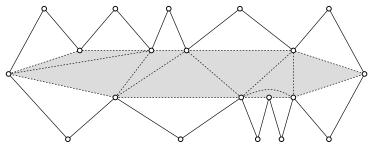
- First, pick the non-flip event \rightarrow reduces triangles
- If only flip events are left, pick the one with the longest edge to flip → reduces longest edge (count or length)

- Keep a history of flip events $\langle e_1, e_2, \ldots \rangle$ where each $e_i = (t_i, \Delta_i)$.
- This history can be cleared when we encounter an edge or split event.
- If we encounter a flip event a second time, we may be in a flip-event loop.

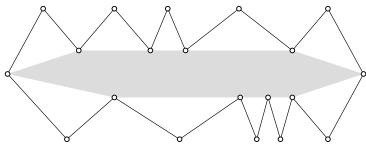
- Identify the polygon *P* which has collapsed to a straight line.
- Retriangulate *P* and its neighborhood.



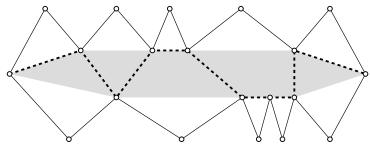
- Identify the polygon *P* which has collapsed to a straight line.
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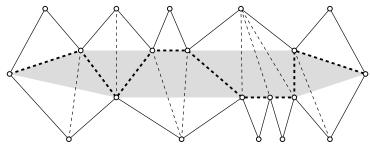
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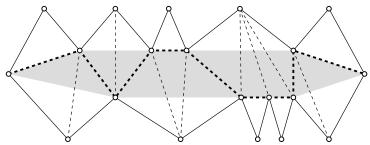


- Identify the polygon *P* which has collapsed to a straight line.
- Retriangulate *P* and its neighborhood.



Brief outline:

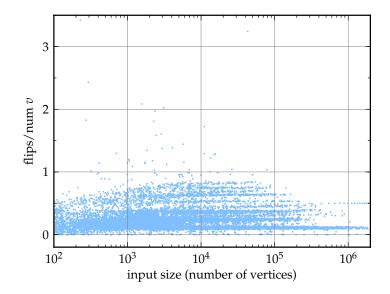
- Identify the polygon *P* which has collapsed to a straight line.
- Retriangulate *P* and its neighborhood.



 This approach is also applicable to kinetic triangulations in other algorithms [MHH12].

- $\mathcal{O}(n^3)$ is the best known upper bound on the number of flip events,
- No input is known that results in more than quadratically many flip events.
- It turns out that for *practical data* the number of flip events is very linear.

NUMBER OF FLIP EVENTS, II



	theoretical worst case		practical	
	runtime	space	runtime	space
E&E ¹	$\mathcal{O}(n^{17/11+\epsilon})$	$\mathcal{O}(n^{17/11+\epsilon})$	N/A	
CGAL ²	$\mathcal{O}(n^2 \log n)$	$\mathcal{O}(n^2)$	$\mathcal{O}(n^2 \log n)$	$\mathcal{O}(n^2)$
Bone ³	$\mathcal{O}(n^2 \log n)$	$\mathcal{O}(n)$	$\mathcal{O}(n \log n)$	$\mathcal{O}(n)$
Surfer ⁴	$\mathcal{O}(n^3 \log n)$	$\mathcal{O}(n)$	$\mathcal{O}(n \log n)$	$\mathcal{O}(n)$

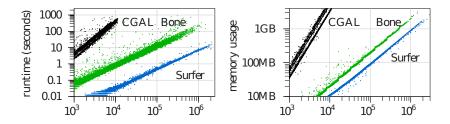
¹Eppstein and Erickson [EE99]

²F. Cacciola, submission to CGAL, 2004

³Huber and Held [HH10]

⁴Palfrader et al. [PHH12], based on Aichholzer and Aurenhammer [AA98]

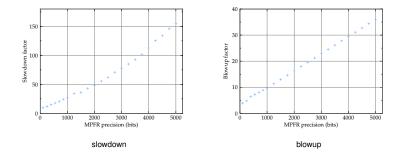
RUNTIME TESTS



Runtime and memory usage behavior of CGAL, Bone, and Surfer for inputs of different sizes.

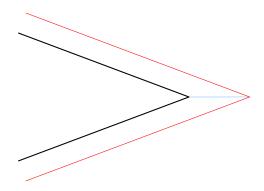
Bone and Surfer use their IEEE 754 double precision backend.

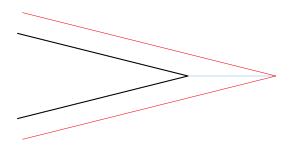
MPFR

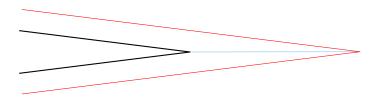


SUMMARY

- We have implemented Aichholzer and Aurenhammer's algorithm from 1998, filling in details in the algorithm description.
- We fixed real problems that arise in the absence of general position.
- Our approach to handling flip events has wider applications.
- The implementation runs in $\mathcal{O}(n \log n)$ time for *real-world data*. The number of flip events is linear in practice.
- It is industrial-strength, having been tested on tens of thousands of inputs.
- It is the fastest straight skeleton construction code to date, handling millions of vertices in mere seconds.

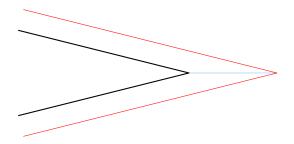




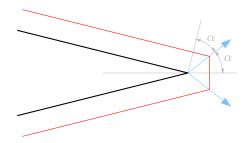




- The current definition causes fast moving vertices for angles approaching 2 · π.
- · Investigate and implement some kind of restricted miters.



- The current definition causes fast moving vertices for angles approaching $2 \cdot \pi$.
- · Investigate and implement some kind of restricted miters.

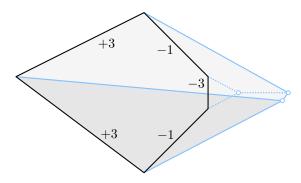


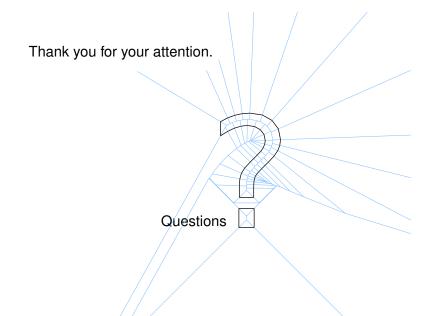
• $\mathcal{O}(n^3)$ is the best known upper bound on the number of flip events.

- $\mathcal{O}(n^3)$ is the best known upper bound on the number of flip events.
- But Rubin showed O(n^{2+ε}) for kinetic Delaunay Triangulations where vertices move at unit speed [Rubin13].
- · Can we transfer this result?

FUTURE WORK: WEIGHTED STRAIGHT SKELETON

- Weighted SK: Edges move at different speeds, maybe even negative speeds.
- Which of the properties of the straight skeleton (planarity, tree structure, faces are monotone) carry over to weighted straight skeletons [BHHKP13]?





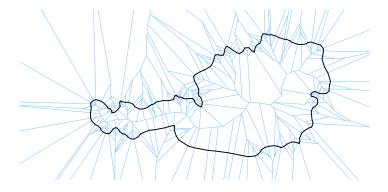
REFERENCES I

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- Willi Mann, Martin Held, Stefan Huber, "Computing Motorcycle Graphs Based on Kinetic Triangulations", Proceedings of the 24th Canadian Conference on Computational Geometry (CCCG 2012)
- Therese Biedl, Martin Held, Stefan Huber, Dominik Kaaser, Peter Palfrader, "Weighted Straight Skeletons In the Plane", Proceedings of the 25th Canadian Conference on Computational Geometry (CCCG 2013)

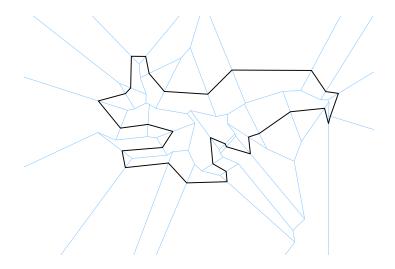
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 Natan Rubin, "On Kinetic Delaunay Triangulations; A Near Quadratic Bound for Unit Speed Motions" Accepted to 54th Annual IEEE Symposium on Foundations of Computer Science (FOCS 2013)

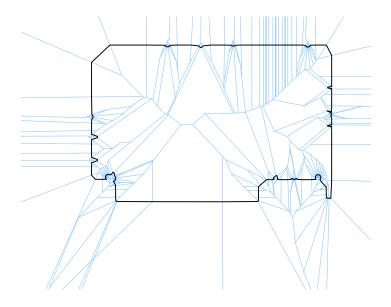
GALLERY: BORDERS OF AUSTRIA



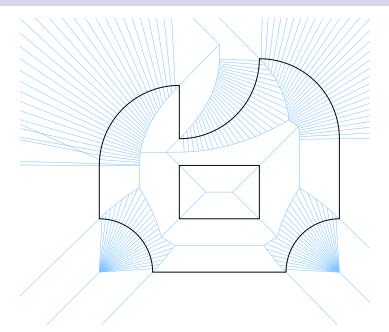
GALLERY: RANDOM POLYGON



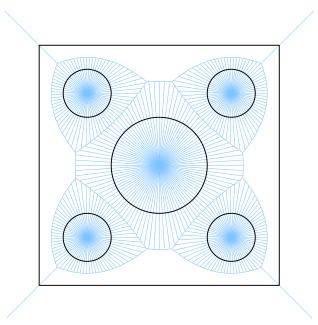
GALLERY: PCB



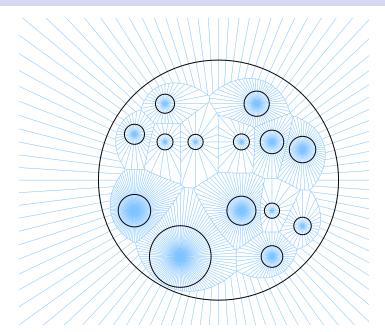
GALLERY: POLYGON WITH HOLE



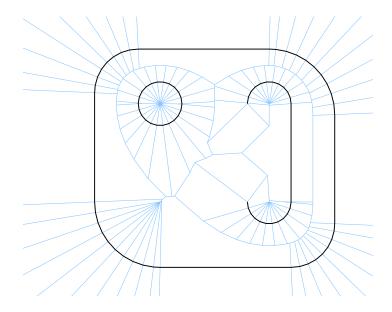
GALLERY: CIRCULAR HOLES



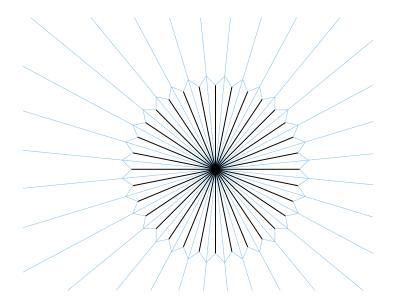
GALLERY: MORE HOLES



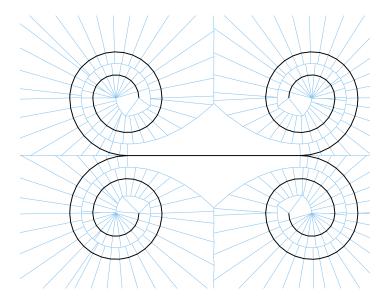
GALLERY: ALMOST POLYGON



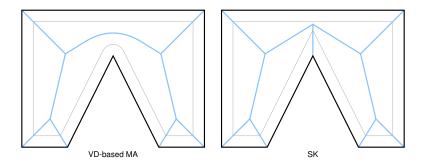
GALLERY: STAR



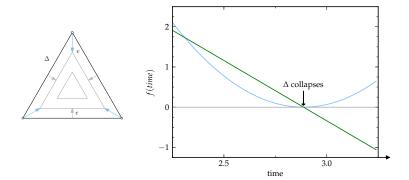
GALLERY: SPIRALS



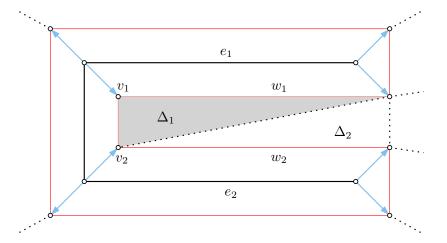
MEDIAL AXIS VS. SK



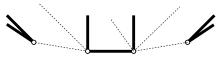
ALTERNATE COMPUTATION



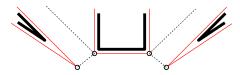
INFINITELY FAST VERTICES



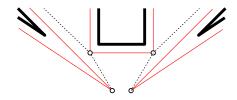
- Triangulate the convex hull.
- Unfortunately the convex hull changes with time, and it matters.



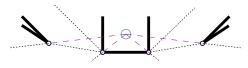
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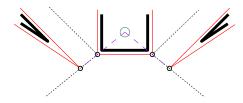
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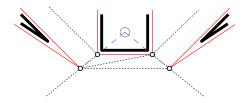
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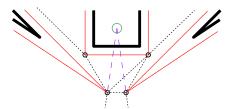
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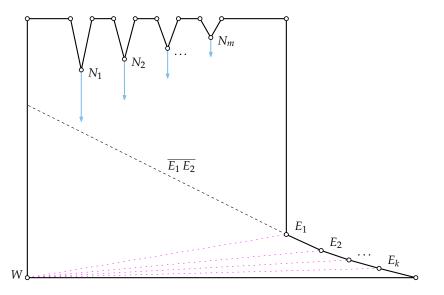
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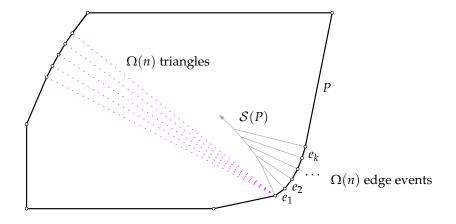
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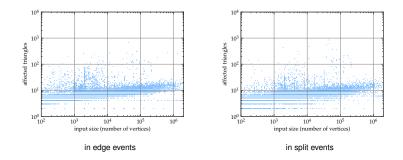
Ω for FLIP events



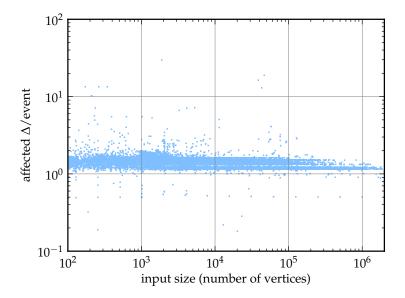
Ω for non-flip events



AFFECTED TRIANGLES, MAX



AFFECTED TRIANGLES, AVG



TIME SPENT, PHASES

