

– Computational geometry –
From theory to practice,
From linear objects to curved objects

Monique Teillaud



Overall message

Synergy between

- implementation
- theory (mathematics/algorithmics)


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- implementation
 - theory (mathematics/algorithmics)
-
- no good software is possible
without a clean theoretical background
 - implementation is raising new good theoretical questions

Overall message

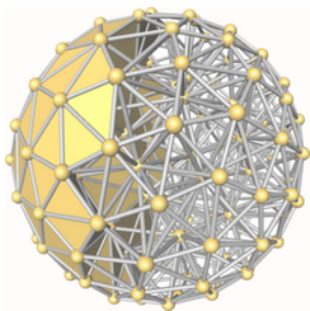
Synergy between

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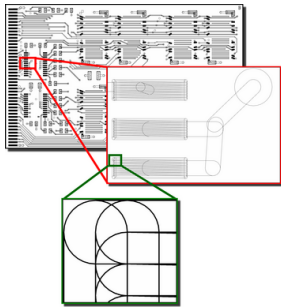
C++ concepts
mathematical concepts

can converge in 

Outline



I - Triangulations



II - Curved objects

Thanks to Pierre Alliez for the beautiful pictures.

III - Current and future work

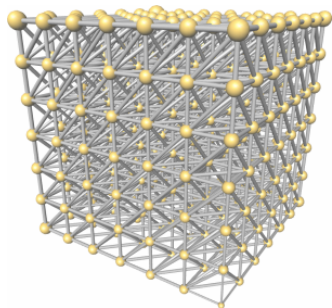
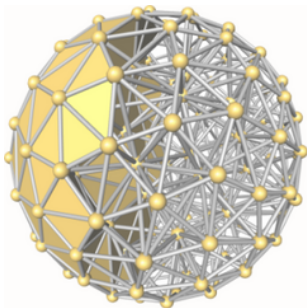
Outline

Overview of some of the **links of the chain** leading to **reliable** and largely **distributed** software:

- **mathematical** background
- **algorithmic** and combinatorial study
- **representation** of objects and structures
- **robustness** issues
- **design** choices
- efficient programming
- ...

Part I

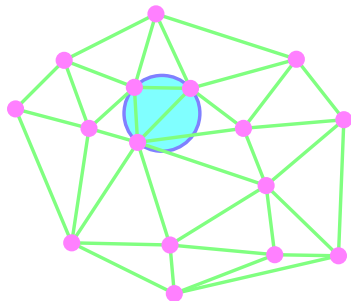
Triangulations



Triangulations

- mathematical background
- algorithmic and combinatorial study
- representation of objects and structures
- robustness issues
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Delaunay triangulation in \mathbb{R}^d



All balls circumscribing simplices are empty.

Well known properties

Size $O\left(n^{\lceil \frac{d}{2} \rceil}\right)$

(linear in \mathbb{R}^2 , worst-case quadratic in \mathbb{R}^3)

Randomized Incremental Algorithms

General Data Structure: the History graph.

Randomized Incremental Algorithms

General Data Structure: the History graph.

Case of Delaunay triangulations:

Fully dynamic algorithm

Optimal *expected* computation

$$O\left(n^{\lfloor \frac{d+1}{2} \rfloor}\right) \quad (d \geq 3)$$

$$O(n \log n) \quad (d = 2)$$



Bernhard Geiger

Randomized Incremental Algorithms

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Bernhard Geiger

Practical framework:

- Realistic analysis (no assumption on input data)
- Implemented algorithms (Pascal, then C, ...)

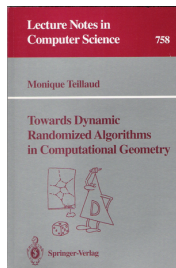
Randomized Incremental Algorithms General Data Structure: the History graph.

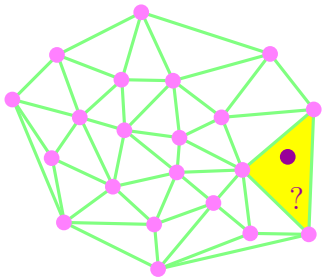
Boissonnat, Devillers,
T., Yvinec \leq '93
PhD Thesis '91

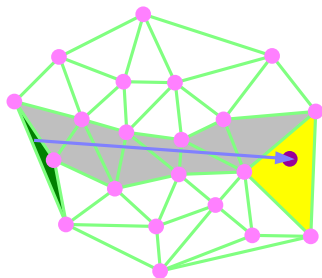
Case of Delaunay triangulations:
Devillers '02 better in practice

Practical framework:

- Realistic analysis (no assumption on input data)
- Implemented algorithms (Pascal, then C, then C++...)







2D:

worst-case $2n$ triangles

Delaunay, random pts $|pq|\sqrt{n}$

Devroye...

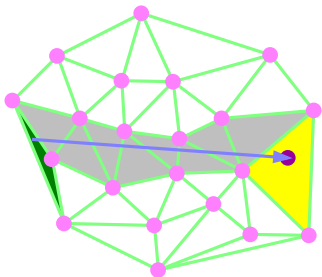
2 orient. tests per triangle

3D:

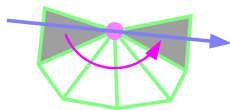
worst-case $O(n^2)$ tetrahedra

Delaunay, random pts?

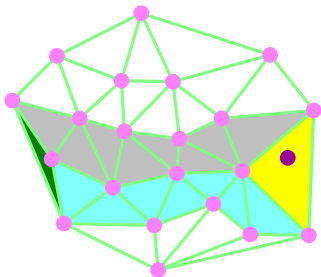
3 orient. tests per tetrahedron



Handling degeneracies:

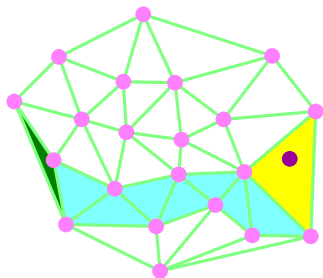


worse in 3D...



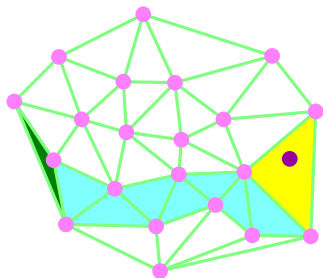
Visibility walk



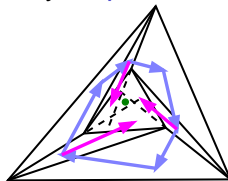


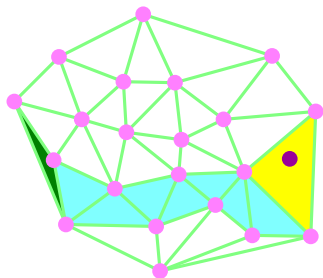
Delaunay 2D:
worst case $2n$
random points?
 ≤ 1.5 orient. tests per triangle

Delaunay 3D:
worst-case $O(n^2)$ tetrahedra
random points?
 ≤ 2 orient. tests per tetra.

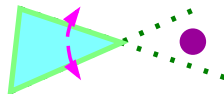


May loop for non Delaunay tr.





Stochastic walk



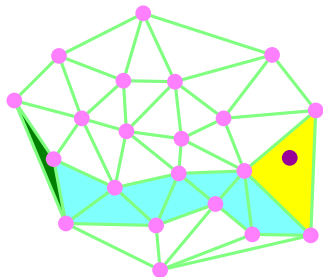
random choice

Always terminates

Average complexity

\leq exponential

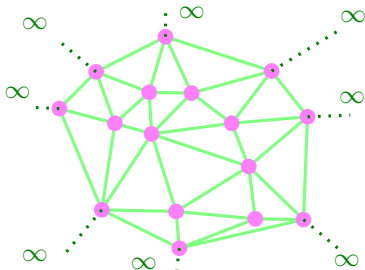
Exponential example



Easy to code, even in 3D
no degeneracies...

Efficient in practice

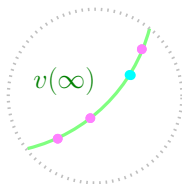
Combinatorial triangulation of the sphere



Devillers, T., Yvinec

Degenerate dimensions

geometric

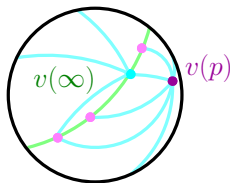
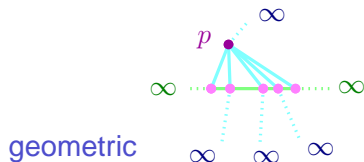


combinatorial

Increasing the dimension

T. EuroCG'99

Degenerate dimensions

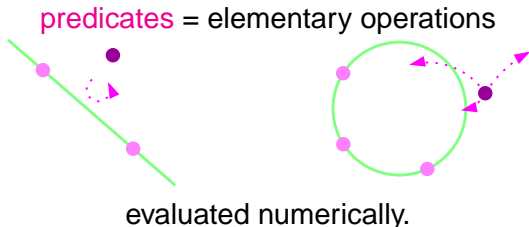


combinatorial

Increasing the dimension

T. EuroCG'99

Algorithms rely on



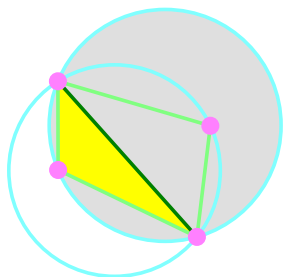
Typically, signs of determinants
(small degree polynomial expressions)

Exact Geometric Computing framework

Yap

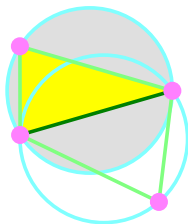
Filtered exact computations

Yap...Mehlhorn...Pion...



Delaunay triangulation depends on the **sign** of

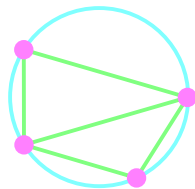
$$\begin{vmatrix} 1 & 1 & 1 & 1 \\ p_x & q_x & r_x & s_x \\ p_y & q_y & r_y & s_y \\ 1 + p_x^2 + p_y^2 & 1 + q_x^2 + q_y^2 & 1 + r_x^2 + r_y^2 & 1 + s_x^2 + s_y^2 \end{vmatrix}$$



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Degenerate configurations handled explicitly.
Cospherical points



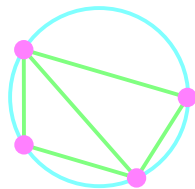
Delaunay triangulation
not uniquely defined

$$\begin{vmatrix} 1 & 1 & 1 & 1 \\ p_x & q_x & r_x & s_x \\ p_y & q_y & r_y & s_y \\ 1 + p_x^2 + p_y^2 & 1 + q_x^2 + q_y^2 & 1 + r_x^2 + r_y^2 & 1 + s_x^2 + s_y^2 \end{vmatrix} = 0$$

Unique definition?

Required: **consistent** choice of sign.

Degenerate configurations handled explicitly.
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Unique definition?

Required: **consistent** choice of sign.

Symbolic perturbation of the predicate

$$\begin{vmatrix} 1 & 1 & 1 & 1 \\ p_x & q_x & r_x & s_x \\ p_y & q_y & r_y & s_y \\ 1 + p_x^2 + p_y^2 + \varepsilon^i & 1 + q_x^2 + q_y^2 + \varepsilon^j & 1 + r_x^2 + r_y^2 + \varepsilon^k & 1 + s_x^2 + s_y^2 + \varepsilon^l \end{vmatrix} = P(\varepsilon)$$

coefficients =

orientation predicates of the non-perturbed points

Sign = sign of the first non-null coefficient.

Symbolic perturbation of the predicate

$$\begin{vmatrix} 1 & 1 & 1 & 1 \\ p_x & q_x & r_x & s_x \\ p_y & q_y & r_y & s_y \\ 1 + p_x^2 + p_y^2 + \varepsilon^i & 1 + q_x^2 + q_y^2 + \varepsilon^j & 1 + r_x^2 + r_y^2 + \varepsilon^k & 1 + s_x^2 + s_y^2 + \varepsilon^l \end{vmatrix} = P(\varepsilon)$$

coefficients =

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Sign = sign of the first non-null coefficient.

Delaunay triangulation uniquely defined
by indexing the points e.g. lexicographic ordering.

This perturbation

- Does not create any flat tetrahedron
- Easy to code
- Allows implementation of **vertex removal** in 3D
- Generalizes to **regular triangulations**

Devillers, T. SODA'03

Devillers, T. RR INRIA'07

Enforced decoupling between **geometry** and **combinatorics**

Kettner *CGAL Polyhedron*

```
Triangulation_3 < Traits_3, TrDataStructure_3 >
```

- `Triangulation_3`: point location...
- `TrDataStructure_3`: insertion...

T. *EuroCG'99*



3D Triangulation package

- Fully dynamic (insertion, removal)
- Robust
- Efficient ($\sim 30,000$ pts/sec)
- Generic
- Flexible
- Publicly available (QPL)
- Documented

T. CGAL 2.1 - 2.2, '00

Pion, T. CGAL 2.3 - 3.3, '01-'07

Participation of C.Delage, O.Devillers, A. Fabri,...

2D: Yvinec CGAL 0.9-... Pion, Yvinec



3D Triangulation package

Many users

- **CGAL packages (meshing, reconstruction)**

Rineau, Yvinec

- **academic users**

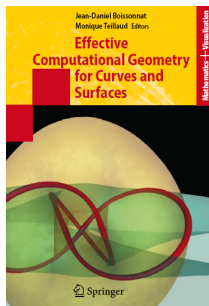
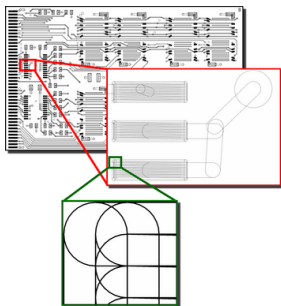
Dey, Giesen, Oudot, Chaine, Amenta, Levy, Bernauer, Robbins...

- **commercial users (through GeometryFactory)**

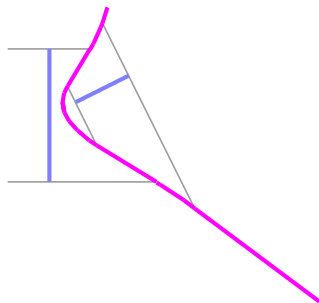
Midland Valley Exploration, Total, BSAP, British Telecom, France Telecom

Part II

Curved Objects

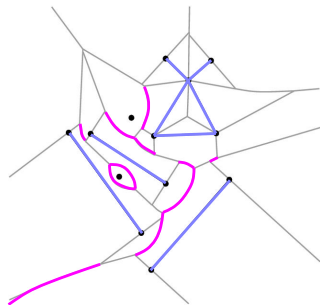


Curves already appear for linear input



Bisecting curve

Curves already appear for linear input



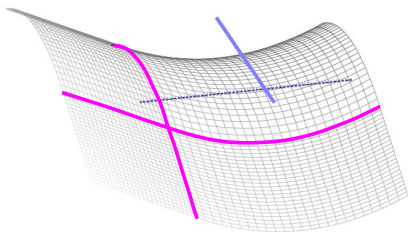
Karavelas, CGAL

Voronoi diagram

2D line segments

arcs of parabolas

Curves already appear for linear input



Voronoi diagram

3D line segments

patches of quadric surfaces

Mostly **linear** objects handled in

- computational geometry literature
- software, CGAL.

Start with **low degree** algebraic objects (circles, spheres)

Curved Objects

- mathematical background
- ● algorithmic and combinatorial study
and
 - robustness issues
- design choices
- representation of objects and structures
- efficient programming

Sweeping plane approach

Computes the so-called **vertical decomposition**

volumic approach

Comparisons of algebraic numbers of **degree 16**...

Mourrain, Técourt, T. CGTA '05

Complexity $O(n \log^2 n + V \log n)$, $V = O(n^3 \cdot 2^{\alpha(n)^{16}})$

Halperin et al

Chazelle, Edelsbrunner, Guibas, Sharir

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Halperin et al

Chazelle, Edelsbrunner, Guibas, Sharir

Case of **spheres**: algebraic numbers of **degree 4**

New decomposition: **degree 2** only

+ **Degenerate cases**

Russel, T. *in progress*

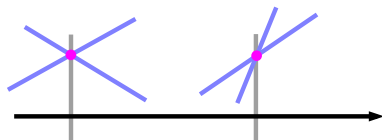
CGAL implementation

Russel *in progress*

uses CGAL 3D cellular data structure

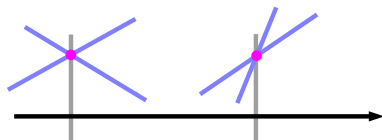
Bru, T. *in progress*

Comparing intersection points

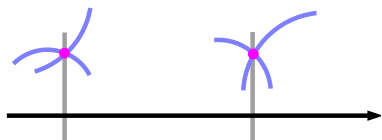


signs of
polynomial expressions

Comparing intersection points

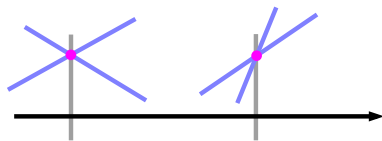


signs of
polynomial expressions

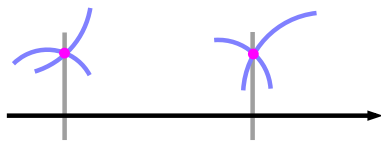


comparison of
algebraic numbers

Comparing intersection points



signs of
polynomial expressions



comparison of
algebraic numbers

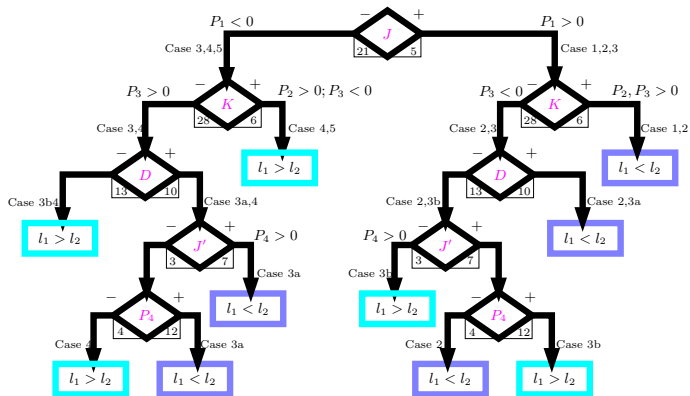
Algebraic tools \longrightarrow
signs of
polynomial expressions

Comparing algebraic numbers of degree 2

Measure of complexity

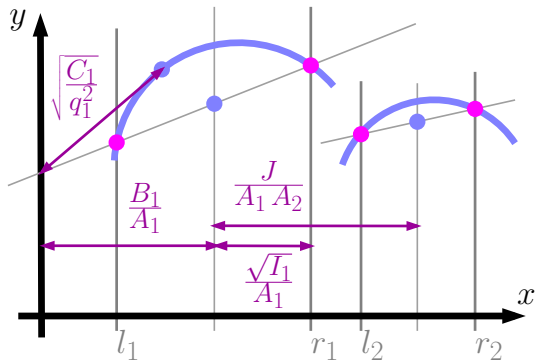
- degree of polynomials
- number of arithmetic operations

Comparing algebraic numbers of degree 2



Polynomial expressions **pre-computed** + arithmetic filtering

Polynomial expressions have an **intrinsic geometric meaning**



$K = 0 \iff l_1, r_1, l_2, r_2$ harmonic division

Enforced decoupling between **geometry** and **algebra**

```
Curved_kernel < LinearKernel, AlgebraicKernel >
```

“Kernel”: basic geometric objects and manipulations

allows to

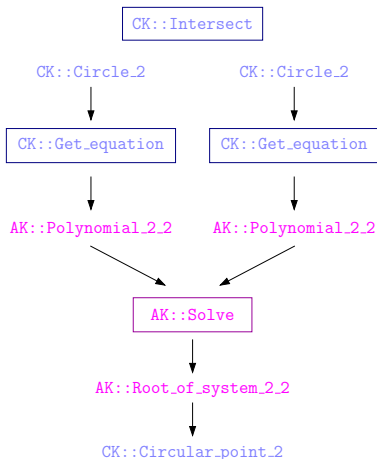
- interchange algebraic kernels
- compare different approaches

Definition of the AlgebraicKernel **C++ concept**

=

identification of **mathematical concepts** underlying the computations

Enforced decoupling between **geometry** and **algebra**



Careful definition
of the interface

Enforced decoupling between **geometry** and **algebra**

High-level interface for the algebraic kernel

- **Solve** polynomial system
- **Sign_at** of polynomial at the roots of a system
- ...

Emiris, Kakargias, Pion, Tsigaridas, T. *SoCG '04*

Full specifications, general degree:

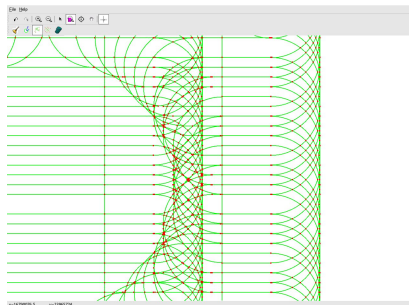
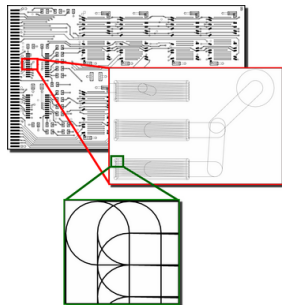
Berberich, Hemmer, Karavelas, T. *CGAL, submitted*

why not: **non-algebraic curves...?**

Circular arcs in 2D

Benchmarking on industrial VLSI data

with CGAL Arrangement_2 package



Circular arcs in 2D

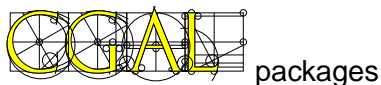
Benchmarking on industrial VLSI data

with CGAL `Arrangement_2` package

Efficiency improved:

- caching
- reference counting
- optimization of special cases (rational intersections)
- arithmetic filtering in algebraic numbers
- **representation of algebraic numbers**
to reduce length of multi-precision coefficients
- **geometric filtering**

de Castro, Pion, T. *EuroCG '07*



- 2D Circular Kernel Pion, T. *CGAL 3.2-3.3 '06-'07*
 - Research license Dassault Systèmes

- 3D Spherical Kernel de Castro, T. *CGAL, Submitted*
Extension in progress
de Castro, Cazals, Lorient, T. *RR INRIA'07*
 - Used by Russel, Lorient

Minimality of the set of predicates

necessary to run an algorithm or compute a structure

Degree

measure of precision

Minimality of the set of predicates

necessary to run an algorithm or compute a structure

- number of predicates
- complexity of predicates

Degree

measure of precision

Minimality of the set of predicates

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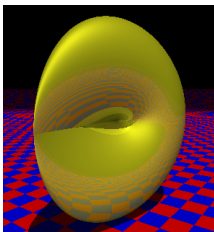
Degree

measure of precision

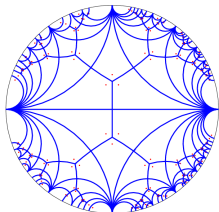
- of a given geometric predicate
- of an algorithm
- of a geometric problem

Part III

Future? More Triangulations!



©S. Popescu



©A. Burbanks

Future? More Triangulations!

Most of the computational geometry literature

in \mathbb{R}^d

Implementations

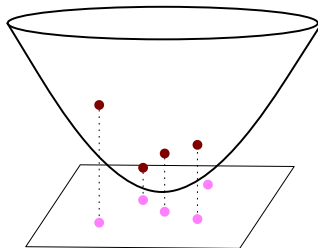
\mathbb{R}^2 or \mathbb{R}^3

Other geometries?

- hyperbolic
- projective
- periodic
- ...?

The space of spheres

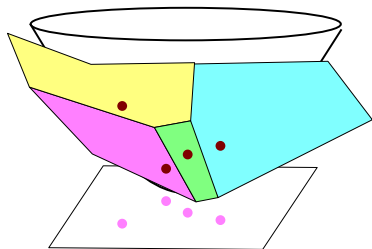
$$\begin{array}{ccc} \mathbb{R}^d & \longrightarrow & \mathbb{R}^{d+1} \\ S : (C, r) & \mapsto & s = (C, \|C\|^2 - r^2) \end{array}$$



Unified framework for the [mostly known] duality results:
various generalized **Voronoi diagrams** \longleftrightarrow **lower envelopes**

The space of spheres

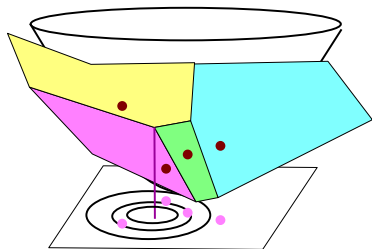
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Unified framework for the [mostly known] duality results:
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The space of spheres

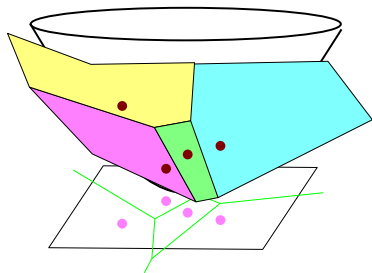
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Unified framework for the [mostly known] duality results:
various generalized Voronoi diagrams \longleftrightarrow lower envelopes

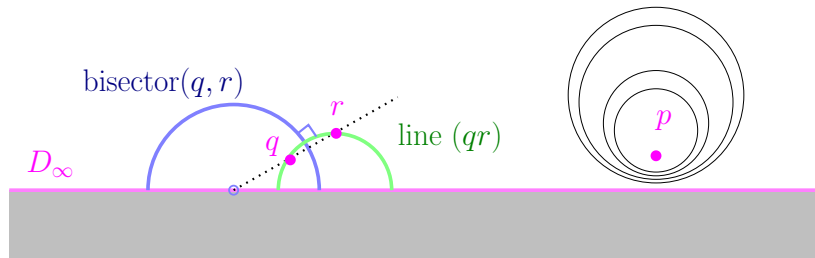
The space of spheres

$$\begin{aligned} \mathbb{R}^d &\longrightarrow \mathbb{R}^{d+1} \\ S : (C, r) &\mapsto s = (C, \|C\|^2 - r^2) \end{aligned}$$



Unified framework for the [mostly known] duality results:
various generalized Voronoi diagrams \longleftrightarrow lower envelopes

Poincaré model of the hyperbolic plane:



Hyperbolic line

=

Half Euclidean circle
orthogonal to D_∞

Hyperbolic circle centered at p

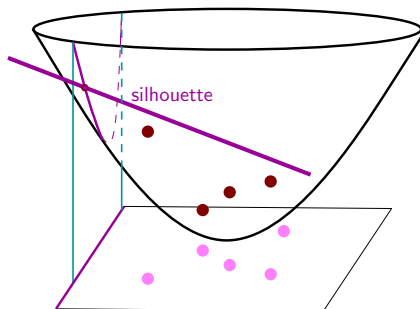
=

Euclidean circle of the pencil with
limit point p and radical axis D_∞

Future? More Triangulations!

Hyperbolic

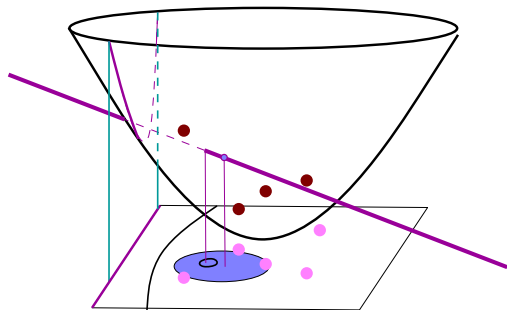
\mathbb{R}^d \longleftrightarrow \mathbb{R}^{d+1}
Pencil of circles with given radical axis \longleftrightarrow Line with given direction



Future? More Triangulations!

Hyperbolic

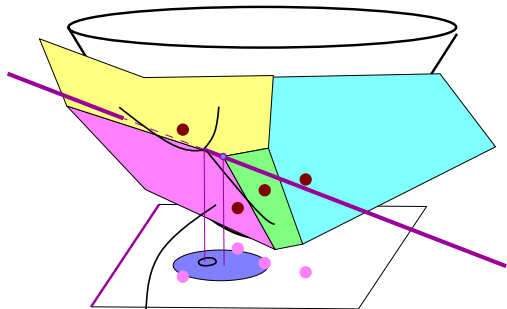
\mathbb{R}^d \longleftrightarrow \mathbb{R}^{d+1}
Pencil of circles with given radical axis \longleftrightarrow Line with given direction



Future? More Triangulations!

Hyperbolic

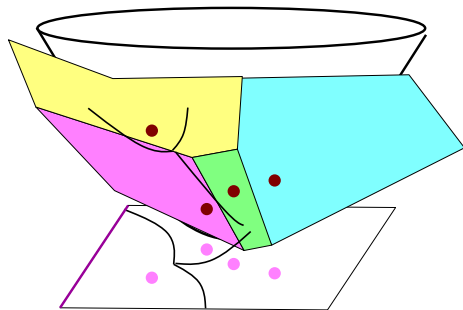
\mathbb{R}^d \longleftrightarrow \mathbb{R}^{d+1}
Pencil of circles Line
with given radical axis with given direction



Future? More Triangulations!

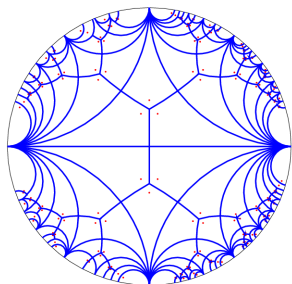
Hyperbolic

\mathbb{R}^d \longleftrightarrow \mathbb{R}^{d+1}
Pencil of circles with given radical axis \longleftrightarrow Line with given direction



Future? More Triangulations!

Hyperbolic



Berger '77 '87

Boissonnat, Cérézo, Devillers, T. CCCG'91 IJCGA'96

Devillers, Meiser, T. RR INRIA'92

Perspectives

CGAL implementation and arising issues

Applications (study of cristalline structures...?)

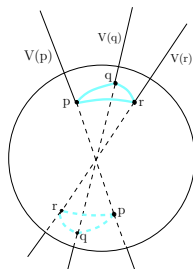
Triangulation of the projective plane
mostly studied from a **graph-theoretic** perspective.

In **computational** geometry:

- algorithms in \mathbb{R}^d based on **orientation** predicates
- **oriented** projective plane

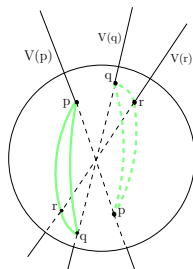
Stolfi

Projective plane **non-orientable**



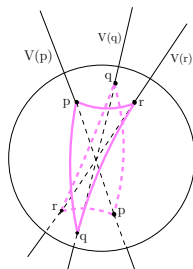
$$\mathbb{P}^2 = \mathbb{R}^3 - \{0\} / \sim$$
$$p \sim p' : p = \lambda p', \lambda \in \mathbb{R}^*$$

Projective plane **non-orientable**



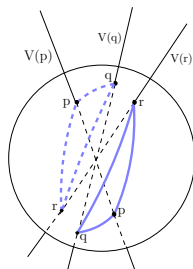
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Projective plane **non-orientable**



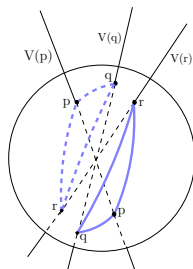
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Projective plane **non-orientable**



$$\mathbb{P}^2 = \mathbb{R}^3 - \{0\} / \sim$$
$$p \sim p' : p = \lambda p', \lambda \in \mathbb{R}^*$$

Projective plane **non-orientable**



Still:
interior of a closed curve well defined.

Incremental algorithm

Aanjaneya, T. *RR INRIA'07*

Perspectives

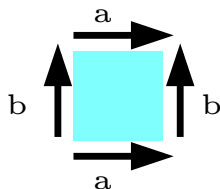
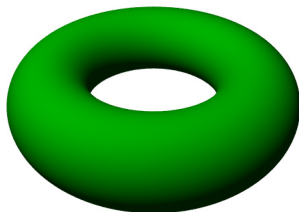
Definition of a Delaunay-like triangulation

Generalization to 3D (dD)

CGAL implementation

Periodic triangulations (2D and 3D) widely used for simulations

Parameter space : torus



2D:

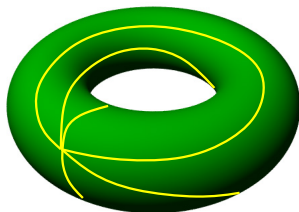
Future? More Triangulations!

Periodic

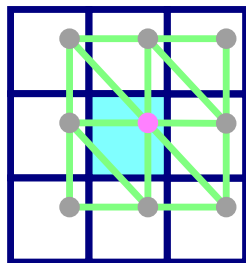
Periodic triangulations (2D and 3D) widely used for simulations

Parameter space : torus

Few points: the “triangulation” is **not a simplicial complex**.



2D:



Method

- Compute first in a 3-sheeted covering (27 copies in 3D),
- Switch to the 1-sheeted covering as soon as simplicial complex.

Implementation

- Redesign the CGAL triangulation package, Allow one more level of genericity.

Triangulation_3

```
< Traits_3, TrDataStructure_3, Space >
```

Kruithof, T.

Caroli, T. *in progress*

Perspectives

Other periodic spaces (cylinders)

Meshes in periodic spaces...

Conclusion

Implementing mathematical structures has

- a good future,
- many applications.

Par ce texte élémentaire, l'auteur espère faire partager sa joie de la découverte d'une théorie mathématique dont la beauté l'émeut, la richesse le ravit, la profondeur l'impressionne, et le pouvoir de description de l'univers le déconcerte.

André Cérézo '91