

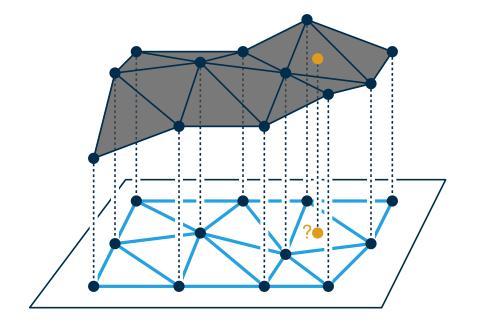
Computational Geometry Height Interpolation & Delaunay Triangulation

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Height Interpolation

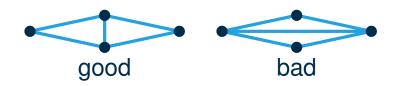
Sample Points Of Measuring The Height Of A Terrain

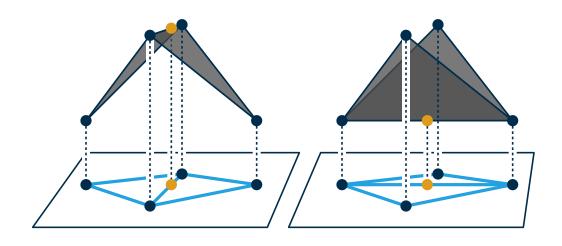
- What is the altitude of a point that was not measured?
- triangulate the points in the plane
- $lue{}$ ightharpoonup also triangulates the measured 3d points
- deduce the altitude based on the triangulation



What Makes A Good Triangulation?

- different triangulations yield different results
- goal: avoid thin triangles







Good And Bad Triangulations

Angle Vector

- consider triangulation \mathcal{T} of a point set with m triangles
- interior angles of triangles sorted increasingly: $\alpha_1, \ldots, \alpha_{3m}$
- lacksquare angle vector: $lpha(\mathcal{T})=(lpha_1,\ldots,lpha_{3m})$
- order the angle vectors lexicographically $(\alpha(\mathcal{T}) > \alpha(\mathcal{T}') \Leftrightarrow \exists i \in \{1, ..., 3m\}: a_i > a'_i \text{ und } \forall j < i: a_j = a'_i)$

Optimal Triangulation

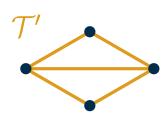
■ triangulation is optimal, if it is maximal (wrt this order) $(\mathcal{T} \text{ optimal} \Leftrightarrow \mathcal{T} \geq \mathcal{T}' \text{ for all triangulations } \mathcal{T}')$

Questions For Today

- How can we recognize an optimal triangulation?
- Can we compute an optimal triangulation?
- Is the optimal triangulation unique?



```
\alpha(\mathcal{T}) = (60^{\circ}, 60^{\circ}, 60^{\circ}, 60^{\circ}, 60^{\circ}, 60^{\circ})
\alpha(\mathcal{T}') = (30^{\circ}, 30^{\circ}, 30^{\circ}, 30^{\circ}, 120^{\circ}, 120^{\circ})
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Forbidden Edges

Idea

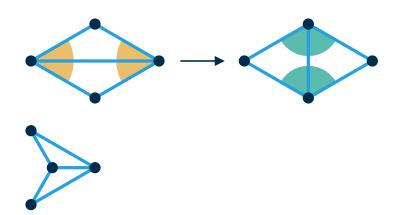
- iteratively improve triangulation by local improvements
- yields a local optimum
- hope: it is also a global optimum

Edge Flip

- remove an (inner) edge
- insert a new diagonal

Observations

- is not feasible for every edge
- we are interested in the four angles at the flipped edge
- we call an edge forbidden if flipping increases the smallest of those angles
- let e in \mathcal{T} be a forbidden edge and let $\mathcal{T}' = \mathsf{flip}(\mathcal{T}, e)$; then: $\alpha(\mathcal{T}') > \alpha(\mathcal{T})$



Does this terminate?



Thales's Theorem

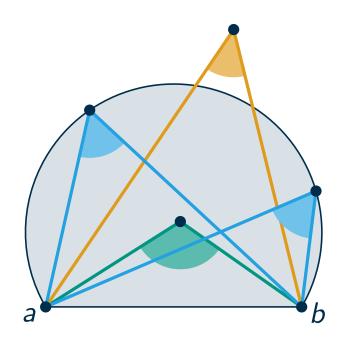
Thales's Theorem

The line segments from a point on a circle to the endpoints of a diameter form a right angle.



Generalization

- fix an arbitrary chord of the circle (endpoints: a and b)
- also fix one of the two circular segment
- the line segments from every point on the circular arc to a and b form the same angle
- for points in the interior, the angle is bigger
- for points in the exterior, the angle is smaller (on the same side of ab)





Which Edges Are Forbidden?

Lemma

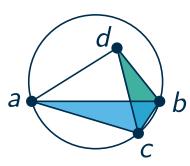
Let $\triangle abc$ and $\triangle abd$ be two triangles such that a, b, c, d are in convex position. The circumcircle of $\triangle abc$ contains d if and only if ab is forbidden.

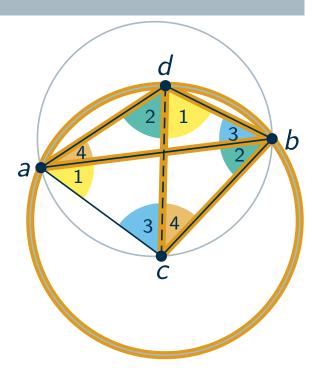
Proof: d in circumcircle of $\triangle abc \Rightarrow ab$ forbidden

- note: the circumcircle of $\triangle abd$ then contains c
- consider bijection between angles at a and b, and "opposite" angles at c and d of the flipped edge
- claim: each angle at ab is smaller than corresponding angle at cd
- follows from Thales's theorem, when looking at the proper triangles
 - \Rightarrow minimum angle at cd is bigger $\Rightarrow ab$ is forbidden

Other Direction

similar argument by looking at the minimum angle







Forbidden Edges And Empty Circles

Theorem

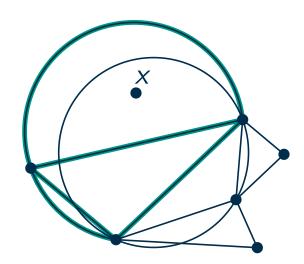
A triangulation has a forbidden edge if and only if the circumcircle of a face contains a vertex.

Proof

- lemma: forbidden edge ⇒ circumcircle contains vertex
- todo: circumcircle contains vertex ⇒ forbidden edge
- consider the circumcircle of a triangle containing x
- lemma: x is adjacent \Rightarrow forbidden edge
- problem: non-adjacent vertex x
 - consider triangle closer to x
 - circumcircle still contains x
 - iterate \rightarrow at some point we should have x as neighbor
- cleaner argument: consider extreme situation, show contradiction

Lemma

Let $\triangle abc$ and $\triangle abd$ be two triangles such that a, b, c, d are in convex position. The circumcircle of $\triangle abc$ contains d if and only if ab is forbidden.





Forbidden Edges And Empty Circles

Theorem

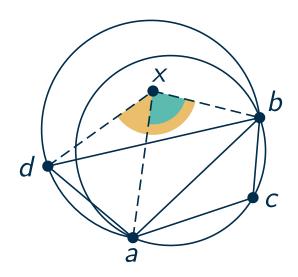
A triangulation has a forbidden edge if and only if the circumcircle of a face contains a vertex.

Proof

- lemma: forbidden edge ⇒ circumcircle contains vertex
- todo: circumcircle contains vertex ⇒ forbidden edge
- consider the circumcircle of $\triangle abc$ containing x such that $\angle axb$ is maximal (without loss of generality: x lies next to ab)
- consider the other triangle $\triangle abd$ with side ab
- lacktriangle circumcircle of $\triangle abd$ also contains x
- $\angle dxb$ is bigger than $\angle axb$ \Rightarrow contradiction $(\text{or } \angle axd)$

Lemma

Let $\triangle abc$ and $\triangle abd$ be two triangles such that a, b, c, d are in convex position. The circumcircle of $\triangle abc$ contains d if and only if ab is forbidden.





Locally Optimal Triangulations

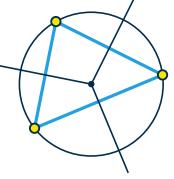
Equivalent:

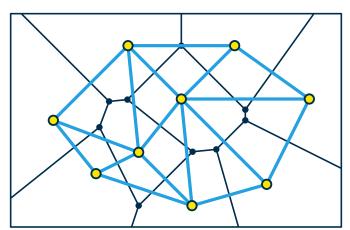
- no forbidden edges
- locally optimal

the circumcircle of each triangle is empty

Implications For Locally Optimal Triangulations

- for every triangle, the center of the circumcircle is a Voronoi vertex
- the triangle edges correspond to the Voronoi edges incident to the Voronoi vertex
 - ⇒ the triangulation is the dual graph of the Voronoi diagram





Conversely: Consider The Dual Of The Voronoi Diagram

- forms a triangulation (assumption: no four vertices lie on the same circle)
- circumcircle of each face is empty ⇒ locally optimal triangulation



Don't we need to show that there are no edge crossings?



Delaunay Triangulation

The dual graph of the Voronoi diagram is called **Delaunay triangulation**.

Just Seen

- the Delaunay triangulation is locally maximal
- lacktriangleright if $\mathcal T$ is locally maximal, then $\mathcal T$ is the Delaunay triangulation

Implications

- the locally maximal triangulation is unique (it is the Delaunay triangulation)
- the Delaunay triangulation is globally maximal
- it can be computed in $O(n \log n)$ time (e.g., using the beach-line algo)

Multiple Points On A Circle

- Voronoi vertex has higher degree
- dual is not a triangulation
- multiple triangulations possible

(more on this on the exercise sheet)



Wrap-Up

Seen Today

- the Delaunay triangulation has nice properties
 - lexicographically maximal angle vector
 - dual of the Voronoi diagram
- proof technique: local optimum unique ⇒ must be the global optimum

What Else Is There?

- the Delaunay triangulation has other nice properties (e.g., the MST is part of the triangulation)
- different optimization criteria: minimizing the total edge length is NP-hard



Exam Scheduling

Monday	Tuesday	Wednesday	Thursday	Friday	
28				1	
4				8	
11				15	August
18				22	
25				29	
1				5	
8				12	
15				19	September
22				26	
29				3	
6				10	
13				17	October
20				24	
27				31	



Help Us Improve

Evaluation

- survey open until 18:00
- link also in discord
- exercise sessions are evaluated separately



https://onlineumfrage.kit.edu/evasys/online.php?p=G4MUD

