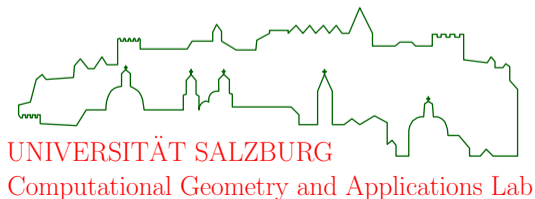


Generalized Voronoi Diagrams: Theory and Related Applications

Stefan de Lorenzo

University of Salzburg, Department of Computer Science

October 5, 2021



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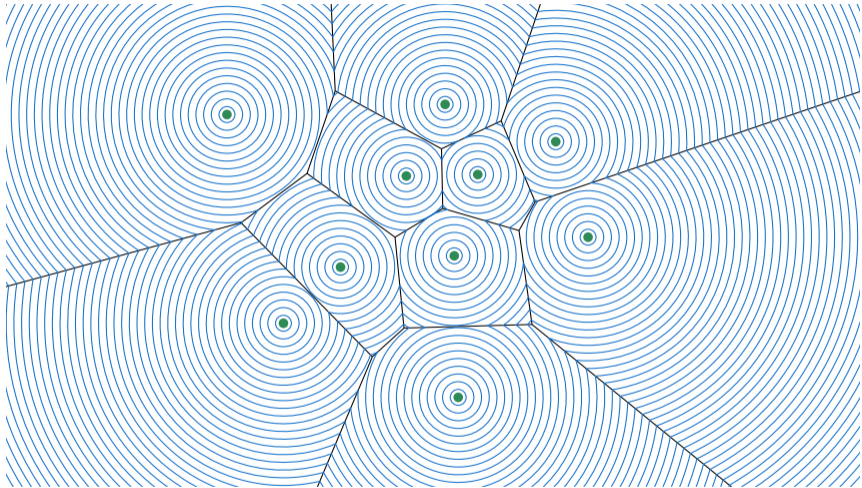
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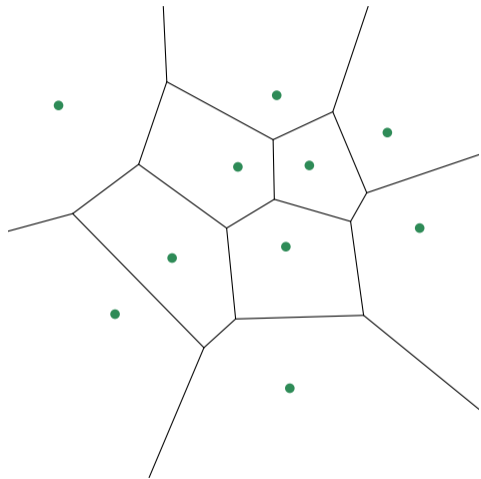


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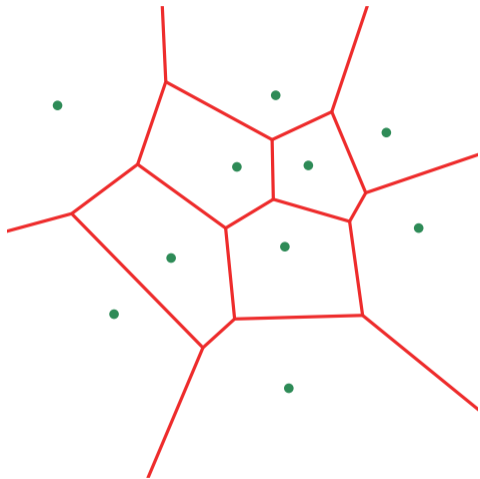
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The Voronoi Diagram of Points



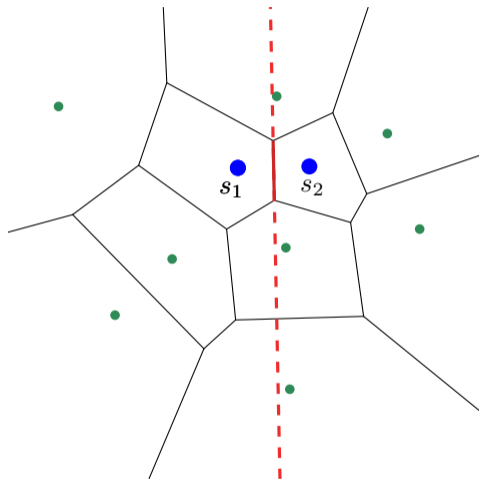
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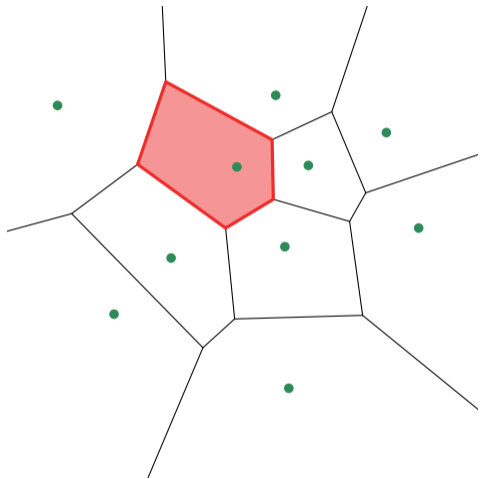
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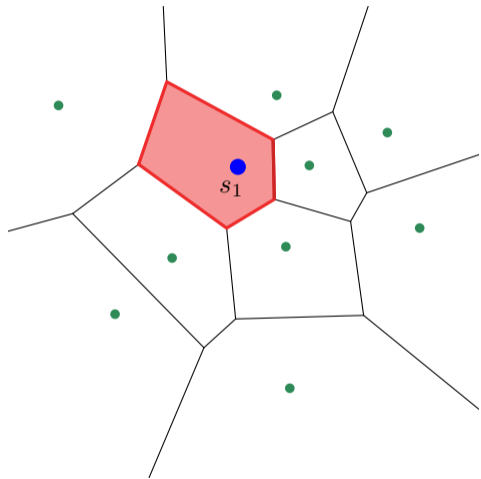
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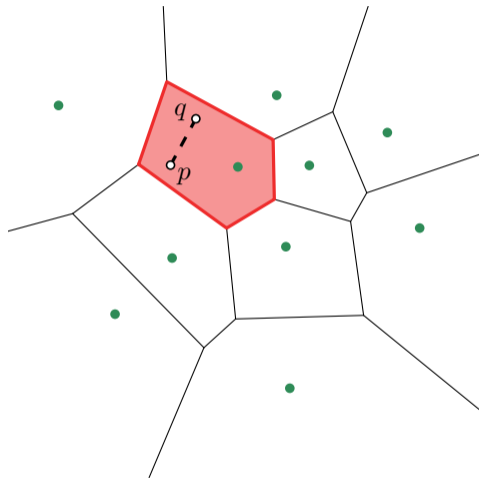
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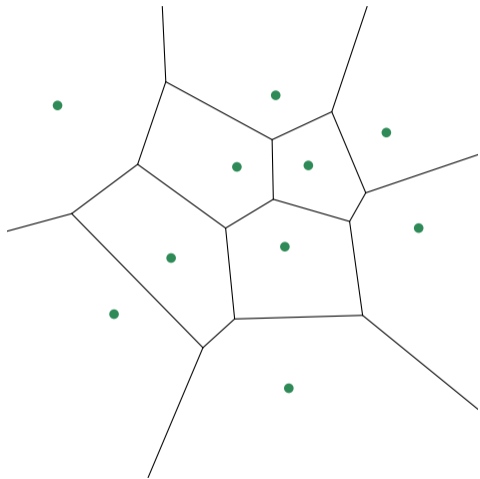
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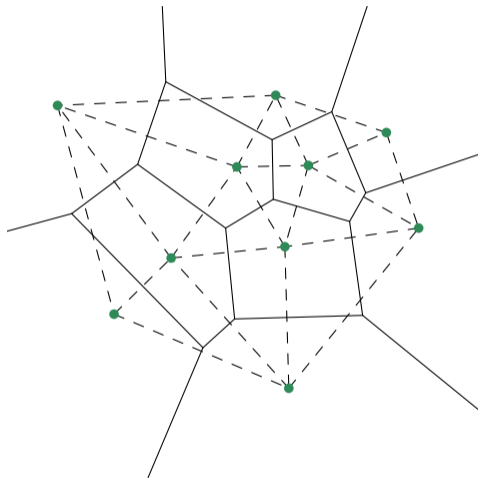
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- Each Voronoi region is **convex**.

The Delaunay Triangulation



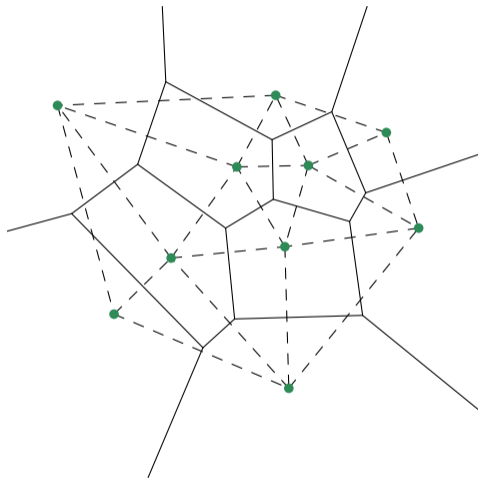
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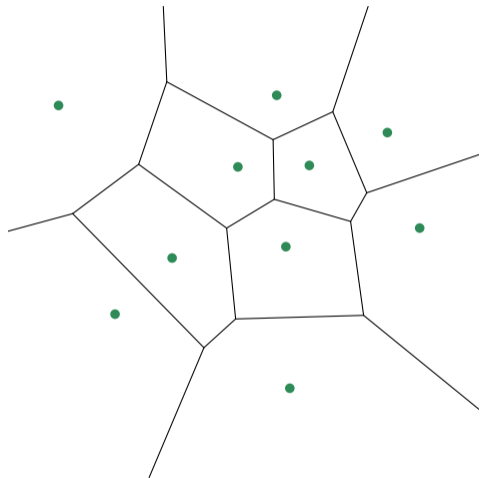


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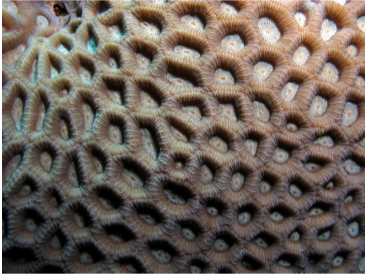


Theorem (Shamos and Hoey 1975)

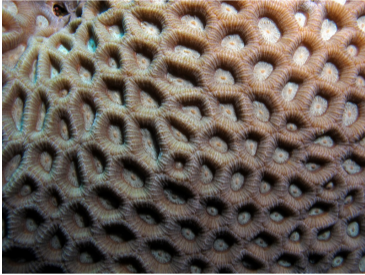
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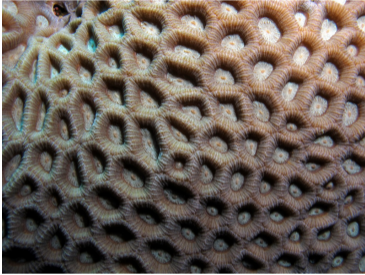
Credit: Keats 2009



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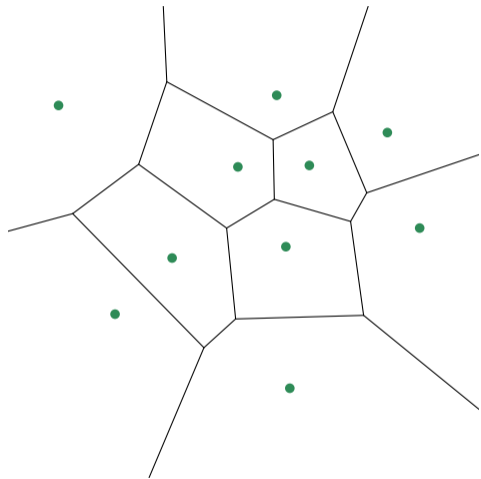
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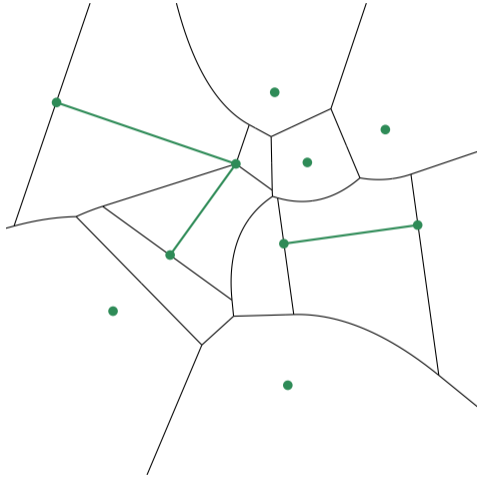
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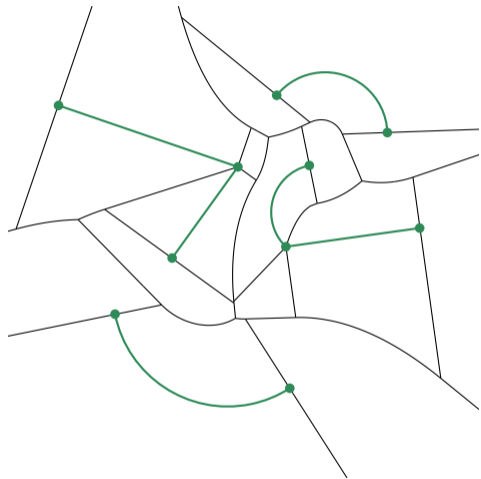
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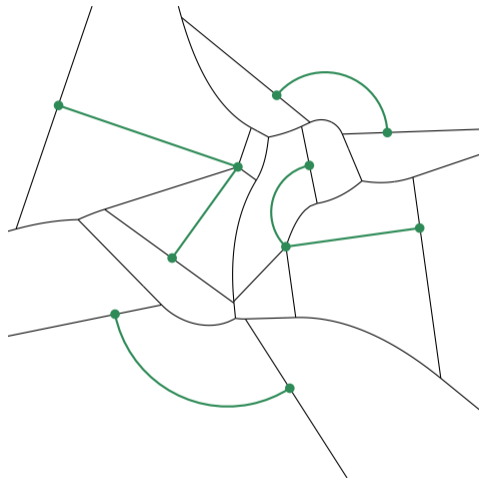
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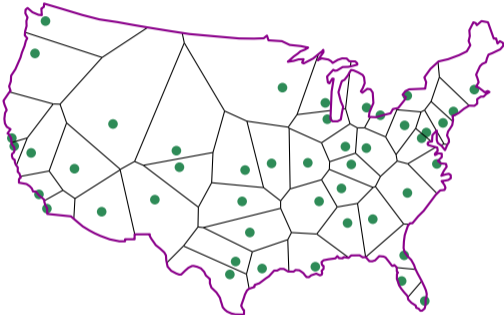
Theorem (Yap 1987)

It is possible to generate the Voronoi diagram of n straight-line segments and circular arcs in optimal $\mathcal{O}(n \log n)$ time.

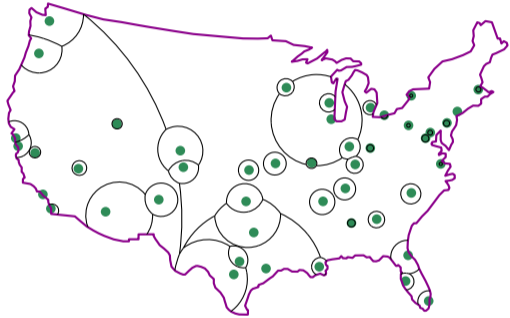
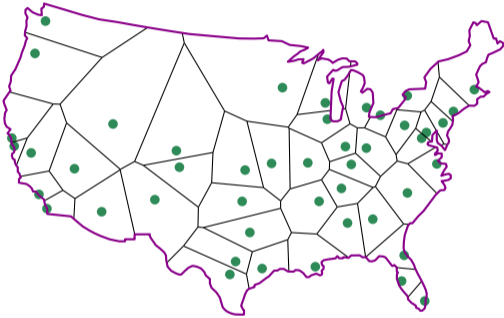
Theorem (Held and Huber 2009)

The Voronoi diagram of n points, straight-line segments, and circular arcs can be computed in expected $\mathcal{O}(n \log n)$ time.

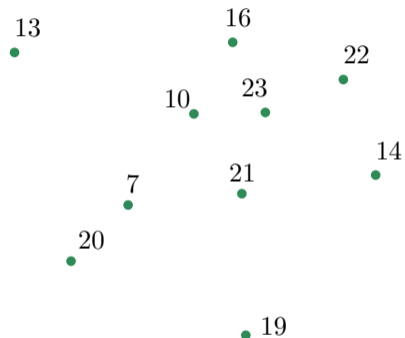
Multiplicatively Weighted Voronoi Diagrams



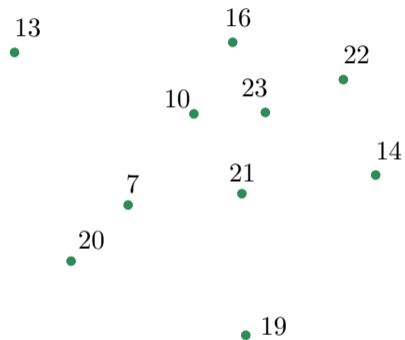
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Multiplicatively Weighted Voronoi Diagrams



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- We associate every site s with a real-valued **weight** $w(s) > 0$.



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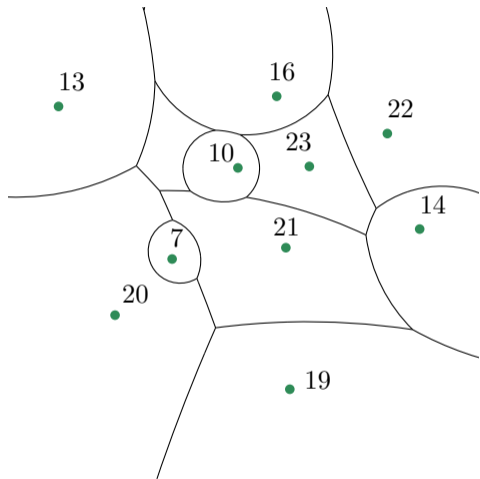
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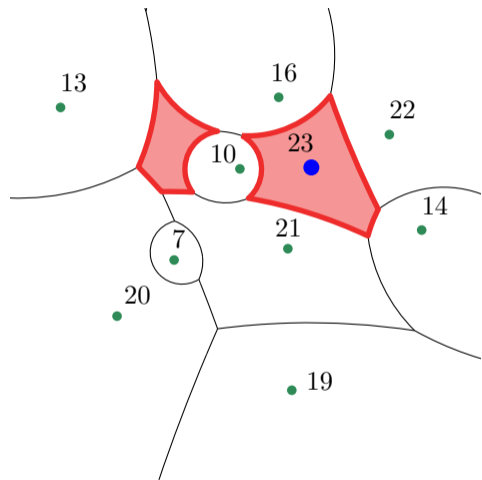


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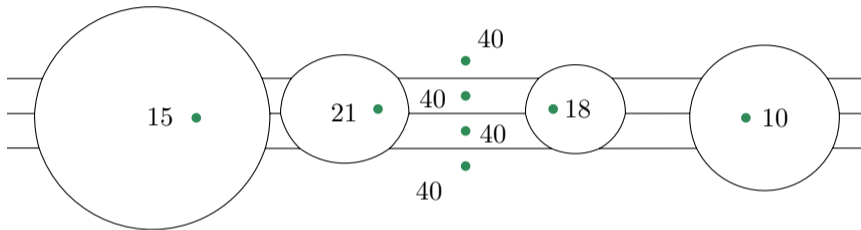


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- The Voronoi regions are (possibly) disconnected.

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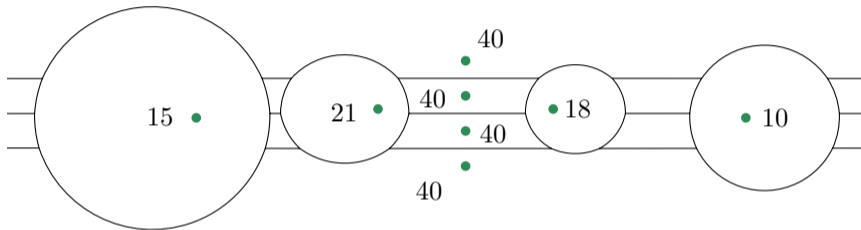
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The multiplicatively weighted Voronoi diagram of n input sites can be computed in (optimal) $\mathcal{O}(n^2)$ time and space.

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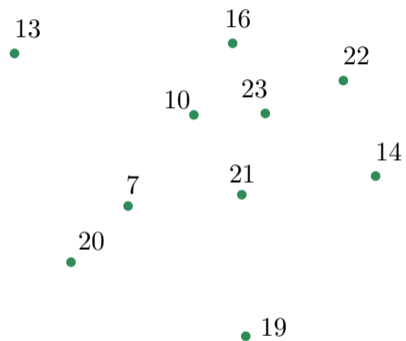
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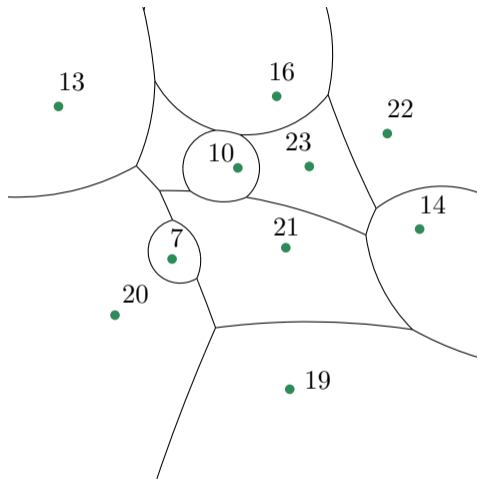
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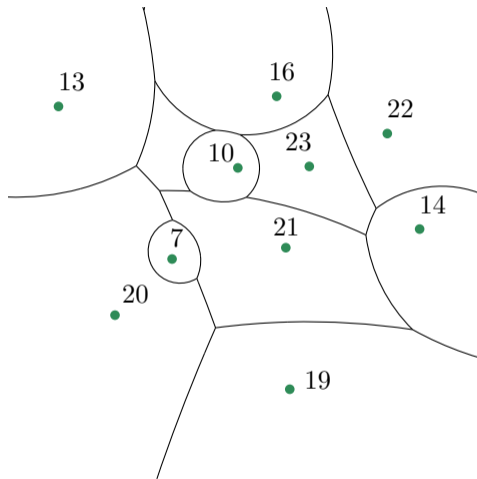
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Find: The multiplicatively weighted Voronoi diagram (MWVD) $\mathcal{VD}_w(S)$ of S .

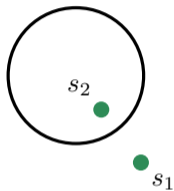


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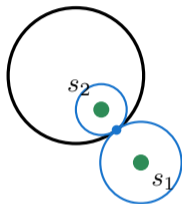
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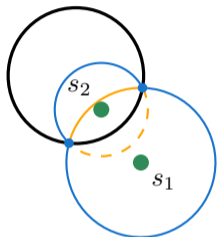
- We present a wavefront-based approach for computing the MWVD.
- The wavefront covers an increasing portion of the plane over time.
- It consists of wavefront arcs and wavefront vertices.
- Whenever a wavefront arc appears or disappears, a new Voronoi node is discovered.



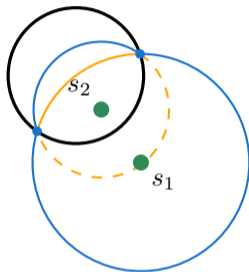
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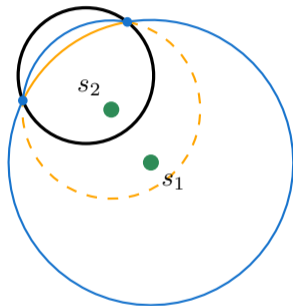
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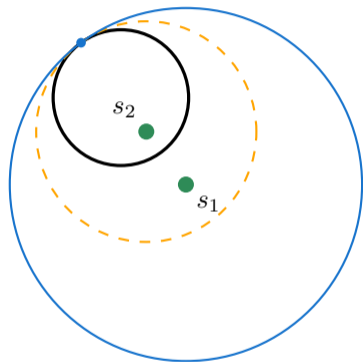
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- **Collision** and **domination events** mark the initial and last contact of two offset circles.
- **Arc events** happen whenever active arcs appear or disappear.
- These events are stored in a priority queue.
- The angular order of active arcs only changes at events.

- All topological changes of the wavefront are properly detected.
- A quadratic number of collision events are computed in any case.
- A moving vertex can be charged with a constant number of arc events.
- In the worst case $\mathcal{O}(n^2)$ arc events take place.
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Theorem (Held and de Lorenzo 2020)

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Let S be a set of n points in the plane, where for each point we independently sample a weight from some distribution. Then the expected complexity of the MWVD of S is $\mathcal{O}(n \log^2 n)$.

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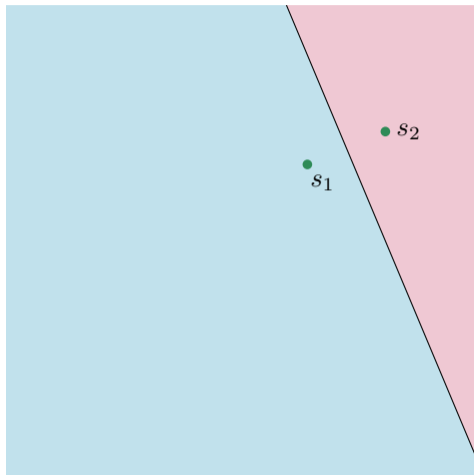


s_1

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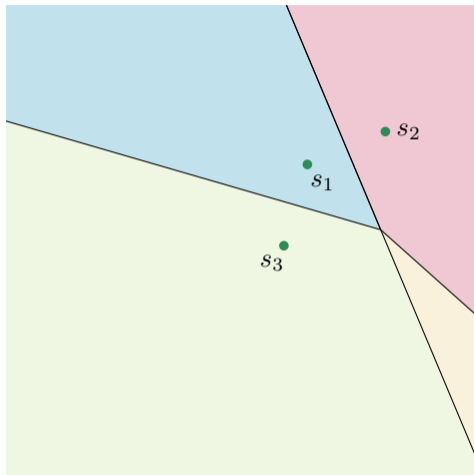
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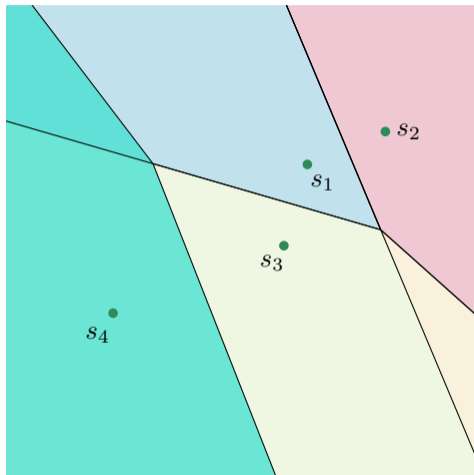
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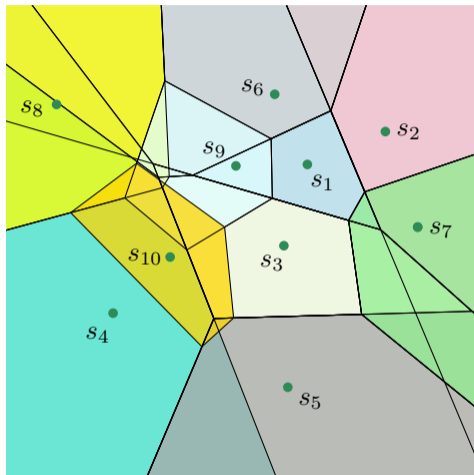
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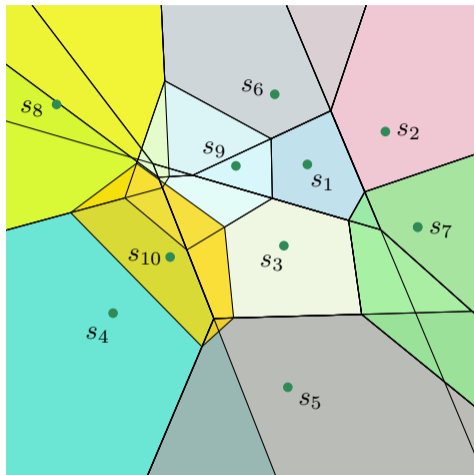
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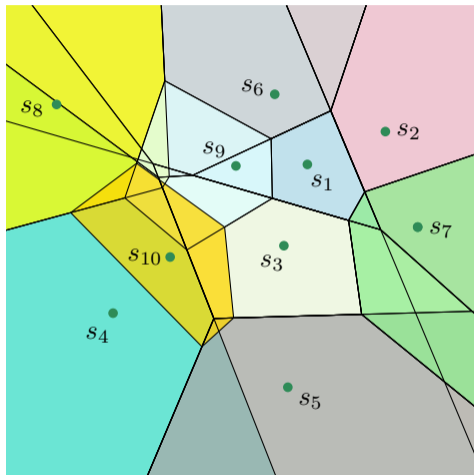
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- A vast number of collisions are invalid for general input.
- The calculation of all possible collision requires a high computational effort.
- Invalid collision are filtered in an additional preprocessing step.
- The average case behavior of the algorithm is improved by using an **overlay arrangement**.



Definition (Candidate Set)

The **candidate set** for a weighted nearest neighbor of $q \in \mathbb{R}^2$ consists of all sites $s \in S$ such that all other sites in S either have a smaller weight or a larger Euclidean distance to q .



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- Only sites within the same candidate set may collide.

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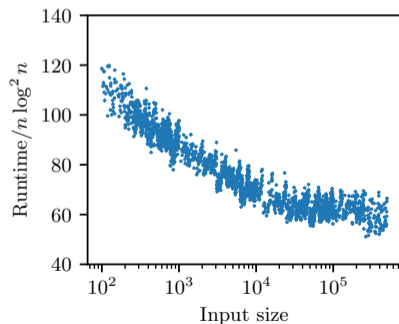
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A wavefront-based approach allows to compute the MWVD of a set S of n (randomly) weighted point sites in expected $\mathcal{O}(n \log^4 n)$ time and expected $\mathcal{O}(n \log^3 n)$ space.

- The implementation is based on the Computational Geometry Algorithms Library (CGAL).
- We tested our strategy on over 3000 different inputs ranging from 256 vertices to 500 000 vertices.
- All tests were carried out on an Intel Core i9-7900X processor clocked at 3.3 GHz.
- For all of these inputs, the weights and point locations were chosen uniformly at random.



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Problem

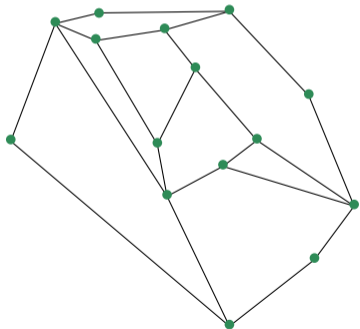
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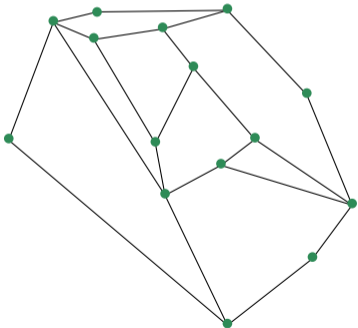
Find: A plane graph with vertex set S (with each point in S having positive degree) that partitions the convex hull of S into the smallest possible number of convex faces. Note that collinear points are allowed on face boundaries, so all internal angles of a face are at most π .



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CG:SHOP 2020

Organized by: Erik Demaine (MIT),
Sándor Fekete (TU Braunschweig),
Phillip Keldenich (TU Braunschweig),
Dominik Krupke (TU Braunschweig),
Joseph S. B. Mitchell (Stony Brook University)

[Download](#)

[Submit Solution](#)

25 teams participating

Sept. 30, 2019, 6 p.m. (UTC) - Feb. 14, 2020,
11:59 a.m. (AoE)

[view all competition news](#)

The competition has ended. To view your score and the score of the best teams, please refer to the ranking tab.

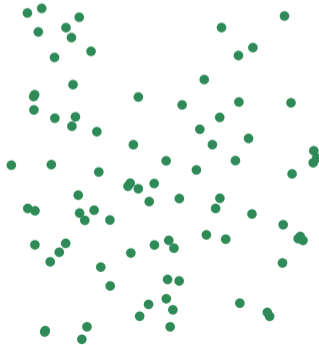
[Problem Description](#) [Ranking](#) [Instance Format](#)

Minimum Convex Partition Problem

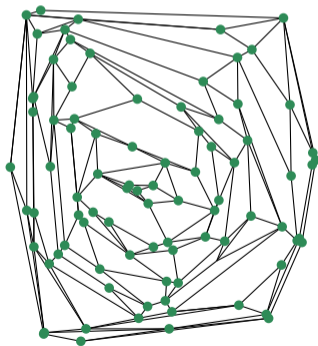
We are happy to announce the CG Challenge 2020, as part of CG Week in Zurich, Switzerland, June 22-26, 2020. As in the CG Challenge 2019, the objective will be to compute good solutions to instances of a difficult geometric optimization problem.

The contributors with the best solutions will be recognized at CG Week and invited to present their results. In addition, the top contributing teams will be invited to submit an extended abstract describing their methods and results, to be included in the LIPIcs proceedings of SoCG.

- The 3APX tool implements the algorithm by Knauer and Spillner 2006.

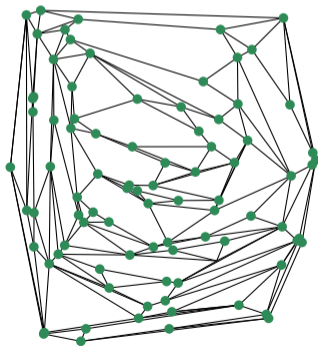


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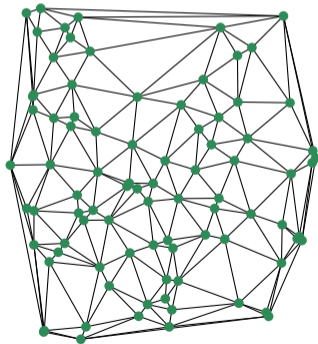


3-Approximation

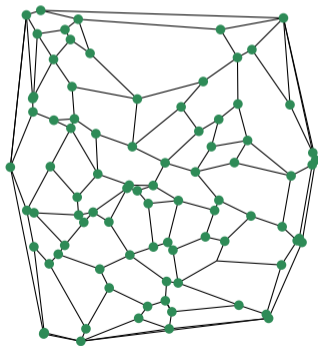
- The 3APX tool implements the algorithm by Knauer and Spillner 2006.
- We extended 3APX by an approach based on onion layers.
- The decompositions generated contained lots of extremely long and thin triangles.



- **Simple idea:** Start with a Delaunay triangulation ...

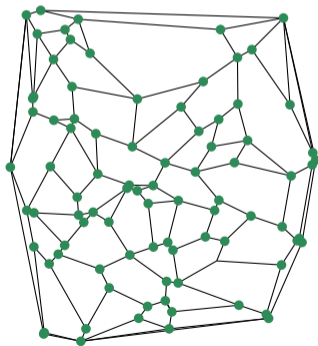


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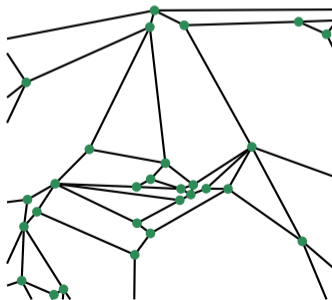


Merging Triangles

- **Simple idea:** Start with a Delaunay triangulation and merge neighboring faces.
- Our first implementation MERGEREFINE easily beat 3APX.
- This initial success motivated the development of a more sophisticated strategy.

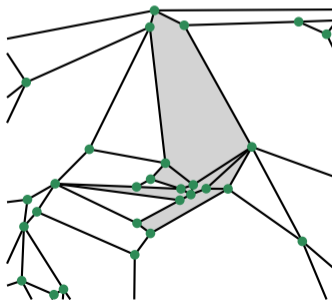


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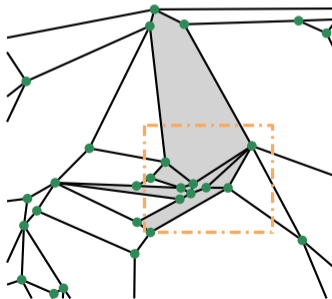
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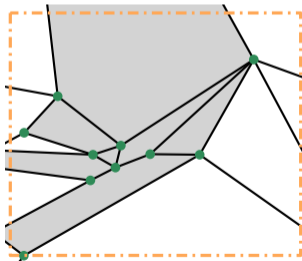
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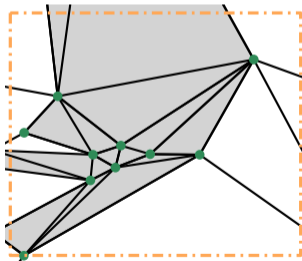
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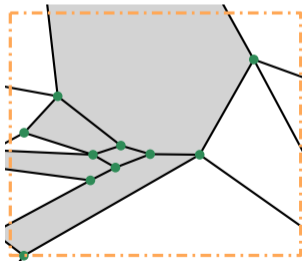
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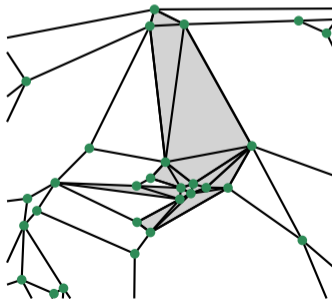
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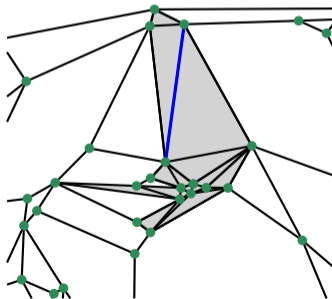
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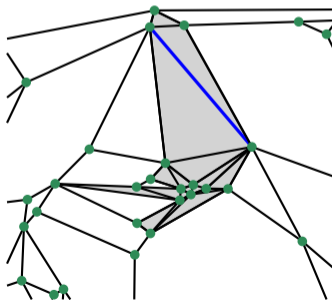
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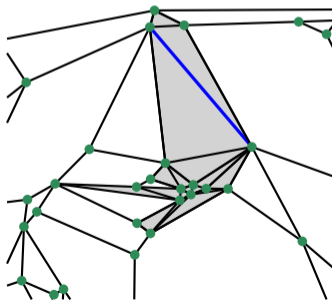
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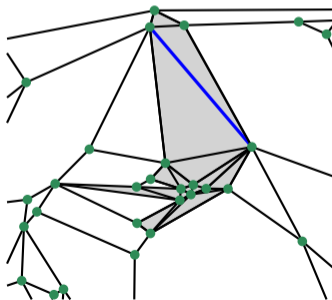
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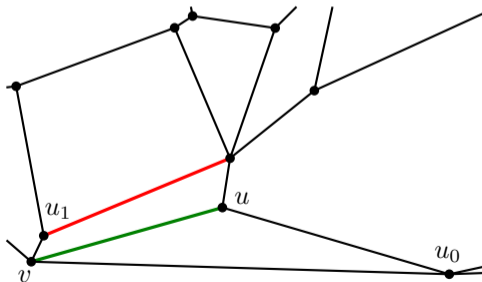
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- **Parallel recursor**: Partition a decomposition into several non-overlapping sets of faces.



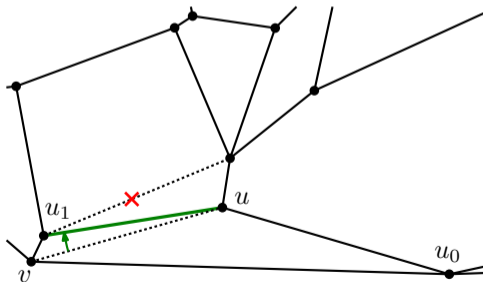
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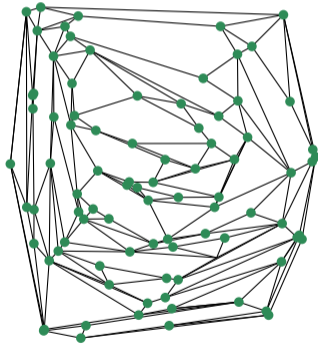
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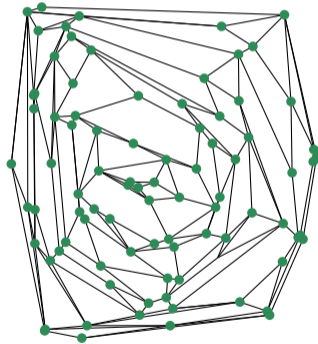
3APX (random)

#Faces 111



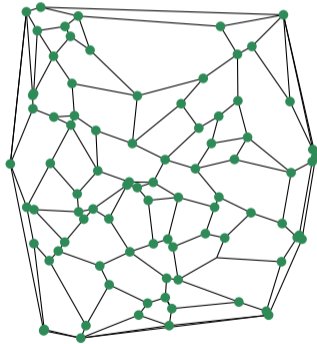
3APX (random) \rightarrow 3APX (onion)

#Faces 100



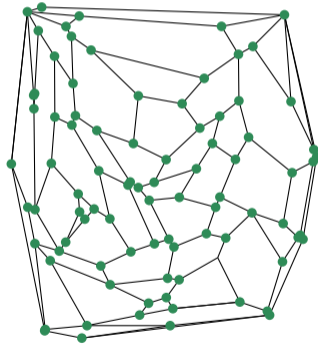
3APX (random) \rightarrow 3APX (onion) \rightarrow MERGEREFINE

#Faces 63



3APX (random) \rightarrow 3APX (onion) \rightarrow MERGEREFINE \rightarrow RECURSOR + FLIPPER

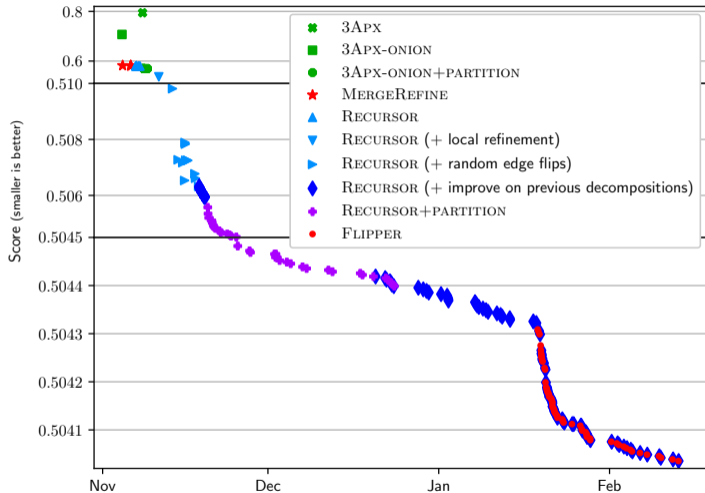
#Faces 54



Score Over Time

- We ran our tools on a wide variety of different computers.
- The estimated quality of a given decomposition is based on its **score**.

$$\text{score} := \frac{\text{number of edges in convex partition}}{\text{number of edges in triangulation}}$$



Skip

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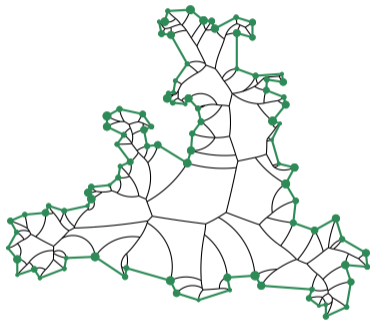
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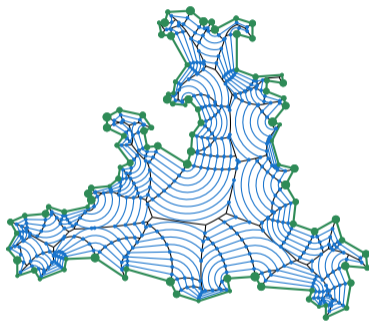
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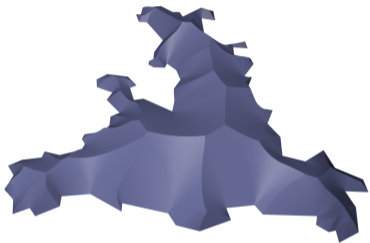
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- **Variable-radius roots** can be derived from variable-radius skeletons.

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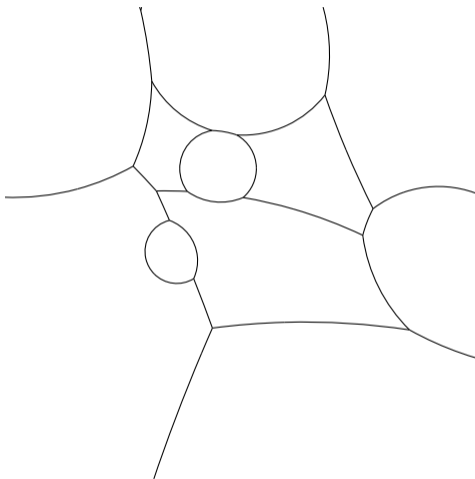
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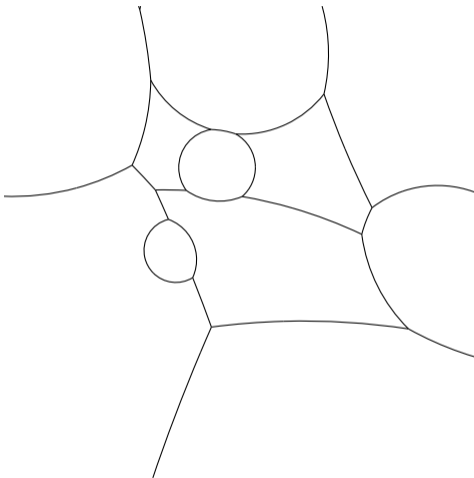
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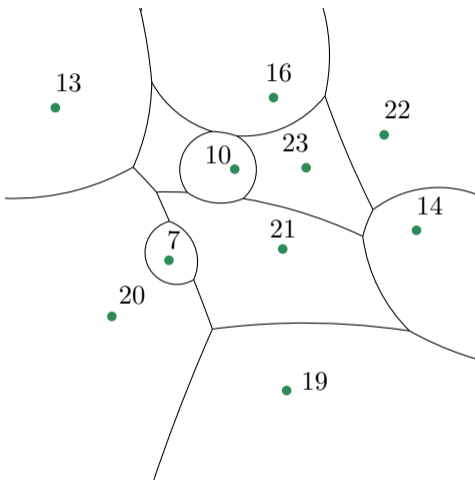
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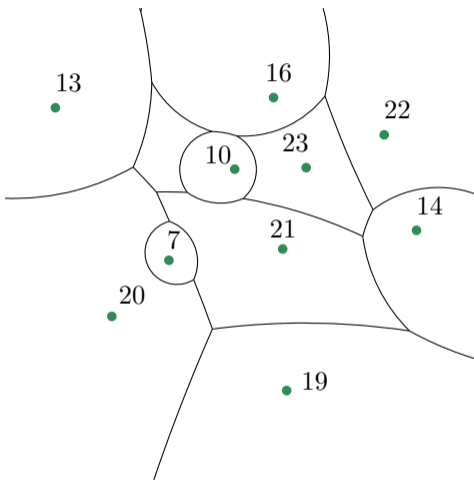
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Theorem (Eder, Held, de Lorenzo, and Palfrader 2021)

If G is a graph that is regular of degree three then we can decide in $\mathcal{O}(m)$ time whether it is a bisector graph, where m denotes the combinatorial complexity of G .

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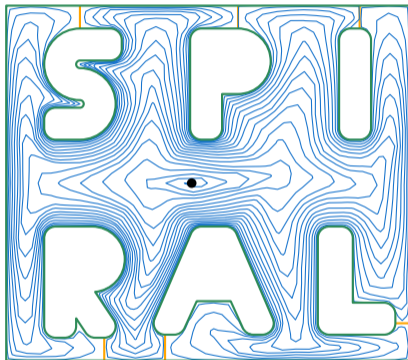
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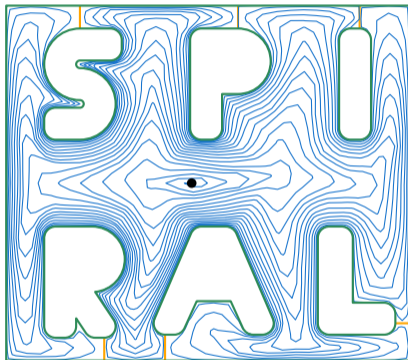
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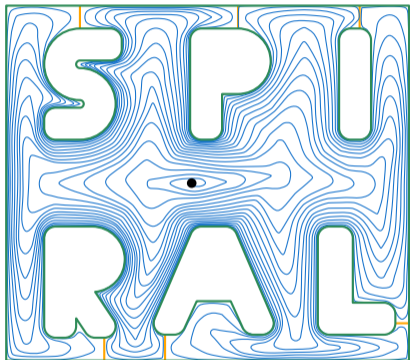


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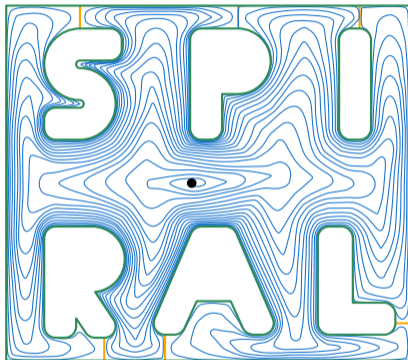


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- For **high-speed machining**, it is important to avoid sharp corners.
- Thus, we smooth the spiral path using **cubic B-splines**.

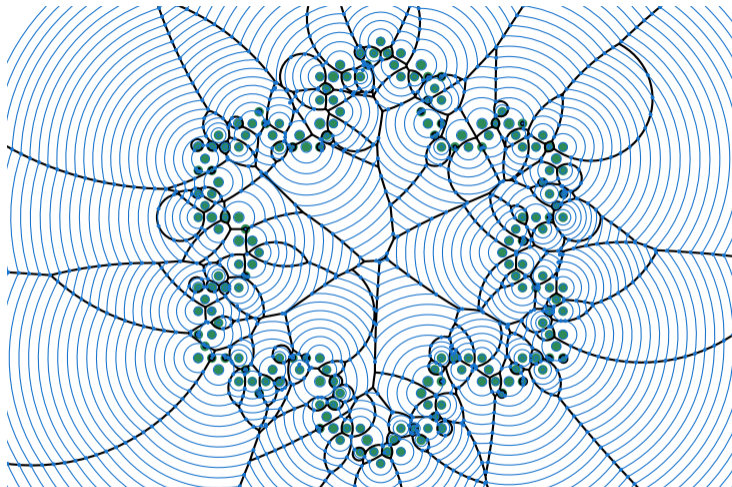


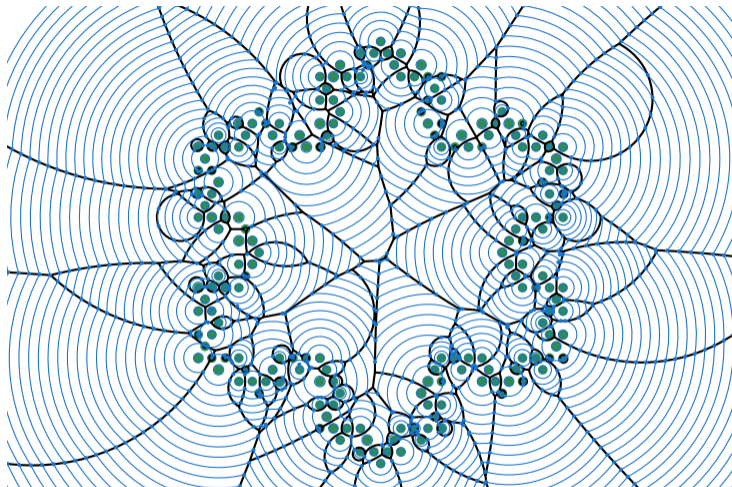
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- For **high-speed machining**, it is important to avoid sharp corners.
- Thus, we smooth the spiral path using **cubic B-splines**.
- Additionally, it is also possible to generate **double spirals**.









Thank you for your attention!

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