

# Deletion in Abstract Voronoi diagrams in Expected Linear Time

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• Offer a unifying framework to many concrete diagrams. Defined on bisecting curves satisfying some axioms, rather than sites.



Rolf Klein. Concrete and Abstract Voronoi Diagrams. 1989.



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- **Open** since then for other sites (line segments, circles etc.).
- **Open** for **abstract Voronoi diagrams** (AVDs).



For abstract Voronoi diagrams and non-point sites (line segments, circles):

The Voronoi region of **one site** can have **multiple faces** within VR(s). – The sites along  $\partial VR(s)$  can **repeat**. (AVDs:  $\partial VR(s)$  is a Davenport-Schinzel sequence of order 2.)





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  - The farthest Voronoi diagram of points, given their convex hull.
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- Forest-Like abstract Voronoi Diagrams [Bohler, Klein, Liu, CCCG 2014] Similar conditions, where no region can have multiple faces.



## • The **medial axis** of a simple polygon.

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Expected linear-time algorithm for the farthest-segment Voronoi diagram, after the sequence of faces at infinity is known.
[Khramtcova, Papadopoulou, ISAAC 2015]



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 relaxed version of a Voronoi diagram (easier to compute)





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## Introduce Voronoi-like diagrams

 relaxed version of a Voronoi diagram (easier to compute)



A simple, **randomized incremental** algorithm for updating abstract Voronoi diagrams after **deletion** of one site **in expected linear time**.

- adapt to the **farthest abstract Voronoi diagram**, after the sequence of its faces at infinity is known.


- Define abstract Voronoi diagrams (AVDs).
- Define Voronoi-like diagrams.
- Properties of Voronoi-like diagrams.
- Define an **insertion** operation on Voronoi-like diagrams.
- Sketch a randomized incremental algorithm.





































Given 
$$\mathcal{J} := \{J(p,q) : p \neq q \in S\}.$$

For every  $S' \subseteq S$ :

(A1) Voronoi regions are non-empty and connected.

(A2) Voronoi regions cover the plane.

(A3) Bisectors are unbounded Jordan curves.

(A4) Transversal and finite # intersections.



- For simplicity we always assume a big circle Γ, containing all intersections.
  We restrict all computations in the interior of Γ.
- VR(s) can be bounded, unbounded, and have several openings to infinity ( $\Gamma$ -arcs).





#### Site deletion

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**Lemma:**  $\mathcal{V}(S \setminus s) \cap \mathsf{VR}(s)$  is a **forest** with **one face per Voronoi edge** of  $\partial \mathsf{VR}(s)$ .



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Site  $s_{\alpha}$  can have  $\Theta(n)$  faces within VR(s). Treat each face independently (different arc).





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#### Next: Definitions...





*p*-monotone paths

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A path in  $\mathcal{J}_p$  is the *p*-envelope, if it is the boundary of VR(*p*)





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Consider the arrangement of all s-related bisectors of arcs in  $\mathcal{S}'$ .





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 $\mathcal{S}'$ 

Let  $\mathcal{S}' \subseteq \mathcal{S} =$ boundary arcs (Voronoi edges) along  $\partial VR(s)$ .

A boundary curve  $\mathcal{P}$  for  $\mathcal{S}'$  is an *s*-monotone path in the arrangement of *s*-related bisectors that contains every arc in  $\mathcal{S}'$ .



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 $\mathcal{S}'$  can have different boundary curves.



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- Each boundary arc  $\alpha \in \mathcal{P}$  has one region  $R(\alpha)$ .
- $\partial R(\alpha)$  is an  $s_{\alpha}$ -monotone path plus  $\alpha$ .







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- Missing arc lemma: Suppose an α-related bisector appears within R(α). Then there is an arc β "missing" from P.



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- Missing arc lemma: Suppose an  $\alpha$ -related bisector appears within  $R(\alpha)$ . Then there is an arc  $\beta$  "missing" from  $\mathcal{P}$ .  $J(s,s_{\beta})$  $\mathcal{D}$



**Theorem:** 

The Voronoi-like diagram  $\mathcal{V}_l(\mathcal{P})$  of a boundary curve  $\mathcal{P}$  is unique.





Voronoi-like regions do not have the standard monotonicity property of real Voronoi regions:

Voronoi diagram:  $S' \subseteq S \Rightarrow \mathsf{VR}(p, S) \subseteq \mathsf{VR}(p, S')$ 

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In proofs, use missing-arc lemma instead









































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**Theorem:**  $\mathcal{V}_l(\mathcal{P}) \oplus \beta$  is the Voronoi-like diagram,  $\mathcal{V}_l(\mathcal{P} \oplus \beta)$ .









Use a bi-directional induction starting at the two endpoints of  $\beta$ . Show:

•  $J(\beta)$  cannot hit a boundary arc.





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- At the end, the 2 brunches of  $J(\beta)$  meet in the same region





### Possibilities for inserting $\beta$ in ${\cal P}$



(d) Split  $\Gamma$ -arc. (e) Shrink  $\Gamma$ -arc. (f) Trivial.

Consider a random permutation of the arcs  $\mathcal{S}$ .

**Phase 1**: Delete arcs from S, recording their neighbors at time of deletion (inspired by Chew).

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...constructing Voronoi-like diagrams within a series  $\phi$ f shrinking domains.



Because of auxiliary arcs, when we insert an arc, its neighbors need not be the ones of Phase 1. Need to trace auxiliary arcs (expected constant).

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In the end we obtain  $\mathcal{V}_l(\mathcal{S}) = \mathcal{V}(\mathcal{S} \setminus s) \cap \mathsf{VR}(s)$ .



#### Theorem:

Given  $\mathcal{V}(S)$  and a site  $s \in S$ , the Voronoi diagram  $\mathcal{V}(S \setminus \{s\})$  can be computed in expected time linear in the complexity of  $\partial VR(s)$ .



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#### In the **proof** we use:

- Lemma: The boundary curve at step *i* consists of at most 2*i* arcs.
- Lemma: The expected number of arcs that are visited during one insertion is constant.
- Backward analysis, similar to line segments [Khramtcova, Papadopoulou, ISAAC 2015]

#### Future work / Open problems

• Deterministic linear-time algorithm for deletion in abstract Voronoi diagrams ?

**Currently**, we are exploring using Voronoi-like diagrams in the framework of [Aggarwal, Guibas, Saxe and Shor, DCG 1989].

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#### Thank you for your attention!