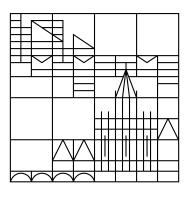
Universität Konstanz

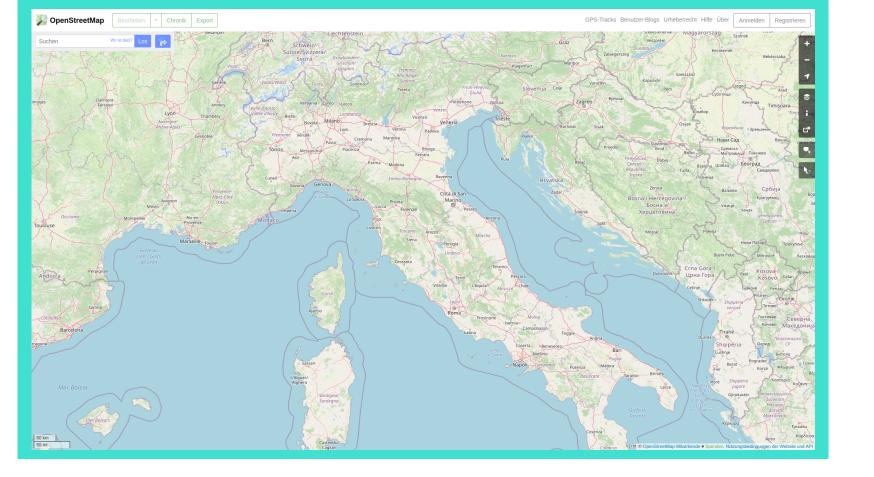




Local-Fréchet Polyline Simplification Has Subcubic Complexity in Two Dimensions

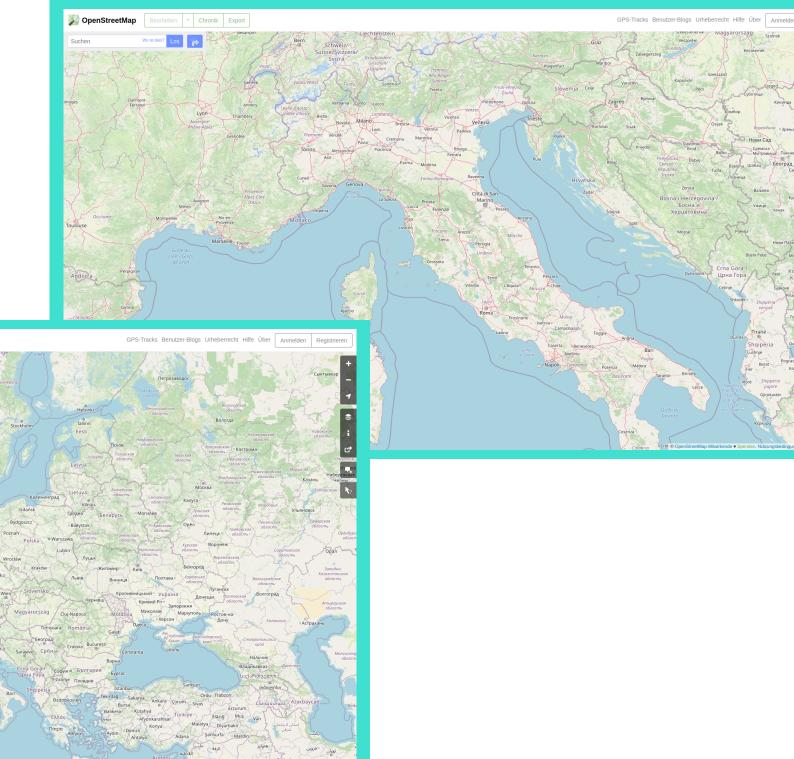
EuroCG 2022

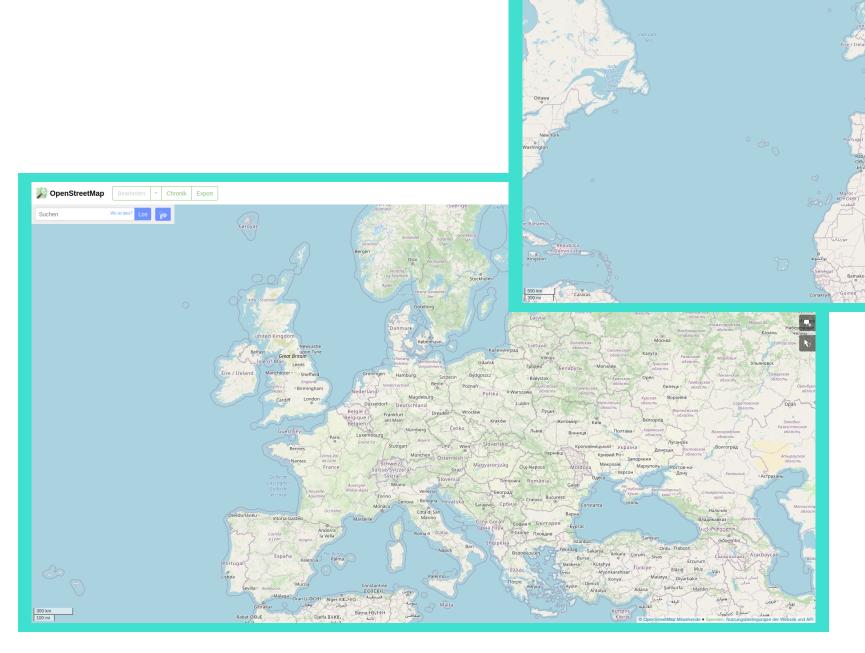
Sabine Storandt and Johannes Zink



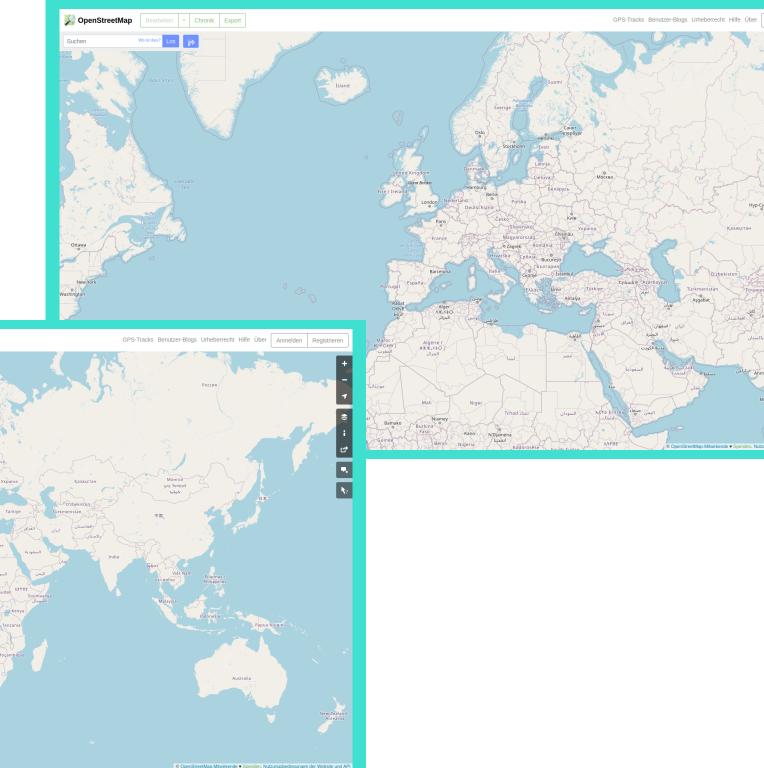
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OpenStreetMap Bearbeiten Chronik Export



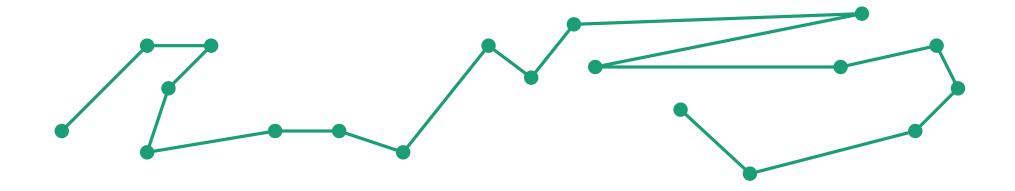


OpenStreetMap Bearbeiten + Chronik Export



Given: \blacksquare polyline P as a sequence of n points in the plane

Given: \blacksquare polyline P as a sequence of n points in the plane



Given: \blacksquare polyline P as a sequence of n points in the plane

 \blacksquare distance threshold ε



Given: \blacksquare polyline P as a sequence of n points in the plane

 \blacksquare distance threshold ε

Find: Min. size subsequence P' of P, s.t. $d_X(P', P) \le \varepsilon$ (keep start and end point).



Given: \blacksquare polyline P as a sequence of n points in the plane

 \blacksquare distance threshold ε

distance measure for comparing two curves

Find: Min. size subsequence P' of P, s.t. $d_X(P', P) \le \varepsilon$ (keep start and end point).



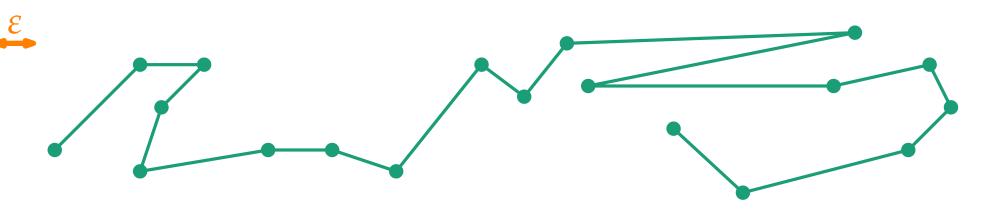
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distance measure for comparing two curves

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Typical distance measures d_X :



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distance measure for comparing two curves

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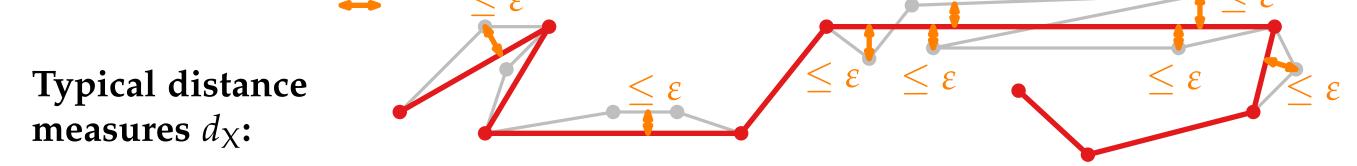
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Given: \blacksquare polyline P as a sequence of n points in the plane

distance threshold ε

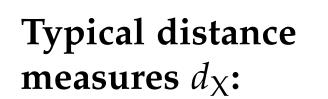
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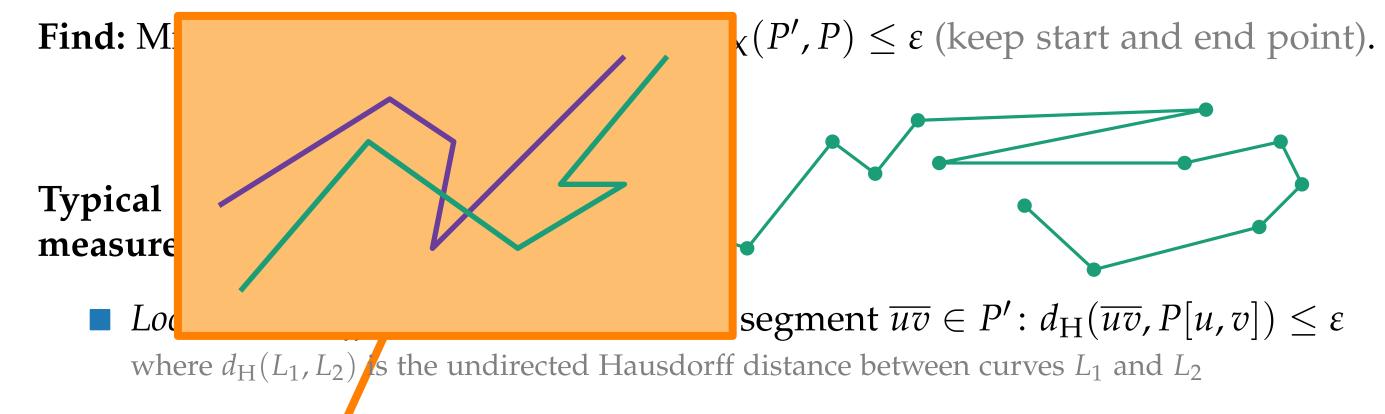
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- Local Hausdorff distance: for each line segment $\overline{uv} \in P' : d_H(\overline{uv}, P[u, v]) \le \varepsilon$ where $d_H(L_1, L_2)$ is the undirected Hausdorff distance between curves L_1 and L_2
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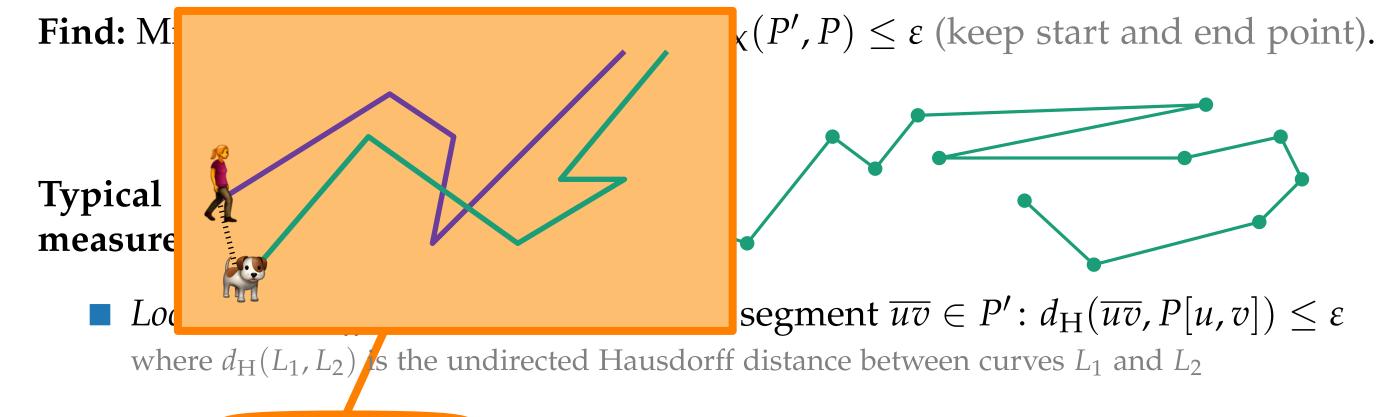
distance threshold ε



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Given: \blacksquare polyline P as a sequence of n points in the plane

distance threshold ε

Find: M. $(P',P) \leq \varepsilon \text{ (keep start and end point)}.$ Typical measure $\overline{uv} \in P' : d_{\mathbf{H}}(\overline{uv},P[u,v]) \leq \varepsilon$ where $d_{\mathbf{H}}(L_1,L_2)$ is the undirected Hausdorff distance between curves L_1 and L_2

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distance threshold ε

Typical measure $\overline{uv} \in P' \colon d_{\mathbf{H}}(\overline{uv}, P[u, v]) \leq \varepsilon$ where $d_{\mathbf{H}}(L_1, L_2)$ is the undirected Hausdorff distance between curves L_1 and L_2

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distance threshold ε

Find: M

Typical measure

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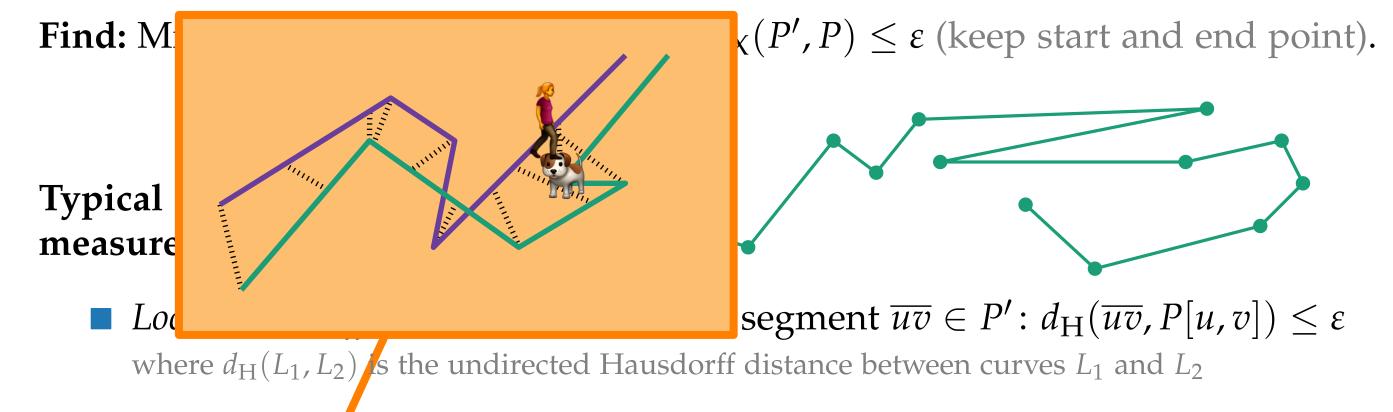
distance threshold ε

Find: M. $(P',P) \leq \varepsilon \text{ (keep start and end point)}.$ Typical measure $\overline{uv} \in P' \colon d_{\mathbf{H}}(\overline{uv},P[u,v]) \leq \varepsilon$ where $d_{\mathbf{H}}(L_1,L_2)$ is the undirected Hausdorff distance between curves L_1 and L_2

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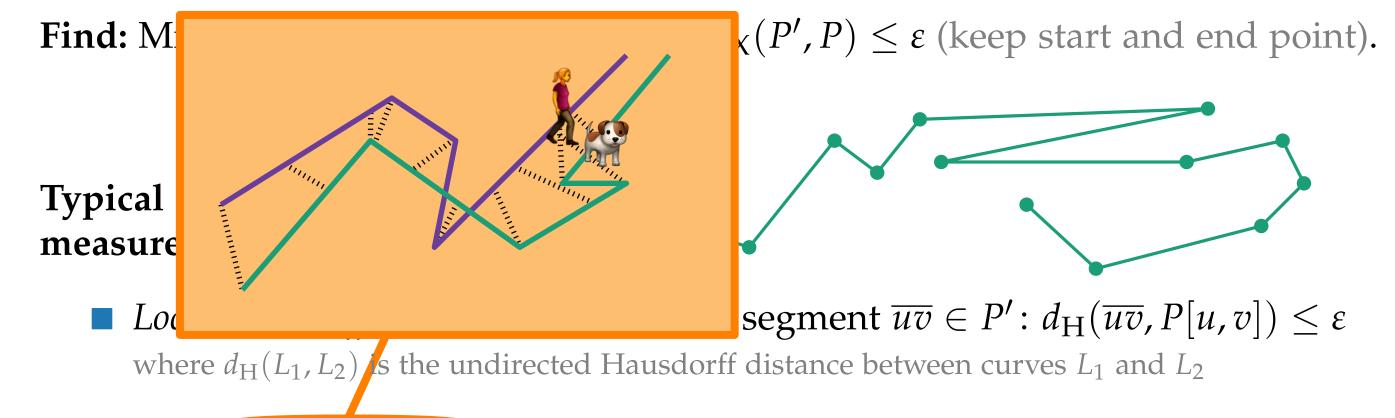
distance threshold ε



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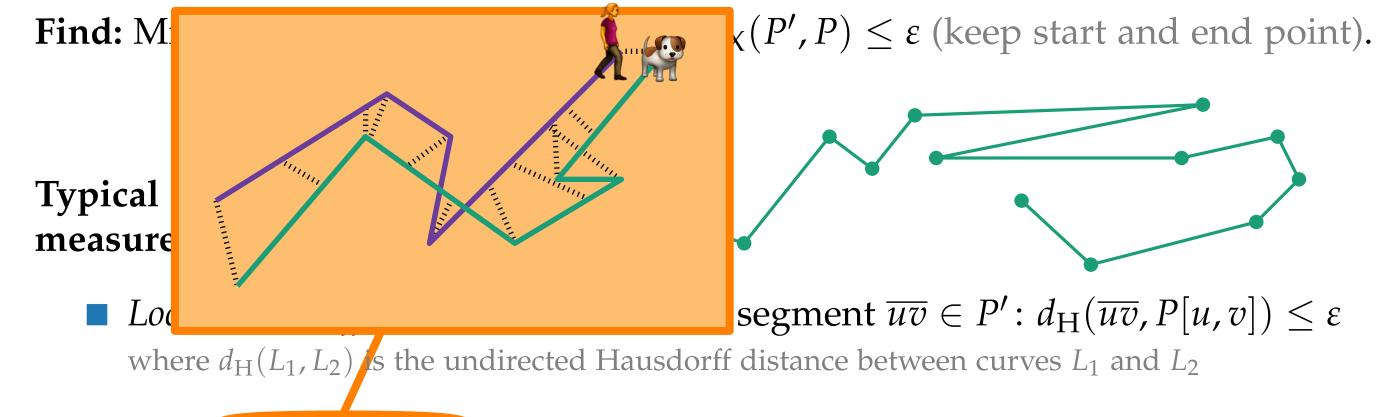
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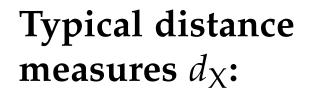


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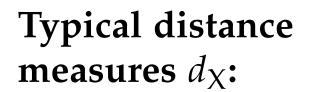


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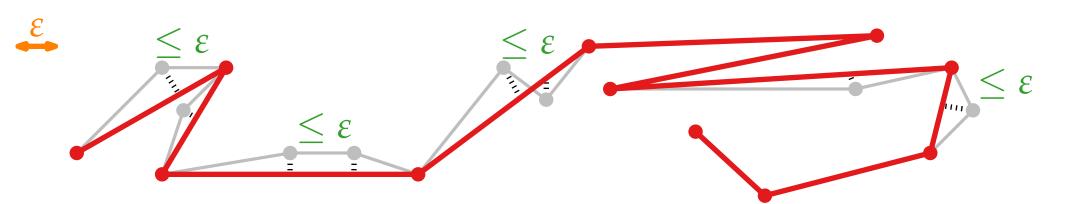
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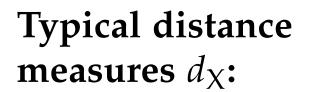


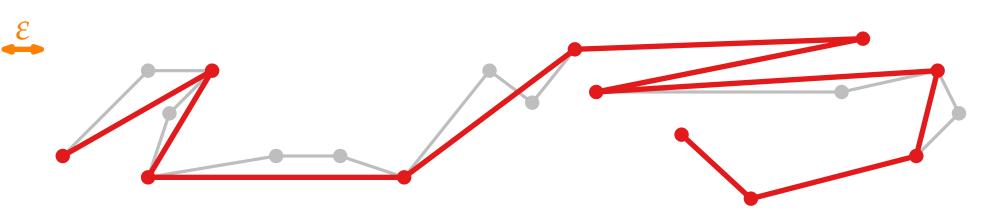
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Related Work & Contribution

Running time for finding an optimal polyline simplification ...

Related Work & Contribution

(minimum size)

Running time for finding an optimal polyline simplification ...

(minimum size)

Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance:

(minimum size)

Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance:

 $O(n^3)$ [Imai, Iri '88]

Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance:

- O(n³) [Imai, Iri '88]
 ↓
 O(n² log n) [Melkman, O'Rourke '88]

(minimum size)

Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance:

- $O(n^3)$ [Imai, Iri '88]
 - ****
- $O(n^2 \log n)$ [Melkman, O'Rourke '88]
 - 1
- $O(n^2)$ time [Chan, Chin '96]



Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance: ... under the local Fréchet distance:

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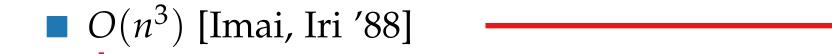
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(minimum size)

Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance:

... under the local Fréchet distance:



• $O(n^3)$ [Godau '91]

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Algorithmica (2005) 42: 203–219 DOI: 10.1007/s00453-005-1165-y

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Near-Linear Time Approximation Algorithms for Curve Simplification¹

Pankaj K. Agarwal,² Sariel Har-Peled,³ Nabil H. Mustafa,² and Yusu Wang²

5. Conclusions. In this paper we presented near-linear approximation algorithms for curve simplification under the Hausdorff and Fréchet error measures. We presented the first efficient approximation algorithm for Fréchet simplifications of a curve in dimension higher than two. Our experimental results demonstrate that our algorithms are efficient.

We conclude by mentioning a few open problems:

- (i) Does there exist a near-linear algorithm for computing an ε -simplification of size at most $c\kappa_M(\varepsilon, P)$ for a polygonal curve P, where c > 1 is a constant?
- (ii) Is it possible to compute the optimal ε -simplification under the Hausdorff error measure in near-linear time, or under the Fréchet error measure in subcubic time?
- (iii) Is there any provably efficient exact/approximation algorithm for curve simplification in \mathbb{R}^2 that returns a simple curve if the input curve is simple.

an, O'Rourke '88]

Chin '96]

2005



Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance:

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Algorithmica (2005) 42: 203–219 DOI: 10.1007/s00453-005-1165-v

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Polyline Simplification has Cubic Complexity

Karl Bringmann

Max Planck Institute for Informatics, Saarland Informatics Campus, Saarbrücken, Germany kbringma@mpi-inf.mpg.de

Bhaskar Ray Chaudhury

Max Planck Institute for Informatics, Saarland Informatics Campus, Saarbrücken, Germany Graduate School of Computer Science Saarbrücken, Saarland Informatics Campus, Germany braycha@mpi-inf.mpg.de

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Gill Barequet and Yusu Wang; Article No. 18; pp. 18:1–18:16

Leibniz International Proceedings in Informatics

LIPICS Schloss Dagstuhl – Leibniz-Zentrum für Informatik, Dagstuhl Publishing, Germany

The classic $\hat{\mathcal{O}}(n^3)^1$ time algorithm by Imai and Iri [18] was designed for Local-Hausdorff simplification. By changing the distance computation in this algorithm for the Fréchet distance, one can obtain an $\hat{\mathcal{O}}(n^3)$ -time algorithm for Local-Fréchet [15]. There are improvements for Local-Hausdorff simplification in small dimension d [19, 8, 6]; the fastest running times are $2^{O(d)}n^2$ for L_1 -norm, $\hat{\mathcal{O}}(n^2)$ for L_{∞} -norm, and $\hat{\mathcal{O}}(n^{3-\Omega(1/d)})$ for L_2 -norm [6].

 $O(n^3)$ [Godau '91]

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2005 2019

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Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance:

... under the local Fréchet distance:



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Bhaskar Ray Chaudhury

Max Planck Institute for Informatics, Saarland Informatics Campus, Saarbrücken, Germany Graduate School of Computer Science Saarbrücken, Saarland Informatics Campus, Germany braycha@mpi-inf.mpg.de

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Journal of Computational Geometry

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ON OPTIMAL POLYLINE SIMPLIFICATION USING THE HAUSDORFF AND FRÉCHET DISTANCE*

Marc van Kreveld, Maarten Löffler, and Lionov Wiratma

ABSTRACT. We revisit the classical polygonal line simplification problem and study it using the Hausdorff distance and Fréchet distance. Interestingly, no previous authors studied line simplification under these measures in its pure form, namely: for a given $\varepsilon > 0$, choose a minimum size subsequence of the vertices of the input such that the Hausdorff or Fréchet distance between the input and output polylines is at most ε .

Table 1: Algorithmic results.

	Douglas-Peucker		Optimal
Hausdorff distance	$O(n\log n)$ [19]	$O(n^2)$ [10]	NP-hard (this paper)
Fréchet distance	$O(n^2)$ (easy)	$O(n^3)$ [17]	$O(kn^5)$ (this paper)
	. 1 11 1	1 1	0.1 1 10 1 1 1

n: vertices in the input polyline; k: output complexity of the simplified polyline

2005 2019 2020

(minimum size)

Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance:



- $O(n^2 \log n)$ [Melkman, O'Rourke '88]
- $O(n^2)$ time [Chan, Chin '96]

our contribution

Related Work & Contribution

(minimum size)

Running time for finding an optimal polyline simplification ...

... under the local Hausdorff distance: ... under the local Fréchet distance:



- $O(n^2 \log n)$ [Melkman, O'Rourke '88] $O(n^2 \log n)$
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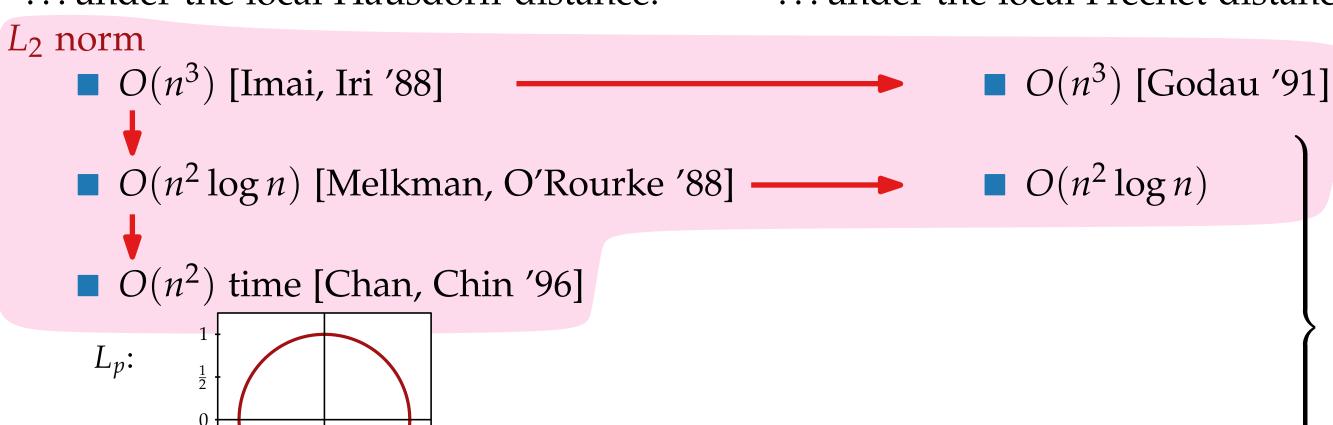
our contribution

Related Work & Contribution

(minimum size)

Running time for finding an optimal polyline simplification ...

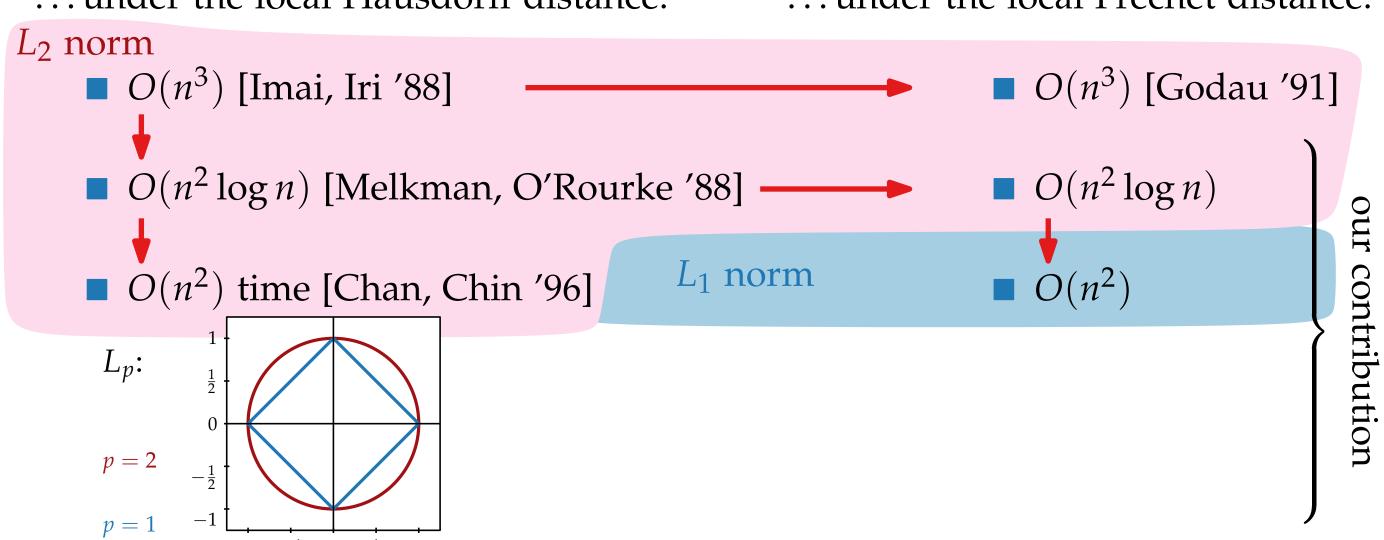
... under the local Hausdorff distance: ... under the local Fréchet distance:



(minimum size)

Running time for finding an optimal polyline simplification ...

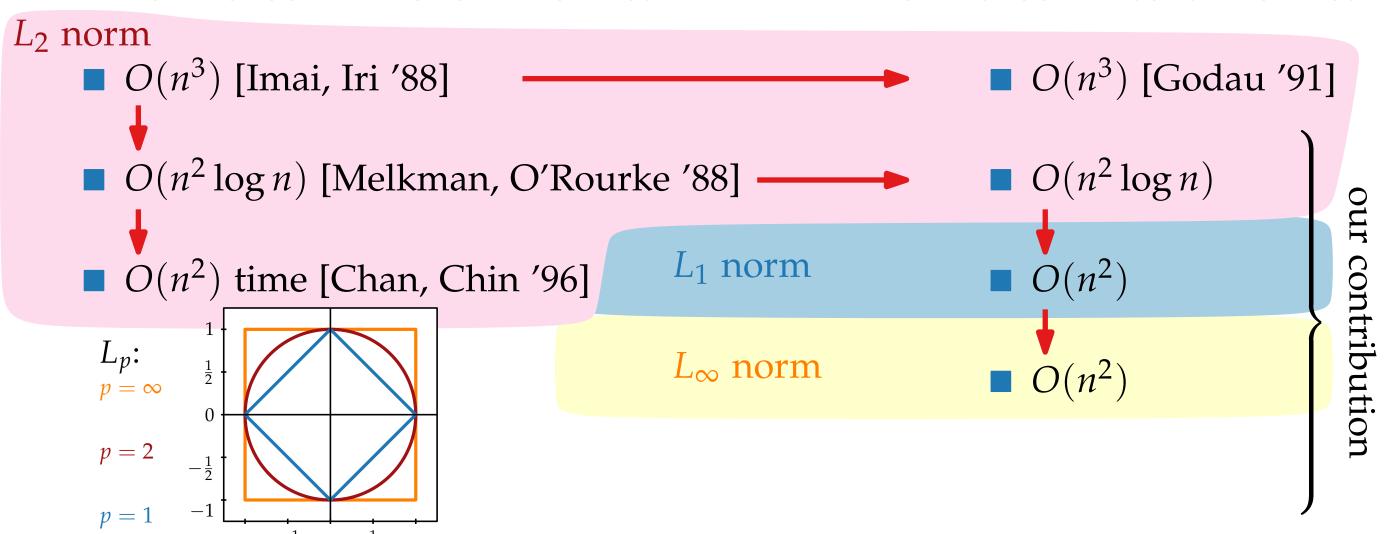
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(minimum size)

Running time for finding an optimal polyline simplification ...

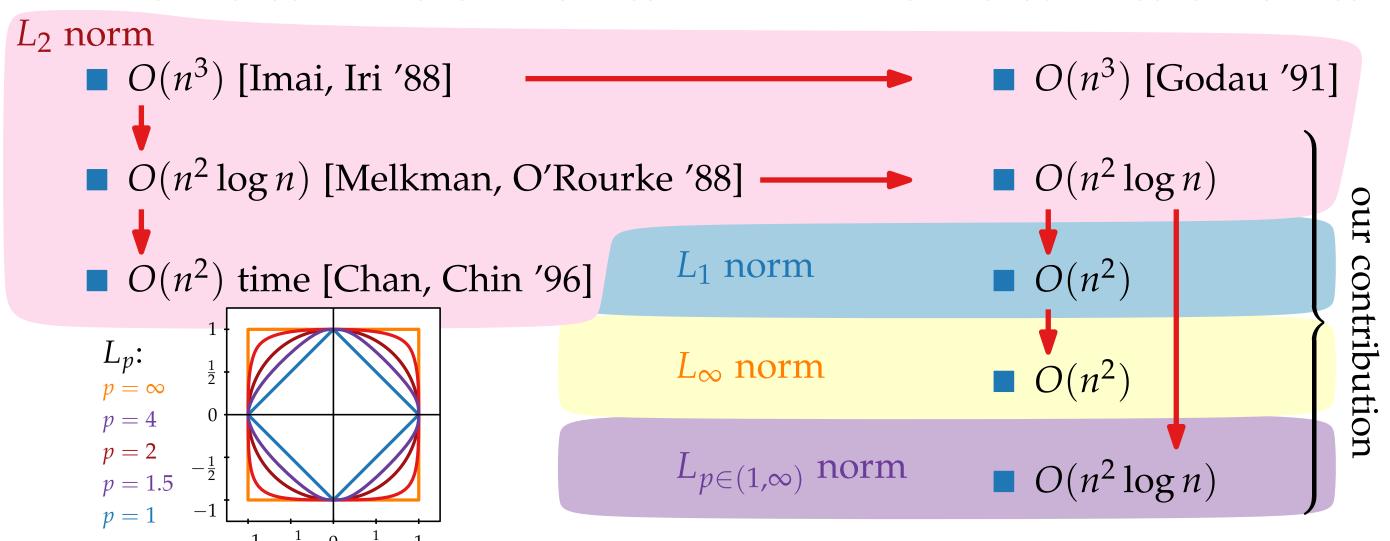
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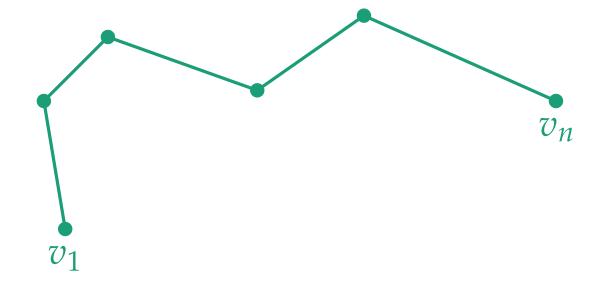
(minimum size)

Running time for finding an optimal polyline simplification ...

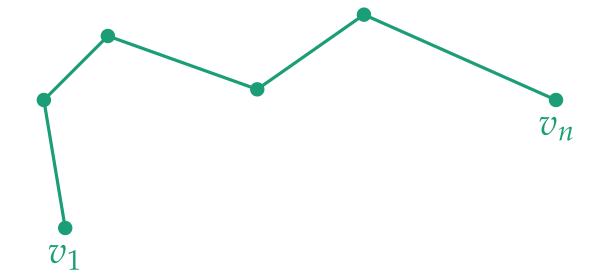
... under the local Hausdorff distance:



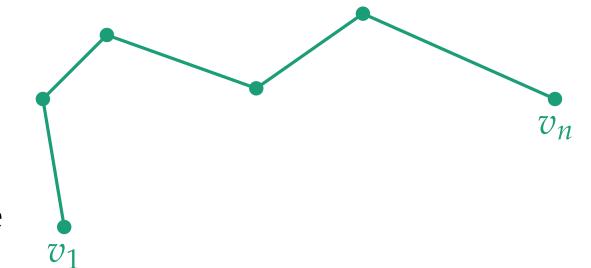
proceeds in two phases



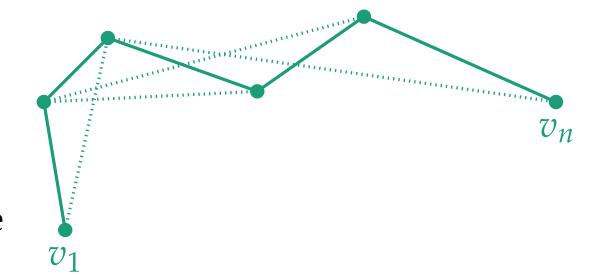
- proceeds in two phases
- First phase:



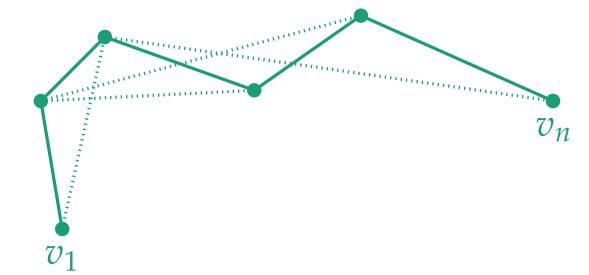
- proceeds in two phases
- First phase:
 - determine valid shortcuts brute-force

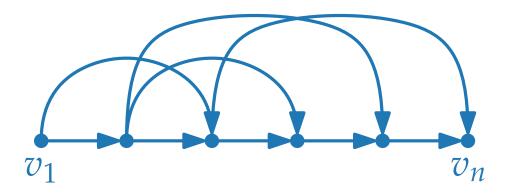


- proceeds in two phases
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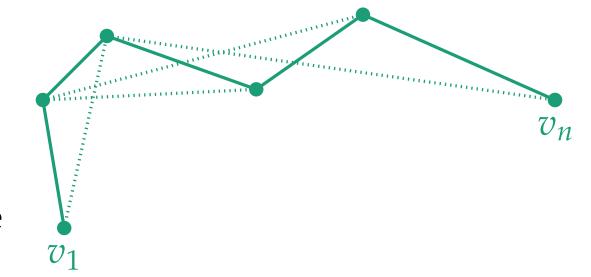


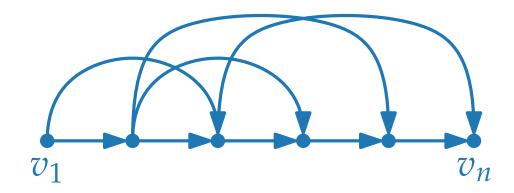
- proceeds in two phases
- First phase:
 - determine valid shortcuts brute-force
 - build shortcut graph



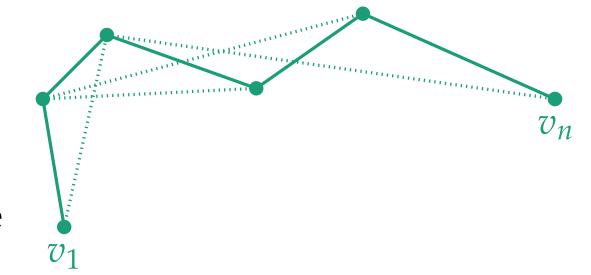


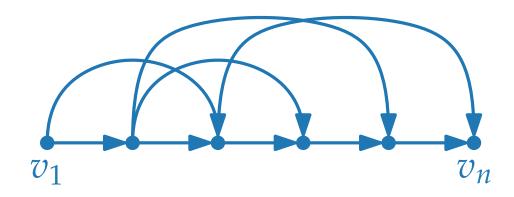
- proceeds in two phases
- First phase:
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 - build shortcut graph
- Second phase:



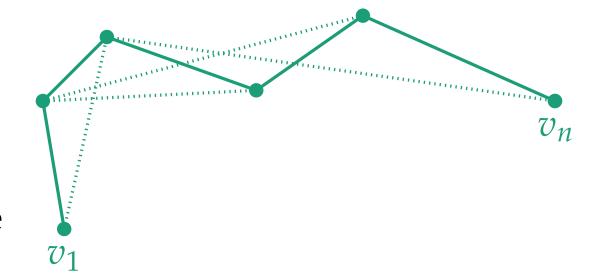


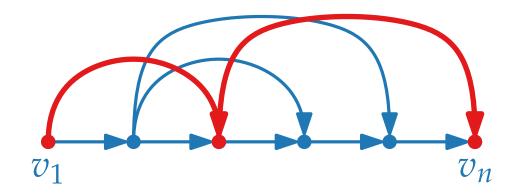
- proceeds in two phases
- First phase:
 - determine valid shortcuts brute-force
 - build shortcut graph
- Second phase:
 - find shortest path in shortcut graph



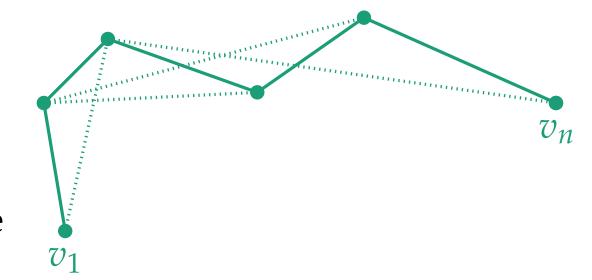


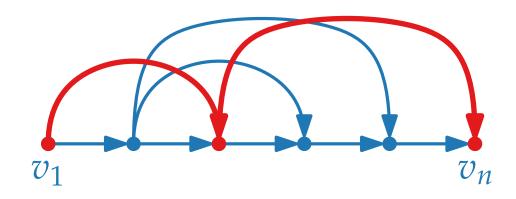
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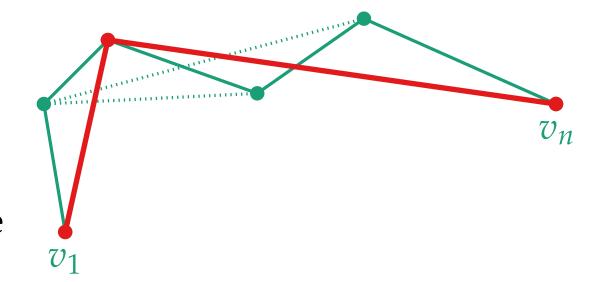


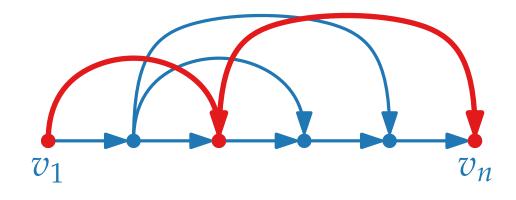
- proceeds in two phases
- First phase:
 - determine valid shortcuts brute-force
 - build shortcut graph
- Second phase:
 - find shortest path in shortcut graph
 - return optimal simplification



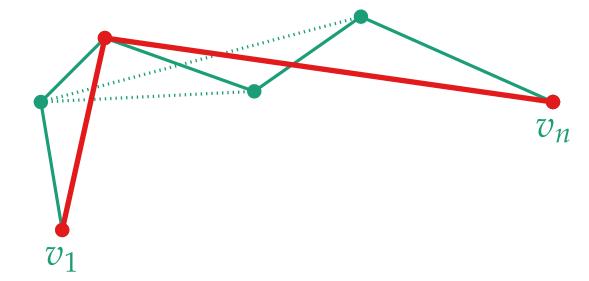


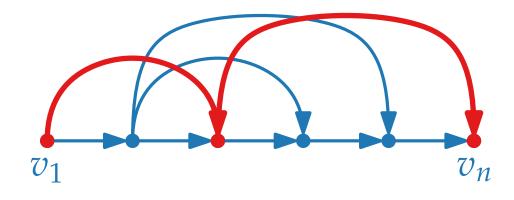
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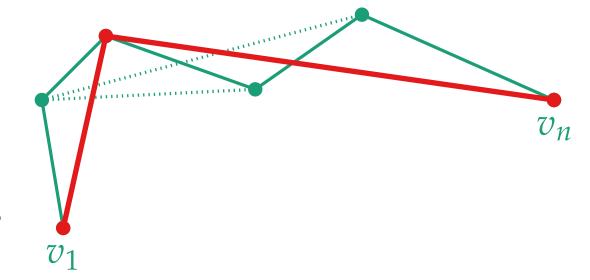


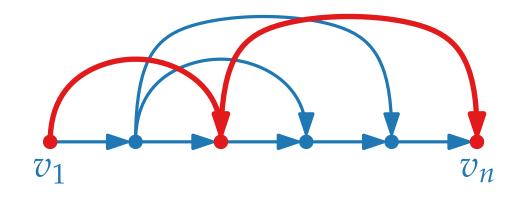
- proceeds in two phases
- First phase: $O(n^3)$
 - determine valid shortcuts brute-force
 - build shortcut graph
- Second phase:
 - find shortest path in shortcut graph
 - return optimal simplification



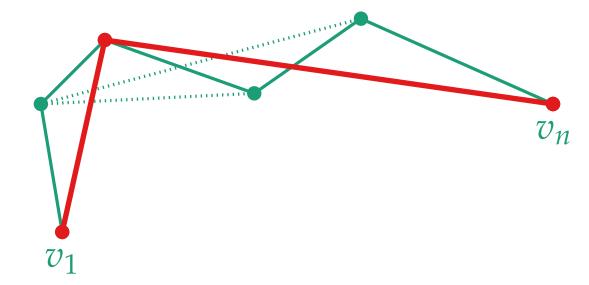


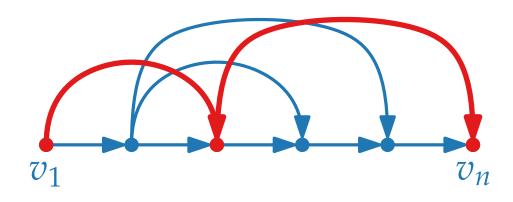
- proceeds in two phases
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 - determine valid shortcuts brute-force
 - build shortcut graph
- Second phase: $O(n^2)$
 - find shortest path in shortcut graph
 - return optimal simplification





- proceeds in two phases
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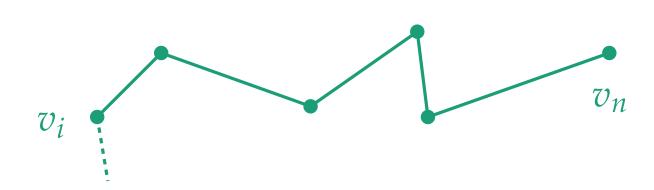


 \Rightarrow total running time $O(n^3)$

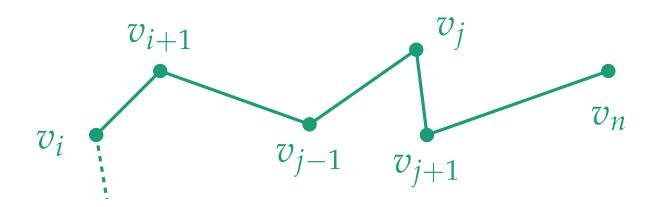
■ Starting at each vertex v_i ($i \in \{1, ..., n\}$),



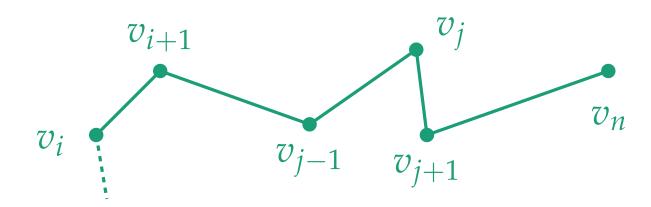
- Starting at each vertex v_i ($i \in \{1, ..., n\}$),
 - traverse each subsequent vertex v_j ($j \in \{i+1,...,n\}$)



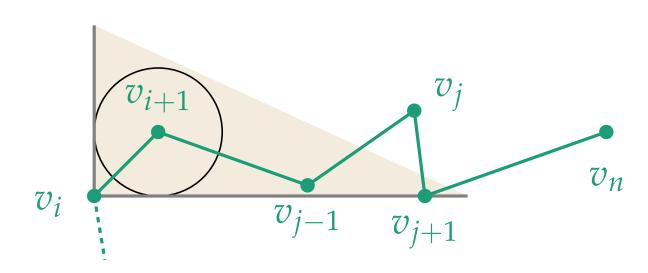
- Starting at each vertex v_i ($i \in \{1, ..., n\}$),
 - traverse each subsequent vertex v_j $(j \in \{i+1,...,n\})$



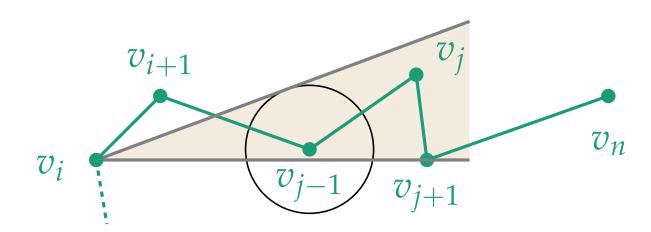
- Starting at each vertex v_i ($i \in \{1, ..., n\}$),
 - traverse each subsequent vertex v_j $(j \in \{i+1,...,n\})$
 - while maintaining a *cone*



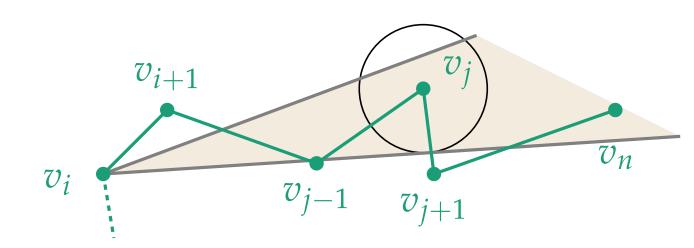
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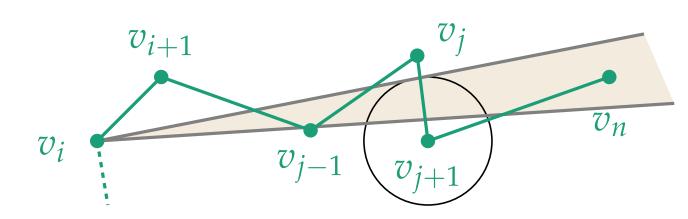
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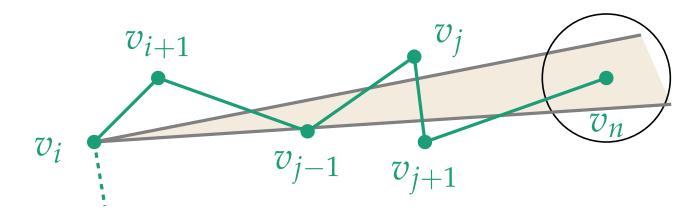
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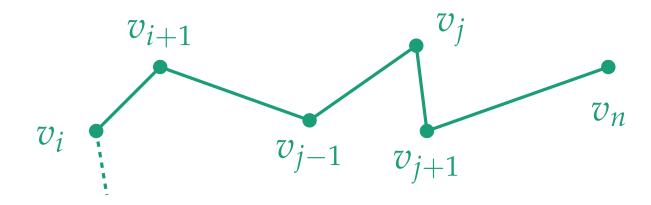
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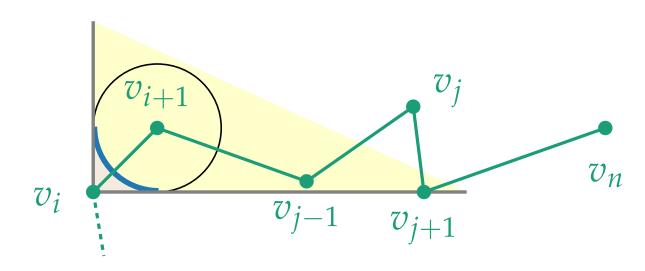
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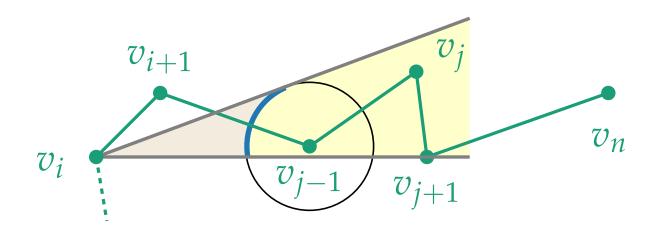
- Starting at each vertex v_i ($i \in \{1, ..., n\}$),
 - traverse each subsequent vertex v_j $(j \in \{i+1,...,n\})$
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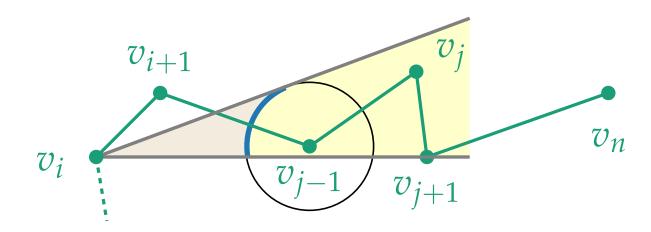
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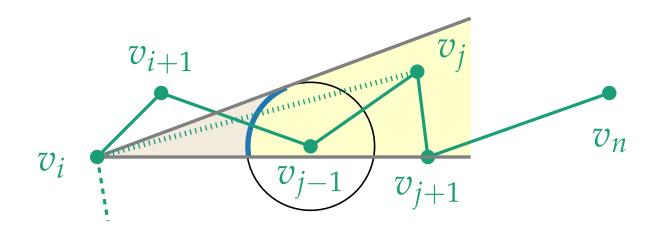
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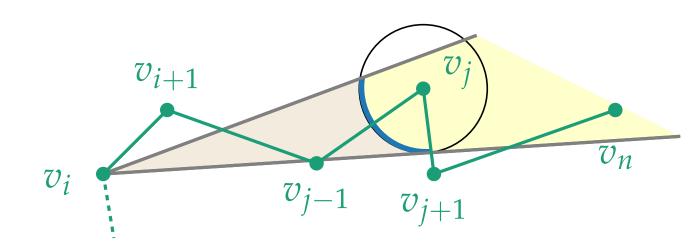
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- $\overline{v_iv_j}$ is a valid shortcut $\Leftrightarrow v_j$ lies in the cone and "behind" the wave front



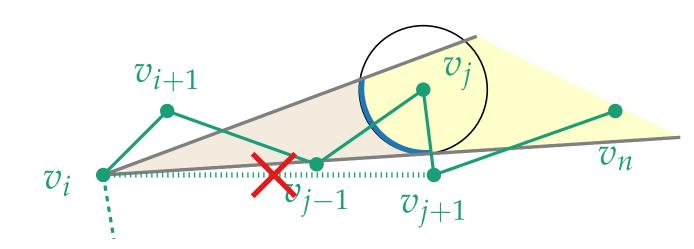
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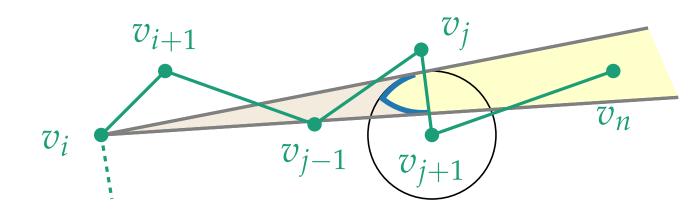
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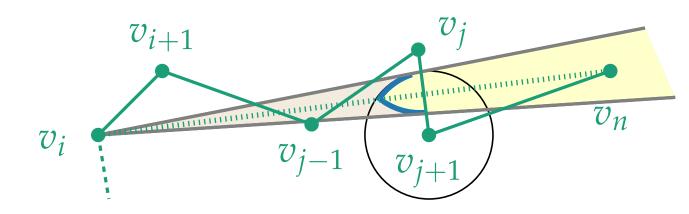
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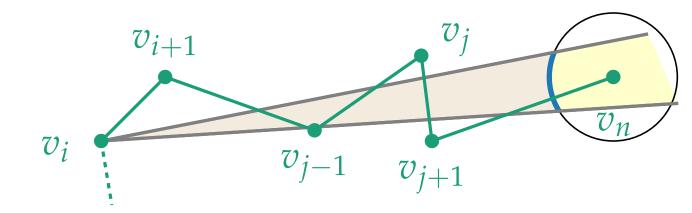
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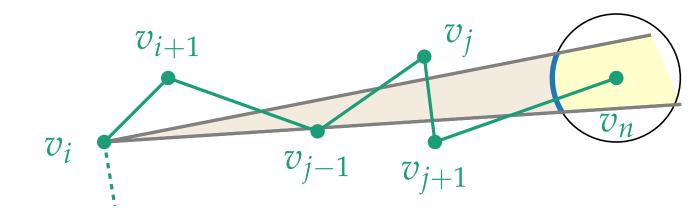
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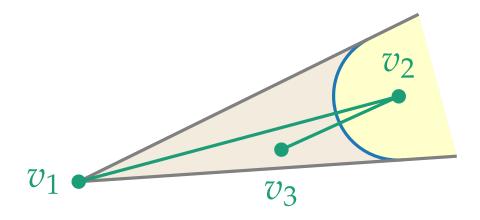
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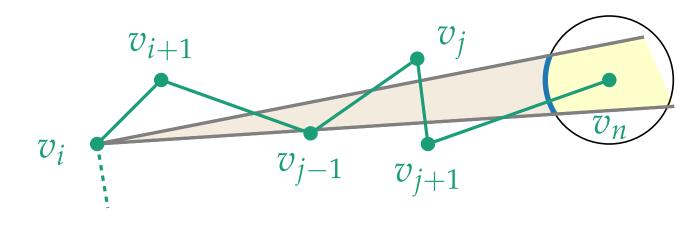


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- Why is the wave front used at all?

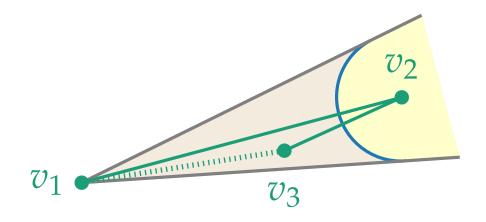


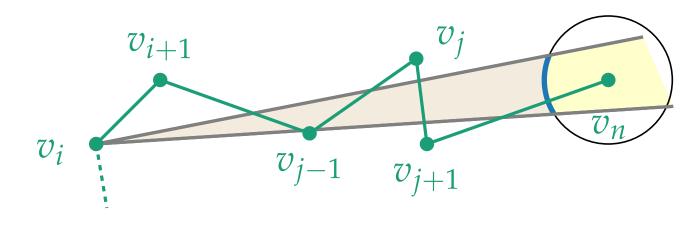
- Starting at each vertex v_i ($i \in \{1, ..., n\}$),
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- Why is the wave front used at all?



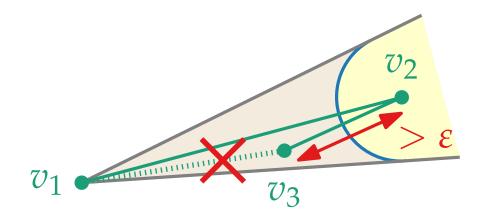


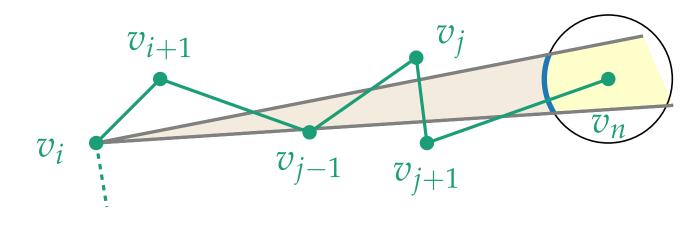
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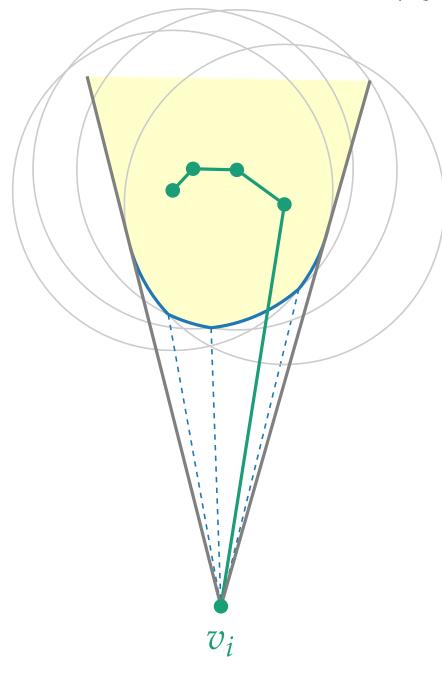
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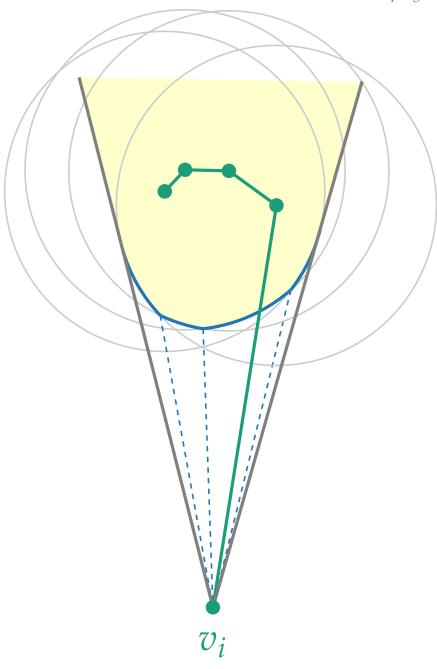
How complex can the wave front be?

 \blacksquare each vertex contributes ≤ 1 arc $\Rightarrow O(n)$ arcs



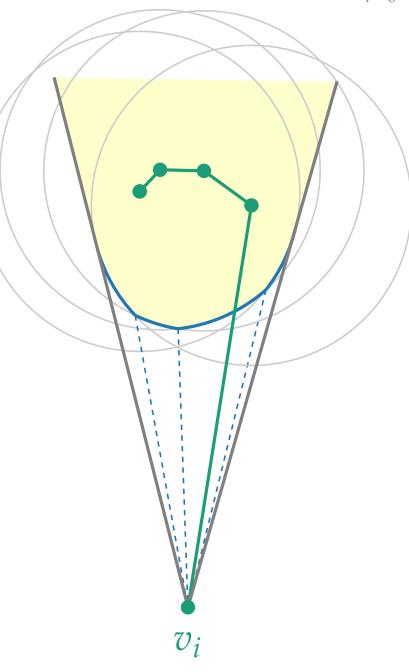
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- \blacksquare each vertex contributes ≤ 1 arc $\Rightarrow O(n)$ arcs
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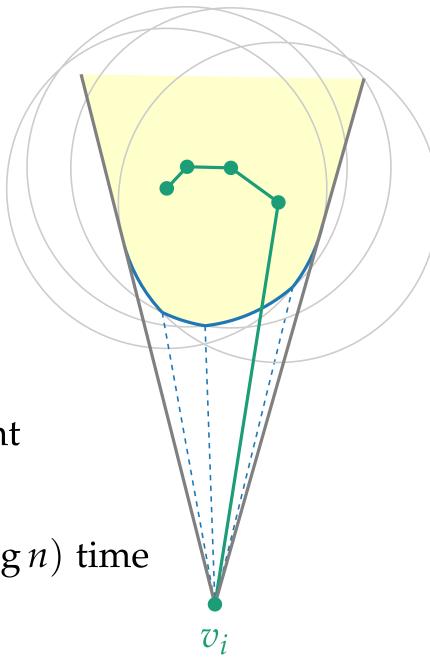
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- ⇒ stored in a balanced search tree
 - finding the intersection between the wave front and a ray emanating at v_i takes $O(\log n)$ time



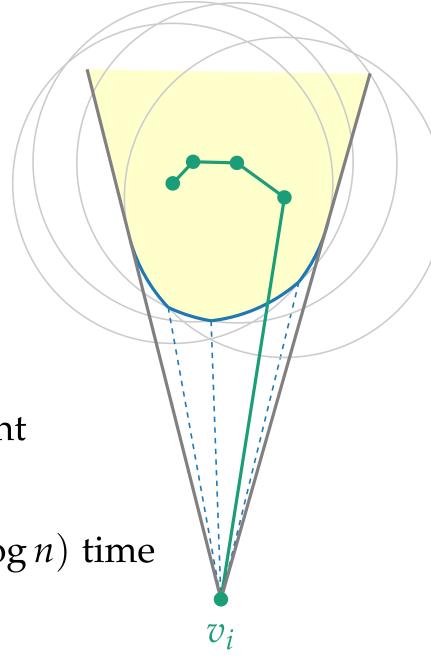
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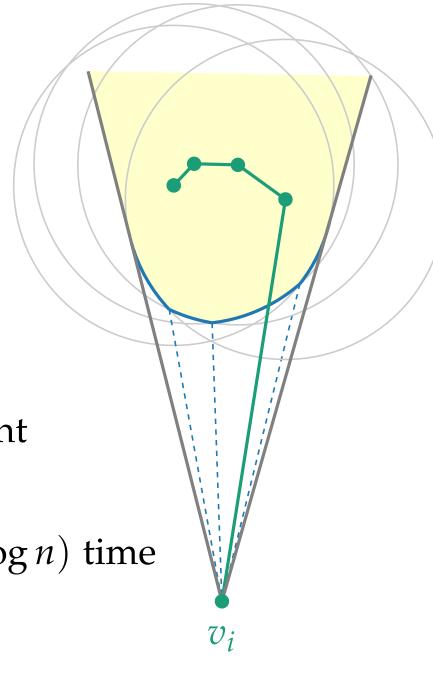


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 \Rightarrow total running time $O(n^2 \log n)$

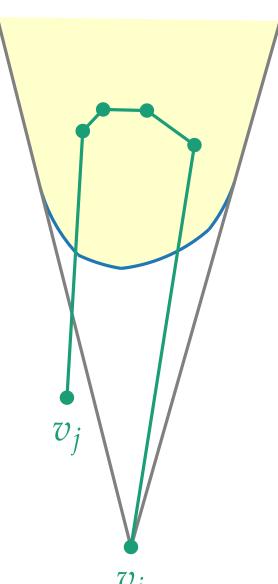


■ In contrast to the Hausdorff distance, the order of the vertices along a shortcut segment matters for the Fréchet distance.

- In contrast to the Hausdorff distance, the order of the vertices along a short-cut segment matters for the Fréchet distance.
- \Rightarrow narrow the cone s.t. the ε -circle around v_j contains the whole wave front.

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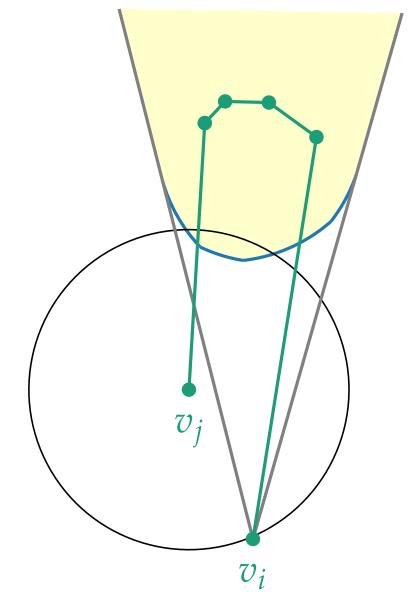
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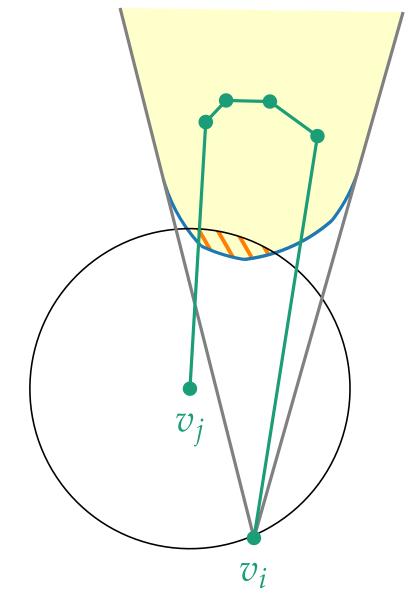
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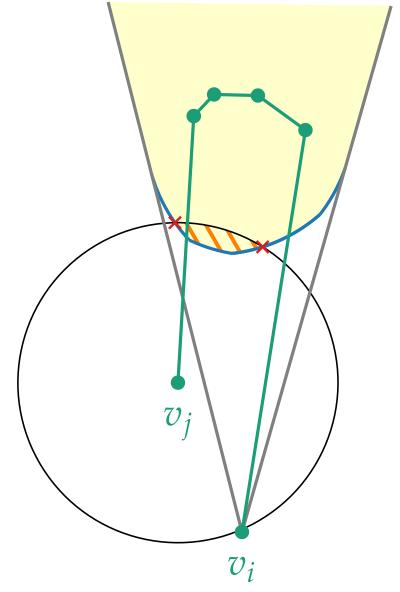
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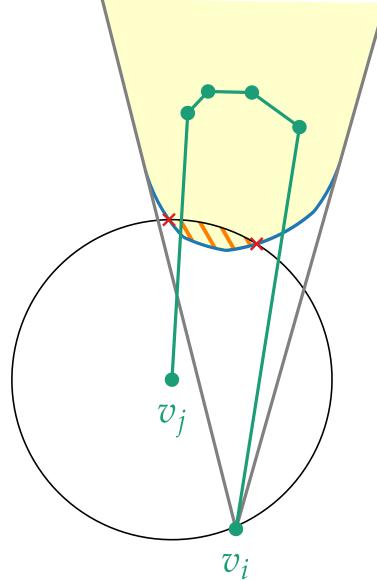
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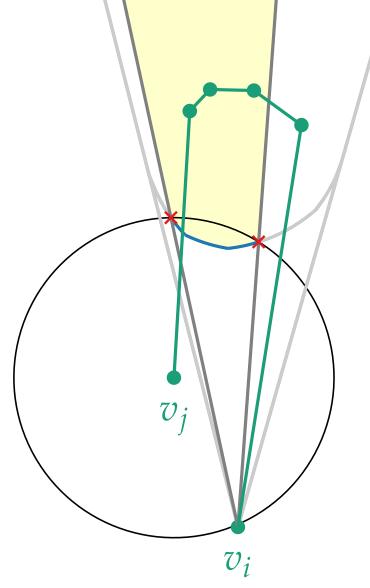


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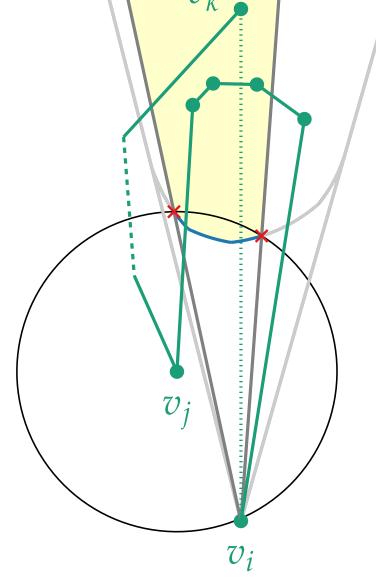


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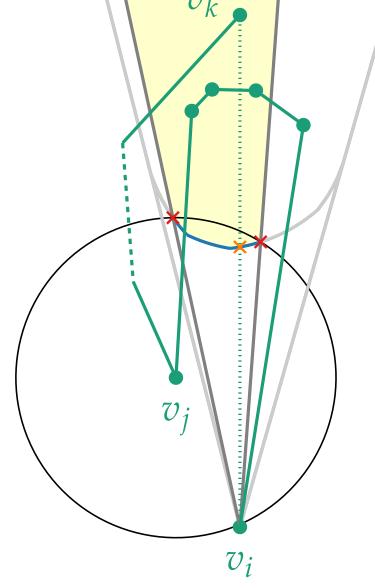


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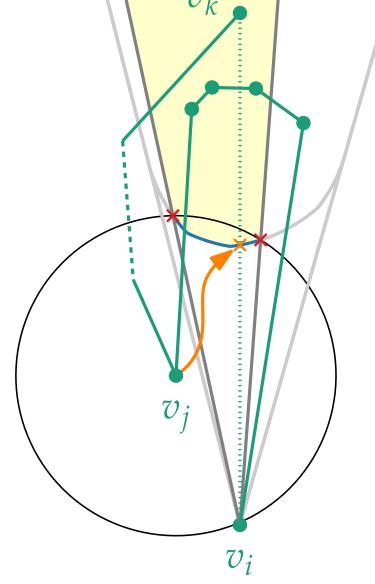
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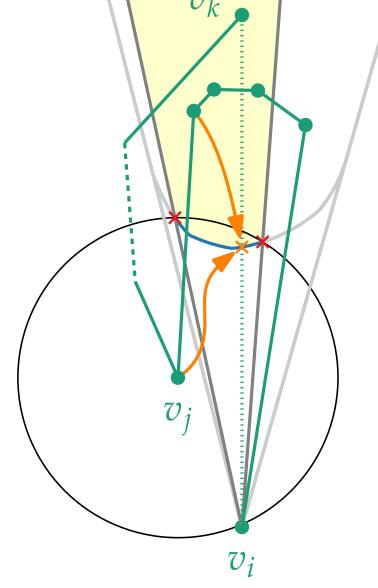
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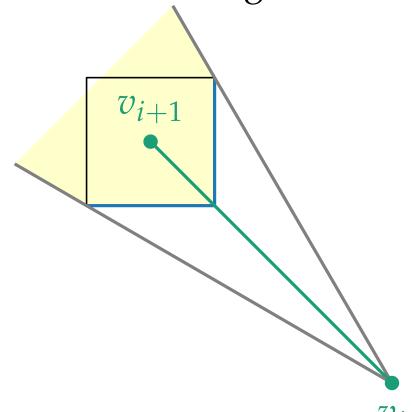
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Theorem: Polyline simplification under the local Fréchet distance can be done in $O(n^2)$ time in the L_1 and L_{∞} norm.

Using techniques from the algorithm by Melkman and O'Rourke, we have shown how to find an optimal simplification of a polyline under the local Fréchet distance in $O(n^2 \log n)$ (instead of $O(n^3)$) time in the L_2 norm.

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